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# Linking Spatial and temporal dynamic of bacterioplankton communities with ecological strategies across a coastal frontal area

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## 33 Abstract

34 Ocean frontal systems are widespread hydrological features defining the transition zone between 35 distinct water masses. They are generally of high biological importance as they are often associated 36 with locally enhanced primary production by phytoplankton. However, the composition of bacterial 37 communities in the frontal zone remains poorly understood. In this study, we investigate how a coastal tidal front in Brittany (France) structures the free-living bacterioplankton communities in a spatio-38 39 temporal survey across four cruises, five stations and three depths. We used 16S rRNA gene surveys to compare bacterial community structures across 134 seawater samples and defined groups of co-40 varying taxa (modules) exhibiting coherent ecological patterns across space and time. We found that 41 bacterial communities composition was strongly associated with the biogeochemical characteristics of 42 the different water masses and that the front act as an ecological boundary for free-living bacteria. 43 44 Seasonal variations in primary producers and their distribution in the water column appeared as the 45 most salient parameters controlling heterotrophic bacteria which dominated the free-living community. 46 Different dynamics of modules observed in this environment were strongly consistent with a 47 partitioning of heterotrophic bacterioplankton in oligotroph and copiotroph ecological strategies. Oligotroph taxa, dominated by SAR11 Clade members, were relatively more abundant in low 48 49 phytoplankton, high inorganic nutrients water masses, while copiotrophs and particularly opportunist taxa such as Tenacibaculum sp or Pseudoalteromonas sp reached their highest abundances during the 50 51 more productive period. Overall, this study shows a remarkable coupling between bacterioplankton 52 communities dynamics, trophic strategies, and seasonal cycles in a complex coastal environment.

#### 54 1 Introduction

55 Bacteria dominate the marine environment in abundance, diversity and activity where they 56 support critical roles in the functioning of marine ecosystems and oceanic biogeochemical cycles (Falkowski et al., Fenchel, and Delong 2008; Cotner and Biddanda 2002; Madsen 2011). In the coastal 57 58 environment, they are closely associated with other planktonic organisms (e.g. viruses, phytoplankton 59 and zooplankton) during the recycling of organic matter and inorganic nutrients through the so-called 60 microbial loop (Azam and Malfatti 2007; Pomeroy et al. 2007). They form complex and highly dynamic assemblage (S. J. Giovannoni and Vergin 2012), with bacterioplankton diversity variations in 61 62 space and time linked to changes in functional diversity (Galand et al. 2018). Therefore, understanding 63 how the bacterioplankton composition varies in the environment remains one of the central question 64 to elucidate so that we can better understand coastal ecosystem functioning (Fuhrman et al. 2015).

65 Phytoplankton development represents a major source of organic matter for heterotrophic bacteria in the water column. During their growth and upon bloom termination, algae release a complex 66 67 bulk of dissolved organic matter that is almost only available for bacteria (Azam 1998; Fenchel and 68 Jørgensen 1977). This organic matter processing requires diverse heterotrophic bacterioplankton 69 among which one could find members of Bacteriodetes (Flavobacteriacae), Roseobacter group, Gammaproteobacteria and Verrucomicrobia (Buchan et al. 2014). These taxa contribute to the 70 71 complexity of the marine ecosystem via different adaptive strategies, owing to the unequal access to 72 their respective resource (Stocker 2012; Luo and Moran 2014). For instance, heterotrophs are generally 73 distinguished as either oligotrophs or copiotrophs that compete at low and high nutrient concentrations 74 respectively (Koch 2001; Giovannoni et al. 2014). They also present different degrees of ecological specialization, with generalist bacteria able to assimilate a broad variety of substrates, while specialists 75 76 will compete for a narrow range of nutrients (Mou et al. 2008). Analysis of these ecological traits offer 77 a simplified view of complex microbial communities and has gained interest for better understanding 78 the dynamics of natural microbial communities and to gain insight into their role in the ecosystem 79 (Krause et al. 2014; J. Raes et al. 2011; Haggerty and Dinsdale 2017).

80 Marine fronts are common mesoscale features in the ocean and are located at the transition 81 between water masses of different physicochemical characteristics that actively shape the distribution 82 of microbial organisms (phytoplankton, zooplankton and bacteria). Driven by currents and mixing, 83 local nutrient input in the vicinity of the front generally enhances primary and secondary production, 84 making the frontal zone an area of high biological importance (Olson and Backus 1985) and of critical 85 influence on the microbial processing of organic matter (Baltar et al. 2015; Heinänen et al. 1995). 86 However, the bacterial communities' composition involved in such dynamic systems remains to be 87 investigated (Baltar et al. 2016).

