- 1 Metabarcoding of unfractionated water samples relates phyto-, zoo-
- 2 and bacterioplankton dynamics and reveals a single taxon bacterial
- 3 bloom

4

8

- 5 Christian Wurzbacher<sup>1, 2, 3</sup>, Katrin Attermeyer<sup>2, 4</sup>, Marie Therese Kettner<sup>2</sup>, Clara
- 6 Flintrop<sup>3, 5</sup>, Norman Warthmann<sup>3, 6, 7</sup>, Sabine Hilt<sup>7</sup>, Hans-Peter Grossart<sup>2, 8</sup>,
- 7 Michael T. Monaghan<sup>3, 7</sup>
- 9 1 University of Gothenburg, Department of Biological and Environmental Sciences, Box 461,
- 10 40530 Göteborg, Sweden
- 2 Leibniz-Institute of Freshwater Ecology and Inland Fisheries, Alte Fischerhütte 2, 16775
- 12 Stechlin, Germany
- 13 3 Berlin Center for Genomics in Biodiversity Research, Königin-Luise-Str. 6-8, 14195 Berlin,
- 14 Germany
- 4 Uppsala University, Department of Ecology and Genetics, Limnology, Norbyvägen 18D, 75236
- 16 Uppsala, Sweden
- 17 5 Helmholtz Young Investigator Group SEAPUMP, Alfred Wegener Institute for Polar and Marine
- 18 Research, Am Handelshafen 12, 27570 Bremerhaven, and MARUM, University of Bremen,
- 19 Leobener Strasse, 28359 Bremen, Germany
- 20 6 The Australian National University, Research School of Biology, Linnaeus Way, Canberra, ACT
- 21 **2601**, Australia
- 22 7 Leibniz-Institute of Freshwater Ecology and Inland Fisheries, Müggelseedamm 301, 12587
- 23 Berlin, Germany
- 24 8 Potsdam University, Institute of Biochemistry and Biology, Maulbeerallee 2, 14469 Potsdam,
- 25 Germany

26

- 27 Corresponding authors: Christian Wurzbacher (christian@wurzbacher.cc), Katrin
- 28 Attermeyer (katrin.attermeyer@ebc.uu.se)
- 30 The authors declare no conflict of interest

### **Summary**

31

Most studies of aquatic plankton focus on either macroscopic or microbial 32 communities, and on either eukaryotes or prokaryotes. This approach overlooks 33 potential interactions among groups. We tested whether universal DNA-34 metabarcoding of unfractionated water samples could be used to qualitatively 35 and quantitatively study the temporal dynamics of the total plankton 36 community in a shallow temperate lake. We found significant changes in the 37 relative proportions of normalized sequence reads of eukaryotic and 38 prokaryotic plankton communities over a three-month period in spring. Patterns 39 followed the same trend as plankton estimates using traditional microscopic 40 methods. We characterized the bloom of a conditionally rare bacterial taxon 41 belonging to Arcicella, which rapidly came to dominate the whole lake 42 ecosystem and would have remained unnoticed without metabarcoding. Our 43 data demonstrate the potential of universal DNA-metabarcoding applied to 44 unfractionated samples for providing a more holistic view of plankton 45 communities.

### Introduction

46

47

48

Microbial communities are an integral component of total biodiversity 49 (Barberán et al. 2014) and play key roles in all ecosystems. An understanding 50 of their composition and dynamics is critical for studying ecosystem functions 51 and services. Plankton communities in freshwater and marine ecosystems are 52 comprised of both microbial and macroscopic organisms from all three domains 53 of life (archaea, prokaryotes, and eukaryotes). Traditionally, plankton is 54 classified into functional groups such as phytoplankton, zooplankton, and 55 bacterioplankton; or into size classes such as picoplankton, nanoplankton, and 56

microplankton. This classification has resulted in the emergence of 57 independent fields of inquiry for many of the above groups. This is particularly 58 true for the separation of prokaryotic and eukaryotic groups. 59 60 A consequence of this separation is that simultaneous studies of all members 61 of the plankton community are rare, being thus far restricted to marine studies 62 in contemporary environmental surveys (Steele et al., 2011, Lima-Mendez et 63 al., 2015). This is despite the tremendous potential of integrated studies for 64 providing an interdisciplinary view of plankton communities (Fuhrman et al., 65 2015). Most plankton studies employ size pre-selection steps (i.e. size 66 fractionation by selective filtration) and marker genes targeting bacteria, 67 archaea, or eukaryotes. Less than 1% of studies target all three, SI1). This 68 tradition impairs a full integration of microbial communities into ecological 69 concepts. 70 71 We used universal, cross-domain (Bacteria, Archaea, Eukarya) DNA-72 metabarcoding of unfractionated water samples to study the entire plankton 73 community of the eutrophic, shallow, temperate Lake Gollin (*Kleiner Gollinsee*) 74 in northeastern Germany. We extracted total DNA from direct-filtered (0.2 µm) 75 lake water (0.5 to 1 L), enabling us to screen all organisms from what is 76 traditionally size-classified as pico- to mesoplankton (per definition 0.2 µm - 20 77 mm). Our aim was to characterize the whole plankton community and its 78 temporal dynamics in relation to algal biomass over a three-month period in 79 spring (April - June) 2010. This is the period with the highest dynamics of 80 plankton in most temperate eutrophic lakes. Our sampling (see SI1 for 81 parameters and experimental procedures) was part of a larger more traditional 82

whole-lake survey of bacteria, phytoplankton and zooplankton from April 2010 to December 2011 (Brothers *et al.*, 2013) that we used for comparison.

#### **Results & Discussion**

85

86

103

104

105

Prokaryotic- and eukaryotic population dynamics 87 The universal DNA-metabarcoding of unfractionated water samples successfully 88 amplified across all three domains of life, yielding a total of 1307 bacterial, 388 89 eukaryal and 190 archaeal OTUs in the dataset. We recovered dominant 90 organisms from nano- to mesoplankton size classes (see SI2 for taxa browsing) 91 including typical freshwater bacteria (e.g. *Polynucleobacter*), phytoplankton 92 (e.g. Cryptophyceae), and zooplankton (e.g., Maxillopoda). One field sample 93 contained a small swimming fish larva, which was detected (as 1% of the total 94 community, classified as Teleostei, see SI2) using our approach. Archaeal 95 sequences were not abundant in Lake Gollin during the study period. This was 96 unlikely to be caused by a primer bias, because the primer pairs have been 97 successfully used to detect a dominance of Archaea in a meromictic lake (Gies 98 et al., 2014). The sum parameters for the three domains revealed a 99 pronounced shift from a dominance of eukaryotes in April to a dominance of 100 prokaryotes in June for all sampled water compartments (i.e. littoral, pelagic 101 and sediment zones; Fig. 1a). This was accompanied by an increasing ratio of 102

Comparison with microscopical observations

heterotrophs: phototrophs (SI3).

Abundance patterns based on DNA-metabarcoding data followed the trend of
the sum parameters of phyto-, zoo- and bacterioplankton obtained from
traditional microscopical counting data (SI3). Counting and sequence data were

not taken on the same day and are thus not directly comparable. Nevertheless, our data describe very well the previously reported dynamics of this lake: In the winter prior to our study period the lake underwent a significant fish-kill event caused by a prolonged ice-cover that led to anoxia. Thus, this event had an important impact on the whole lake ecosystem. There was a bloom of herbivorous ciliates in April 2010 (Lischke *et al.*, 2016) that was clearly visible in our data (approx. 30%, Fig. 1d). The ciliates likely exerted a very high grazing pressure upon the small plankton (<5 µm; Lischke *et al.*, 2016), which was mitigated when the ciliate population crashed in May-June (Fig. 1d) and replaced by increasing crustacean abundances (Hilt *et al.*, 2015; in our data especially in the pelagic zone, SI3). The replacement of ciliates by crustaceans may have then opened a niche for the observed bacterial dominance in June, through reduced grazing pressure and increased substrate supply via sloppy feeding of the copepods (Fig. 1).

124 Bloom-forming OTUs

Curiously, the bacterial dominance in June was attributed to operational taxonomic units (OTU) classified as the genera *Arcicella* and *Variovorax*. A single *Arcicella* OTU was most abundant in the pelagic, open water and potentially colonized the water from the surface (sampling depth = 1 m), where it reached highest proportions (Fig. 1b). *Variovorax* was more prevalent above the sediment, suggesting colonization from the sediment (Fig. 1c). In contrast to *Variovorax*, which exhibited already stable proportions at the other two sampling dates, *Arcicella* was present at very low abundances in April and May (<0.2%) and can thus be classified as a conditionally rare taxon (Lynch and Neufeld, 2015). There are few reports of blooms of rare bacterial taxa (e.g.,