88 The Ushant Front in the Iroise Sea (Brittany, France) is considered as a model for coastal tidal 89 front (Le Fèvre 1986). Its position and characteristics are highly dynamic and influenced by 90 atmospheric forcing and tidal currents which are strong in this area (Le et al. 2009). It occurs from May 91 to October and leads to contrasting physicochemical environments with higher phytoplankton biomass 92 at the frontal area (Le Fèvre et al. 1983). West of the front, stratification results in warmer oligotrophic 93 surface waters and colder nutrient-rich deeper waters separated by a marked thermocline. East of the 94 front, associated with highly variable conditions, permanently mixed coastal waters are characterized 95 by an unlimited quantity of inorganic nutrients but with highly fluctuating conditions. These

96 contrasting water masses structure the distribution of primary producers with the dominance of small

97 phytoplankton and dinoflagellates in surface stratified waters and diatoms in mixed waters (Birrien et

98 al. 1991; GREPMA 1988; Videau 1987).

99 In this study, we investigated how such contrasting physicochemical and biological parameters will

100 drive free-living bacterioplankon community structure. We then tested the hypothesis that the

- 101 contrasted distribution of primary producers will select for bacteria with different adaptative strategies.
- 102 To do so, using a network analysis we defined groups of co-varying bacterial OTUs that present the
- 103 same dynamic across the samples, postulating that they may share the same ecological niches.
- 104

## 105 Materials and Methods

- 106
- 107 1. Study site and sampling design
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109 For this study, we completed four east-west transects of about 60 km across the Iroise sea in September 110 2014 (the 9th, 10th and 11th), March 2015 (the 10th, 11th and 12th), July 2015 (the 1st, 2nd and 3rd) and September 2015 (the 8th, 9th and 10th) aboard the R/V Albert Lucas. Station positions remained 111 identical across cruises and were designed to span the front (Fig. 1A). Station 5 ( $48^{\circ}25 N$ ,  $5^{\circ}30 W$ ) is 112 the most offshore station and is characterized by a strong stratification in summer. Station 4 ( $48^{\circ}25 N$ , 113 114  $5^{\circ}20 \text{ W}$ ) and Station 3 (48°20 N, 5°10 W) are closer the front. Station 2 (48°15 N, 5°00 W) is present 115 in the mixed area and Station 1 ( $48^{\circ}16 N$ ,  $4^{\circ}45 W$ ) is the most coastal station, near the outflow of the Bay of Brest. At each station, we obtained CTD profiles to assess the physical characteristics of the 116 water column and establish the depth designed to capture the important biological and chemical 117 118 features of the water column at the surface, bottom and Deep Chlorophyll Maximum (DCM).

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121 2. Nutrients, phytoplankton counts and pigment analyses

123 Seawater was sampled at each depth for nutrients, biogenic silica (BSi), chlorophyll a (Chl a), 124 particulate organic carbon and nitrogen (POC/PON) concentrations, and microscopic phytoplankton 125 cell counts and identification. Dissolved inorganic phosphate (DIP) and silicate (DSi) concentrations 126 were determined from seawater filtered on Nucleopore membrane filters (47 mm) and dissolved 127 inorganic nitrogen (DIN) on Whatman GF/F filters (25 mm). Filters for DIN and DIP were then frozen, whereas filters for DSi were kept at 4 °C in the dark. Concentrations were later determined in the 128 129 laboratory by colorimetric methods using segmented flow analysis (Auto-analyser AA3HR Seal-130 Analytical) (Aminot and Kérouel 2007). BSi was determined from particulate matter collected by 131 filtration of 1 L of seawater through 0.6 µm polycarbonate membrane filter. The analysis was 132 performed using the alkaline digestion method (Ragueneau and Tréguer 1994). Total Chl a and phaeopigments (Pheo) were determined in particulate organic matter collected on 25 mm Whatman 133 GF/F filters. The filters were frozen (-20°C) and analyzed later by a fluorometric acidification 134

procedure in 90% acetone extracts (Holm-Hansen et al. 1965). Particulate material for POC/PON measurements was recovered on pre-combusted (450 °C, 4 h) Whatman GF/F filters. Samples were then analyzed by combustion method (Strickland and Parsons 1972), using a CHN elemental analyzer (Thermo Fischer Flash EA 1112). Phytoplankton samples were fixed with Lugol's solution and cell

139 counts were carried out using the Lund et al. (1958) method (Lund et al. 1958).

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- 142 3. Bacterioplankton community sampling
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144 Seawater for bacterial diversity analysis was collected at different depths using Niskin bottles and 145 directly poured in 5 L sterile carboys previously rinsed three times with the sample. For each depth, 146 three biological replicates samplings were done, consisting of three different Niskin deployments, except Station 4 in September 2014. Filtrations started in the on-shore laboratory 3 to 4 hours after 147 sampling. Water samples were size-fractionated using three in-line filters of different porosity: 10 µm, 148 149 3 µm (PC membrane filters, Millipore®) and 0.22 µm (Sterivex® filters, with PES membrane). In this 150 study, we focused only on the 0.22-3 µm free-living fraction. All filters were frozen in liquid nitrogen 151 before storage at -80 °C. In total, 2 to 5 liters of seawater were filtered each time, depending on filter 152 saturation.

153 154

# 155 4. DNA extraction and sequencing

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157 Half-filters were directly placed in Matrix B $\mbox{\ensuremath{\mathbb{R}}}$  tubes (filled with 0.1 mm silicate beads, MP 158 Biomedicals) with lysis buffer (Tris pH 7.0, EDTA pH 8.0 and NaCl), SDS 10% and Sarkosyl 10% 159 and subjected to physical lysis for 5 minutes on a vortex plate. The liquid fraction was then collected 160 in order to perform a phenol-chloroform extraction using PCI (Phenol, Cholorophorm Isoamyl alcohol 161 with a ratio of 25:24:1) and a precipitation step with isopropanol and 5 M sodium acetate. DNA was 162 resuspended in 100  $\mu$ L of sterile water.

163 Bacterial diversity was assessed by targeting the v4-v5 hypervariable regions of 16S rDNA with the 164 primers 518F (CCAGCAGCYGCGGTAAN) 926R (CCGTCAATTCNTTTRAGT-/ CCGTCAATTTCTTTGAGT - CCGTCTATTCCTTTGANT) (Nelson et al. 2014). PCR products 165 166 were purified using Ampure XP® kit and DNA quantity was measured using Picogreen® staining and a plate fluorescence reader (TECAN® infinite M200 Pro). Each sample was diluted to the same 167 168 concentration and pooled before sequencing on an Illumina MiSeq sequencer at the Marine Biological Laboratory (Woods Hole MA, USA). 169

- 170 171
- 172 5. Bioinformatics analysis
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We obtained 22,523,398 raw reads, with a range from 31,583 to 2,001,687 reads per sample. Reads were merged and quality-filtered according to recommendations in Minoche et al. (Minoche et al.,

- 176 2011) using the Illumina-utils scripts (Eren et al. 2013). Those steps removed 17 % of all the sequences.
- 177 We used the Swarm algorithm (Mahé et al. 2014) to cluster the 18,876,655 remaining sequences into
- 178 1,611,447 operational taxonomic unit OTUs. Chimera detection was done using vsearch de novo

179 (Rognes et al. 2016) resulting in 281,825 filtered OTUs. Taxonomic annotation for each OTU was

done with the SILVA database v123 (Quast et al. 2012) using the mothur classify.seqs command
(Schloss et al. 2009). 19,516 OTUs (1,247,339 sequences) were affiliated with non-bacterial taxa (e.g.)

archaea, chloroplasts, mitochondria, eukaryota) and removed from the dataset. As a result, we obtained

- 183 262,308 OTUs for 134 samples, with a large number of singletons (205,292 OTUs), that were kept
- 184 along the statistical analysis.
- 185
- 186187 6. Statistical analysis
- 188

189 Libraries were normalized for read number using DESeq package in R (Anders and Huber 2010). A 190 visualization of the bacterial community structure similarity was assessed with an NMDS based on 191 Bray-Curtis dissimilarities using vegan R package (Oksanen et al. 2007). Influence of depth, station 192 and sampling time on bacterial communities was investigated using a permutational multivariate 193 analysis of variance (PERMANOVA) based on Bray-Curtis dissimilarities and 999 permutations. We 194 used principal coordinate analysis (PCA) ordination to characterize water samples environmental 195 parameters. Finally, we examined the presence of biomarker OTUs (i.e. OTUs with a significant higher 196 relative abundance in a given condition) of the different stations within each cruise using the LEfSe 197 software (Segata et al. 2011).

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199 7. Network analysis

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201 Network analysis was done based on a truncated matrix only containing the most abundant OTUs with 202 more than 50 sequences in at least three samples. The filtered matrix contained 681 OTUs that 203 accounted for 79% of all the sequences. This filtering step was necessary to avoid false positive 204 correlations in the network analysis. Our module detection analysis followed part of the pipeline of 205 Chafee et al. (Chafee et al. 2018). First, the application of SPIEC-EASI computes pairwise co-variance 206 based correlation between OTUs in order to address the sparsity and composition issues inherent to 207 microbial abundance data (Kurtz et al. 2015). The possible interaction was then inferred using the glasso probabilistic inference model with a lambda.min.ratio of 0.01. Based on this model, only the 208 209 significant covariance values were extracted and transformed into a correlation matrix using the 210 cov2cor() function.

- We then delineated network modules as groups of highly interconnected OTUs that presented very close variations in relative abundances across the studied samples. Those modules were defined using
- the Louvain algorithm (Blondel et al. 2008). We used Gephi (Bastian et al. 2009) and Force Atlas 2
- 214 layout algorithm to generate a vizualization of the main correlations (>0.3). Module eigengenes (ME, 215 the first principal component, considered a representative of the OTUs distribution of a given module)
- were calculated based on the relative abundance matrix using WGCNA function moduleEigengenes()
- 217 (Langfelder and Horvath 2008). Those ME were used to calculate Pearson correlations between the

- 218 different modules and the environmental variables, using the WGCNA commands moduleTraitCor(),
- 219 moduleTraitPvalue().
- 220 We used the methods proposed by Newton et al. to infer the trophic strategy of OTUs within each

221 modules (Newton and Shade 2016). In that study, they differentiated opportunist taxa with high 222 abundance variability in space and time, and marathoners with low abundance variability. They

- distinguished these using the Coefficient of Variation (CV) of OTU dynamic combined with their
- abundance and prevalence in the samples. Based on their method, we defined high CV opportunist
- 225 OTUs (or HCV) as OTUs above 5% upper boundary of the linear modeling 95% confidence interval
- 226 in a CV plot against OTU occurrence. Conversely, we defined low CV marathoners OTUs (or LCV)
- as OTUs below the 5% lower boundary of the linear modeling. In our analysis, OTU occurrence was
- 228 defined by a relative abundance > 0.05%.
- 229
- All the scripts used for this analysis are available at: https://loimai.github.io/BBobs/
- 231

## 232 **Results**

## 233 1. Environmental settings

234 This study was carried out between September 2014 and September 2015 in the Iroise Sea, off 235 Brittany (Northeast Atlantic), in the vicinity of the Ushant island. The Ushant front position and 236 characteristics were estimated using Satellite Surface Temperature (SST) maps (Fig. 1) and CTD data 237 collected at the dates of sampling (suppl. data 1). The March 2015 sampling took place before the onset 238 of the Ushant front and presented a homogeneous temperature around 10 °C across all the stations. 239 High nutrient concentrations at all stations (Si(OH)<sub>4</sub>: 1.82 to 4.38 µM, nitrates: 5.88 to 12.13 µM, 240 suppl. data 2), low surface Chl a (<1 µg.L-1 except for Station 1, suppl. data 3) and overall low 241 phytoplankton cells counts observed during this cruise (suppl. data 2) indicated that sampling occurred 242 prior to the development of the phytoplankton spring blooms. In summer (September 2014, July 2015 243 and September 2015), SST maps showed a sharp transition between coastal and offshore temperatures 244 confirming the presence of a frontal system. The different observed stratification regimes (suppl. data 245 1) coincided with distinct physicochemical patterns and phytoplanktonic patterns across seasons (Fig. 246 1B, suppl. data 2). In late summer (September samples), offshore deep waters shared close 247 characteristics with winter waters (March sample, Temperature: 11.7 to 12.3 °C), with few 248 phytoplankton cells, similar concentration of Si(OH)<sub>4</sub> (1.61 to 3  $\mu$ M) and nitrates (3.99 to 6.41  $\mu$ M). 249 Conversely, surface waters presented high temperatures (14.7 to 18.2 °C), a nutrient depletion 250 (Si(OH)<sub>4</sub>: 0.02 to 1.65 µM, N0<sub>2</sub>+N0<sub>3</sub>: 0.00 to 0.09 µM) and high phytoplankton cell counts. In early summer (July), inorganic nutrient concentrations were overall lower than in September, probably 251 consumed by the spring bloom coinciding with the onset of the front around May-June. A significant 252 253 bloom occurred at stations 2 and 3, on the 27th of June, five days before the sampling period as seen 254 in the satellite surface Chl a observations (suppl. Data 3 B.).

#### 256 2. Bacterial community dynamics in the Iroise Sea

In the Iroise Sea, free-living bacterial communities structure presented clear time and spatial patterns as shown in the NMDS ordination plot (Fig. 1C, for each cruise separately see suppl. Data 4). Firstly, community structure displayed strong seasonality, with sample primarily grouping by sampling cruises. We also observed similar communities in stratified waters of September 2014 and 2015 samples (Fig. 1C), suggesting that these seasonal pattern were recurring.

262 Besides, we also observed an important spatial influence, as within each sampling cruise, communities were markedly different between stations. In winter samples, communities were highly 263 264 similar throughout the water column (Depth was non-significant, Permanova Pr(>f) =0.225), but presented a coastal to offshore gradient (Station was significant, Permanova Pr(>f) =0.001, suppl. Data 265 266 4) that followed a gradient of salinity, temperature and inorganic nutrient (sup. data 2). Conversely, in September, when the front was the strongest, free-living bacterial communities were much more 267 268 heterogeneous with clear patterns associated to the set-up of the front : stratification resulted in highly 269 diverging communities with depth (Depth Pr(>f) = 0.004), while this pattern was not seen for the mixed 270 and coastal samples (Depth was not significant, Pr(>f) = 0.222 and 0.434, suppl. Data 4). In July, the 271 patterns were mostly associated with depth for all the stations, except station 1 (suppl. Data 4).

Overall, bacterial communities structure followed the different water masses, mirroring environmental physicochemical variations represented in the PCA plot of environmental variables (Fig. 1B): deep water communities in the summer crews remained more similar to winter communities (Fig. 1C). In contrast, surface bacterial communities in stratified regimes and in most of the stations in July departed from this typical winter structure. In addition, for these summer cruises, the DCM samples either cluster with surface or deep samples. This could be explained by the difficulty to sample the DCM precisely, as its depth can vary between the CTD measurements and the biological sampling.

Using the LefSe algorithm (Segata et al. 2011), we found that some stations displayed specific biomarker OTUs within each sampling time (suppl. Data 5). Biomarkers such as OTU1 (*Amylibacter*) and OTU4 (*Planktomarina*) were found at the most near-shore station (Station 1) in September 2014 and March 2015 and other biomarkers were found in surface stratified waters in early summer (OTU29 *NS4 marine group*) and late summer (OTU10 *Synechococcus*) cruises, but no biomarker was identified for the mixed and frontal stations except in July 2015 at Station 2 with OTU35 (*Aliivibrio*) and OTU74 (*Pseudoalteromonas*).

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## 287 8. Description of modules

288 We further investigated groups of co-varying OTUs that could potentially share the same 289 ecological niches in this partitioned marine environment via a co-occurrence network analysis. In the 290 inferred network, we were able to identify 14 sub-networks (Fig. 2A and 2B) defining groups of OTUs 291 (termed modules) with similar distribution patterns across the entire study. Two modules (5 and 4) 292 were dominant in our dataset and respectively accounted for 32.7% and 20.9% of all sequences. Eight 293 modules represented between 1.6% and 14.2%, and four were rarer with less than 1% abundance. The 294 OTU taxonomy in each module is summarized in suppl. Data 6 and Fig. 4 presents the distribution of 295 the dominant families among each module.

296 Since its eigengene could characterize each module, we investigated to which extent module 297 distribution could be correlated (i.e. Pearson correlation) with environmental parameters (Fig. 2C). 298 Correlation patterns partitioned modules into three significant sub-networks. The first one mostly 299 comprises modules 5 and 13 representing 32.7 and 6.8% of the dataset respectively that correlated 300 positively to inorganic nutrient concentrations and negatively to temperature and Particulate Organic 301 Matter (POC, PON) values. Their relative abundance in the different samples showed that they were dominant in oligotrophic waters: together they ranged from 39% at Station 1 to 72% at Station 5 of the 302 303 late winter communities, and 54% to 59% of the deep stratified waters in September (Fig. 3). SAR11 304 Surface 1 (46.7% of the module sequences), ZD0405 marine group (12%) and SAR86 Clade (6.4%) dominate the main module (module 5). Module 13 showed a different diversity as being dominated by 305 306 members of Marinimicrobia (15.8%), SAR11 Deep 1 (12%), SAR11 Surface 1 (8.9%) and 307 Salinisphaeraceae (7.9%).

308 Modules 4, 8, 2 and 1 contributed to the second sub-network, representing 20.9, 14.2, 5.5 and 309 5.4% of the dataset respectively. They presented clear inverse correlations compared with modules of 310 the first group: they correlated positively with temperature, POM and Diatoms but negatively with 311 inorganic nutrient concentrations. In relative abundance, they dominated the samples of July and in the 312 surface and coastal stations. Their taxonomy was distinct from the first group; i.e. together they 313 gathered the majority of *Flavobacteriaceae* (70%) and *Rhodobacteraceae* (88%). Also, module 9 was 314 enhanced in July 2015 but was almost exclusively present in Station 2 and strongly correlated with 315 ammonium (0.72, p < 0001). Its taxonomy was also particular as dominated by *Vibrionaceae (58%)* 316 and Pseudoalteromonadaceae (30%).

The third sub-network (modules 6 and 3) was less abundant and presented different correlations with environmental parameters. They respectively account for 1.6 and 2.6% of the dataset, were correlated with specific phytoplankton groups (dinoflagellates, nanophytoplankton) and were dominant in the surface and DCM of stratified waters in September where they made up to 34% of the community. Among them, module 3 was constituted almost exclusively of Cyanobacteria (94%) affiliated with the *Synechococcus* genus.

To examine whether the modules gather OTUs that exhibited different ecological behavior (i.e. marathoners or opportunist), we computed the coefficient of variation (CV) for all OTU used in the network analysis and plotted this metric against OTU occurrence as proposed in Newton et al. (Newton and Shade 2016). We then examined their module membership (suppl. Data 7 and Fig. 4B): modules showed a clear gradient ranging from relatively low CV (LCV) OTUs (modules 4, 11, 14, 5 and 13) to high CV (HCV) OTUs (modules 9, 10, 7 and 2).

#### 330 Discussion

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The spatial and temporal dynamics of bacterial communities associated with a coastal tidal front

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334 In this study, we investigated the spatiotemporal variations of free-living bacterial community 335 composition over one year across contrasting coastal water masses characterized by a seasonal tidal 336 front structure. For each cruise (season) we observed a spatial influence on bacterioplankton 337 community composition. However, in the studied area, winter communities were comparatively much 338 more homogeneous with only an influence from coast to the offshore. At this time of the year, the river 339 debit were at the highest and this is known to influence free-living bacterial communities in coastal 340 area (Tréguer et al. 2014; Pizzetti et al. 2016). In summer, bacterial communities diverged according 341 to the station and depth, highlighting the importance of the onset of a tidal front and open ocean stratification for bacterioplankton community structure. This was mainly due to the sharp divergence 342 of summer surface samples, as deep summer samples remained closer to winter ones (Fig. 1C). The 343 344 existence of two contrasting types of bacterioplankton dynamics (winter and deep vs. summer surfaces) 345 reflects similar patterns in sample ordination based on biogeochemical parameters and can be 346 associated to phytoplankton development, temperature increase or lowering in inorganic nutrient 347 concentrations, which are key parameters influencing bacterial communities dynamic in marine coastal 348 environment (Fuhrman et al. 2015; Giovannoni and Vergin 2012).

349 These observations of a frontal zone as a sharp ecological transition for bacterioplankton 350 among different water masses are consistent with reports in stratified waters (Cram et al. 2015; 351 Ghiglione et al. 2008) and from other frontal areas (Baltar et al. 2016) confirming their role as 352 ecological boundaries in the oceans (Raes et al. 2018). Interestingly, the frontal area itself around 353 station 3-4 did not exhibit a specific bacterial composition (Fig. 2C and Fig 4), but could rather result 354 from mixing between adjacent communities, as already suggested for the phytoplankton and 355 zooplankton (Sournia 1994) and in another marine boundaries such as a shelf break (Zorz et al. 2019). 356 We could not identify any biomarker OTUs associated with frontal stations. Hence, bacterioplankton 357 communities associated with enhanced productivity at the Ushant front (Videau 1987) could result 358 from an increase in resident plankton density (Franks 1992) rather than the emergence of distinct 359 communities.

In addition, we observed a remarkable seasonal recurrence between the two September cruises, within each station and depth. This pattern was comparatively more accentuated toward the open ocean (station 4 and 5) than near shore (stations 1 to 3). This temporal dynamic is coherent with previous reports of seasonal patterns in single stations as shown in the North Sea (Chafee et al. 2018) or the English Channel (Gilbert et al. 2012) time series. Our results suggest that despite a substantial heterogeneity in our system, such seasonal recurrence patterns also extend to stations along geographical and bathyal gradients.

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Distinct bacterioplankton trophic strategies associated with tidal front temporal and spatial dynamics
 Using network analysis on samples exhibiting strong temporal and spatial variations, we could
 define modules of ecologically coherent OTUs. As suggested elsewhere, such modules can be

considered as OTUs potentially sharing the same environmental niches with coherent ecological
 strategies (Eiler et al. 2012). In association with previously characterized dominant taxa in each
 module, we aim at identifying higher order bacterioplankton community organization and revealing
 ecological drivers of community dynamics in the frontal zone.

376 Our study gives evidence of module partitioning into two major heterotrophs-dominated sub-377 networks, exhibiting distinct inverse covariance patterns (Fig. 2A and 2B). Their correlations with 378 environmental variables also clearly separated conditions between water masses with active primary 379 producers (low nutrients and high POM values) that were present in summer surface samples, and 380 conditions with overall low development of phytoplankton typical of winter and deep samples. 381 Development and decay of phytoplankton lead to the release of dissolved organic matter, which is 382 almost only available for heterotrophic bacteria (Azam and Malfatti 2007). Thus, these two different 383 conditions likely selected for copiotrophic or oligotrophic heterotrophic free-living bacteria adapted to 384 different concentrations of organic matter in the environment (Giovannoni et al. 2014 . The taxonomic 385 affiliation was highly coherent with these observations. Modules 5 and 13 are dominated by SAR11 386 clades, which typically thrive in basal concentrations of organic matter (Morris et al. 2002) or members 387 of taxa typical of the sub-euphotic zones such as Marinimicrobia, or SAR11 Deep 1 (Agogué et al. 388 2011). Conversely, modules 4, 8, 2, 1 and 9 were dominated by members of the Rhodobacteraceae and 389 Flavobacteriaceae, typically associated with phytoplankton-derived organic matter (Buchan et al. 390 2014; Teeling et al. 2012). Thus, the availability of phytoplankton-derived organic matter will drive 391 heterotroph dynamics.

The last sub-network with module 3, dominated by *Synechococcus*, highlights the contribution of phototrophic bacteria. These cyanobacteria became strongly dominant in the surface of well stratified-waters in late summer, which is already known to favor these small phytoplanktonic cells (Taylor and Joint 1990; Cadier et al. 2017).

Interestingly, known chemoautotrophs involved in the nitrification such as *Nitrospinaea* did not form a separate module and were included in the oligotrophic module 13. Nitrification in the water column is typically found in the sub-euphotic zone as nitrite-oxidizing bacteria could be light-sensitive (Lomas and Lipschultz 2006) and can be outcompeted by phytoplankton for the uptake of nitrite (Smith et al. 2014; Wan et al. 2018). This fact could explain why they exhibit a dynamic similar to oligotrophic bacteria.

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# 403404 Differential bacterioplankton responses to organic matter availability

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406 Using the OTU coefficients of variation to distinguish rather marathoners or opportunist taxa, 407 we examined whether heterotrophic bacteria had different responses to organic matter availability in 408 summer samples. Their dynamic and composition was highly coherent with a partitioning of the 409 microbial loop between different taxa (Bryson et al. 2017). For instance, several modules presented a 410 majority of HCV OTUs (Fig. 4B): Tenacibaculum sp. (a Flavobacteriaceae dominating Module 2) was highly abundant reaching up to 20.7% of the sequences in the 2015 July surface waters shortly after 411 significant phytoplankton bloom. One single Tenacibaculum OTU dominated the surface of 4 stations 412 413 over a 40km distance just a few days after a phytoplankton bloom. This dynamic of Tenacibaculum

414 genus is coherent with previous observations of a recurrent population increase after seasonal 415 phytoplankton blooms in coastal water (Teeling et al. 2016) while being part of the rare biosphere otherwise (Alonso-Sáez, Díaz-Pérez, and Morán 2015). During the same period, module 9, dominated 416 417 by Vibrionales (Aliivibrio sp) and Alteromonadales (Pseudoalteromonas sp.) class, was especially 418 abundant at Station 2, reaching up to 27% of the sequences (Fig. 3). These taxa are known copiotroph 419 bacteria that can sharply increase in abundance in response to high substrate loading (Tada et al. 2012). These results strongly support an opportunist lifestyle of bacteria in modules 2 and 9. When they are 420 421 dominant, bacteria with such an opportunist strategy have a critical role as they can contribute to a

422 substantial fraction of organic matter recycling (Pedler et al. 2014).

423 In contrast, module 4 was mostly composed of LCV OTUs with a cosmopolitan distribution across time, depth and geography. The dominant family in module 4, the Rhodobacteraceae, are known 424 as generalist bacteria with a versatile substrate utilization (Moran et al. 2004; R. J. Newton et al. 2010). 425 426 Some of the free-living Rhodobacteraceae grow on low molecular weight organic compounds and 427 numerous studies pointed out that they compete for the same substrate as SAR11 Clade, but are more 428 competitive at higher organic matter concentrations. They can be very successful in coastal waters, an 429 example being a representative of the genus *Planktomarina* that is dominant in the North Sea (Voget 430 et al. 2015). Other dominant taxa of this module, such as SAR86 Clade, Methylophilaceae or members 431 of SAR116 Clade are widespread in marine environments and are also known to target small organic 432 molecules (Dupont et al. 2012; Huggett et al. 2012; Oh et al. 2010).

Module 8 presented mixed CV values among its OTUs. Many members of this module, such as *Flavobacteriaceae* (Buchan et al. 2014), *Verrucomicrobiacea* (Martinez-Garcia et al. 2012) or *Cryomorphaceae* (Bowman 2014), can use complex algal-derived substrates and present a typical increase in abundance after phytoplankton blooms (Teeling et al. 2016). We interpret these observations to be a result of the relatively low sampling time resolution that probably fails to resolve rapid OTU variations of other opportunistic bacteria.

439 Overall, this study allowed us to delineate several groups of bacterioplankton trophic strategies and 440 their variations in response to biogeochemical cycles in a highly dynamic coastal environment. Oligotrophs, typically represented by SAR11 OTUs, were present in all water masses. They 441 442 outcompete other heterotrophic organisms in low labile organic matter environments such as winter 443 and deep offshore water masses, while copiotrophs communities develop during the high productivity 444 period. Within copiotrophs, several taxa show patterns of adaptation to rapidly changing conditions in 445 their substrate availability: opportunist taxa can rapidly become highly dominant (represented by 446 Tenacibaculum and Alteromonadales) after local events such as phytoplankton bloom, while more 447 generalist taxa such as Rhodobacteraceae exhibit a ubiquitous distribution. It is likely that this 448 dichotomy between oligotroph and copiotroph is an over-simplification in trophic strategies, as 449 suggested by numerous studies (Bryson et al. 2017; Mayali et al. 2012). Heterotrophs could instead 450 follow a gradient from oligotrophy to copiotrophy, and only finer analysis such as growth rate 451 measurements or dissolved organic matter quantification could help to better describe the trophic 452 strategies of heterotrophs (Kirchman 2016). However, these complex heterotrophic community 453 dynamics observed in this study highlight the central role of free-living bacteria in organic matter 454 cycling. Indeed, previous studies of the Iroise Sea nutrient cycling demonstrated that after the initial 455 depletion of winter nutrients pool, phytoplankton growth strongly relies on nutrients recycled through

- 456 the microbial loop (LHelguen et al. 2005), through which they are remineralized several times in a
- 457 seasonal cycle (Birrien et al. 1991). In this system, bacteria could be directly responsible for up to 25%
- 458 of urea with the remaining originating from ciliates mainly, which also mostly feed on bacteria
- 459 (LHelguen et al. 2005)

#### 461 Conclusion

462 Here, using a complex 3D (vertical, horizontal, and temporal) survey of free-living bacterial diversity 463 in correlation with the seasonal dynamics of a coastal tidal front, we have shown that such complex mesoscale features controls the dynamic of free-living bacterial communities. The Ushant tidal front 464 acts as an ecological boundary for those communities. We illustrated the link between different water 465 466 masses on this dynamic with for instance photosynthetic bacteria enriched in oligotrophic stratified waters in late summer. Using a network analysis, we were able to gain insight on ecologically coherent 467 468 modules of free-living bacteria driven by the availability of organic matter produced by the 469 phytoplankton. This has major implication for our understanding of the microbial loop in coastal systems. In the future, these observations should be confirmed with measurements and characterization 470 of dissolved organic matter quantity and quality in the water column as well as direct measurement of 471 472 growth rates in order to more precisely describe bacterial trophic strategies. Moreover, to better 473 understand these systems, future studies should include the characterization of other key members of 474 the planktonic communities such as viruses, ammonium oxidizing archaea, eukaryotic phytoplankton and grazers, as well as particle-attached bacteria that are central for organic matter and biogeochemical 475 476 cycles.



# Figure 1 | Environmental and bacterial communities characteristics of the Iroise Sea for the different cruises.

482 A. Map of the Satellite Sea Surface Temperatures (SST) in the Iroise Sea for each cruise (September 2014 the 8th, March 2015 the 6th, July 2015 the 2<sup>nd</sup> and September 2015 the 8th), highlighting in the summer cruises the 483 484 presence of the Ushant front that separates offshore warm stratified waters and coastal cooler mixed waters. The 485 shape corresponds to the different stations sampled, with at each time 2 or 3 depths. Surface waters are highly 486 dynamic and some eddies are conspicuous during September 2015, bringing cold water into surface stratified 487 waters. Thus SST map are not enough to define the frontal area and vertical profiles are needed to characterize 488 the different water masses (suppl. Data 1) B. Principal Component Analysis of the environmental characteristics 489 for the different samples (n=49) based on temperature, inorganic nutrients (Si(OH)<sub>4</sub>, NO3+NO2, PO4) 490 concentrations and microscopic count of the different phytoplanktonic groups (Diatom, Nanophytoplankton, 491 Cryptohyceae and Dinoflagellate) C. NMDS of the bacterial diversity based on Bray-Curtis dissimilarities 492 among the different cruises, stations and depth (stress=0.091). For bacterial diversity, biological triplicates were

493 done for each station and depth, explaining the higher number of samples (n=135).



#### 495 Figure 2 | Visualization of the different modules and their main characteristics

A. Representation of the main connectivity between the different modules detected with the Louvain algorithm.
 Each node represent a module, each edge represents the median of the positive correlations between two
 modules. Only the strongest connections are shown.

- **B.** Network visualisation of the dataset. Each node represents an OTU, while each edge represent a positive
- 500 correlation (>0.3) obtained from the covariance matrix calculated with SPIEC-EASI. The node size depends on
- 501 the abundance of one OTU (in number of sequences) in the entire dataset. The edge size depends on the value 502 of the correlation. Nodes colors represent the OTU affiliation to the different Louvain communities. Network
- 502 of the correlation. Nodes colors represent the OTU affiliation to the different Louvain communities. Network 503 was represented using Gephi and Force Atlas layout algorithm. **C.** Presentation of the 14 modules detected.
- 504 Pearson correlations between each module eigengene and the different environmental data are presented in the
- 505 heatmap. OM : Organic Matter, PAR: Photosynthetically Available Radiation, PON : Particulate Organic
- 506 Nitrogen, POC: Particulate Organic Carbon. Only the significant correlations (p.value > 10-4) are shown. The
- 507 number of OTUs in each module and the relative abundance of each module (in % of all the reads) are detailed.



#### 509 Figure 3 | Module dynamics across the different campaigns, stations and depths

510 Relative abundance of the different modules in each campaign, station and depth. The value shown resulted of

511 the mean of the triplicates done for each sampling. The legend includes the different hypotheses of the modules'

512 trophic strategies based on their correlations to the environmental parameters, their taxonomy and their dynamic.

513 Oligotrophic modules are likely to present heterotrophic bacteria adapted to low organic matter levels, while

514 copiotrophic bacteria are likely more competitive under higher organic matter levels. Finally the photosynthetic

515 module is almost only composed of Cyanobacteria.





A.

#### 518 Figure 4 | Modules' taxonomy and Coefficient of Variation of their OTUs

- 519 A. Relative abundance of the 30 main families in each module. B. Proportion of OTUs (in % of all the OTUs
- 520 in a module) that present a High Coefficient of Variation (HCV) in red, or a Low Coefficient of Variation
- 521 (LCV) in blue defined based on Newton method (Newton et al., 2016).

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