Gilbert et al., 2012 described a Vibrio sp. bloom in the English channel; and Bizic-lonescu et al. 2014 described the genera Flavobacterium and Undibacterium associated with a phytoplankton breakdown event in a lake) that were correlated to algae blooms. In order to test whether Arcicella was a reoccurring taxon in Lake Gollin or if this was a unique appearance related to the fish-kill disturbance, we screened additional samples (two size-fractions in this case: 0.2-5  $\mu$ m & > 5  $\mu$ m) that were available from Lake Gollin (Brothers et al., 2013). Arcicella re-occurred in the following year (Fig. 2) and its appearance appeared negatively related to chlorophyll a concentrations and positively to crustacean biomass (SI1). Thus, this bacterial bloom appears to be rather different than previously described bacterial peak abundances coupled to phytoplankton. The presence of such bloom-forming conditionally rare taxa support the previously described food web dynamics of Lake Gollin (Lischke et al., 2016), and extend it to the microbes. Conditionally rare taxa can have a disproportional significance for the overall community dynamics by shifting the total community structure (Shade et al., 2014), however, knowledge of the ecological and metabolic potential of the rare species is required to draw conclusions about their ecosystem-wide consequences.

#### What is Arcicella?

135

136

137

138

139

140

141

142

143

144

145

146

147

148

149

150

151

152

153

154

155

156

157

158

159

160

Searching through existing freshwater and marine data sets, we found virtually nothing on *Arcicella* with a few exceptions (often in lotic ecosystems). Although not further discussed in their article, *Arcicella* was reported as the second most abundant OTU (6.8%) in all large circumpolar streams (Crump *et al.*, 2009), which instantly raised our attention. In other studies, we had to explicitly ask the authors for *Arcicella*. For example, a single *Arcicella* OTU was among the 10

most dominant OTUs in the large Danube River (however in total it comprised only moderate  $2\% \pm 2\%$ ; Savio pers. comm.; Savio *et al.*, 2015) and again a single *Arcicella* OTU reached  $12 \pm 4\%$  in a small turbid glacial lake (Peter pers. comm.; Peter and Sommaruga, 2016). It seems that this genus has a rather low diversity, but hosts single, occasionally very dominant OTUs. Despite those previous appearances, their autecology has never been investigated.

### Study limitations

168

169

170

171

172

173

174

175

176

177

178

179

180

181

182

183

184

185

186

There was a large standard deviation among our replicates for crustaceans (S3). These organisms belong to the mesoplankton size class (0.2 to 20 mm) and it might be necessary to increase the water volume to better quantify their occurrence in future studies. Sequences belonging to Metazoa could only be classified to order level (e.g. Maxillopoda, Teleostei), because the small ribosomal subunit does not provide sufficient phylogenetically informative characters for many Metazoa groups (Tang et al. 2012). This low taxonomic resolution for certain organismic groups is one of the drawbacks of a universal marker that has to be considered in future studies of these groups. Moreover, DNA based methods are not error free. PCR-based approaches include taxonomic biases introduced by DNA extraction, primer choice, amplification, library preparation and sequencing (Gilbert et al. 2012; Singer et al. 2016). Thus, quantitative estimates can be only seen as semi-quantitative. Universal metabarcoding has the same limitation but at least comes with the advantage, that it provides a balance between all organisms, since most of the DNA template will be derived from the target groups (only excluding virus in this case). To date, it has produced conclusive results for the general trends in plankton communities (our study, see also Gies et al. 2014, Parada et al. 2015,

Needham and Fuhrman 2016).

Conclusions

187

188

189

190

191

192

193

194

195

196

197

198

199

200

201

202

203

204

205

206

207

214

Using unfractionated water samples with universal DNA metabarcoding allowed us to document major changes in almost the entire size- and functional spectrum of freshwater plankton with a single water sample analysis. Changes in the relative abundance of OTUs closely matched the seasonal dynamics of phyto-, zoo-, and bacterioplankton reported for this lake based on microscopy, indicating that relative abundance data based on read counts are ecologically meaningful. The discovery of a bloom of a largely overlooked freshwater bacteria genus was remarkable, with potential implications for the whole lake ecosystem. Our results highlight the potential of simultaneously studying both microbial and macrobial communities for an understanding of whole ecosystem changes. Integrative and interdisciplinary analyses may help to answer broad ecological questions in freshwater systems related to the role of keystone species; ecosystem resilience and resistance; and cross-domain interactions of species. Unfractionated sampling coupled to a universal metabarcoding represents a valuable means of studying plankton dynamics in aquatic systems and shows promise for long-term whole community monitoring.

## **Acknowledgements**

We thank Uta Mallock for chemical analysis, Susan Mbedi for assistance in sequencing and Marie Jeschek for assistance in data processing. This is publication #027 of the Berlin Center for Genomics in Biodiversity Research. Financial support was provided by two projects of the Pact for Research and Innovation of the Leibniz Association "Terralac" and "TEMBI". R. Tischbier (Stiftung Pro Artenvielfalt) kindly provided us access to the lake.

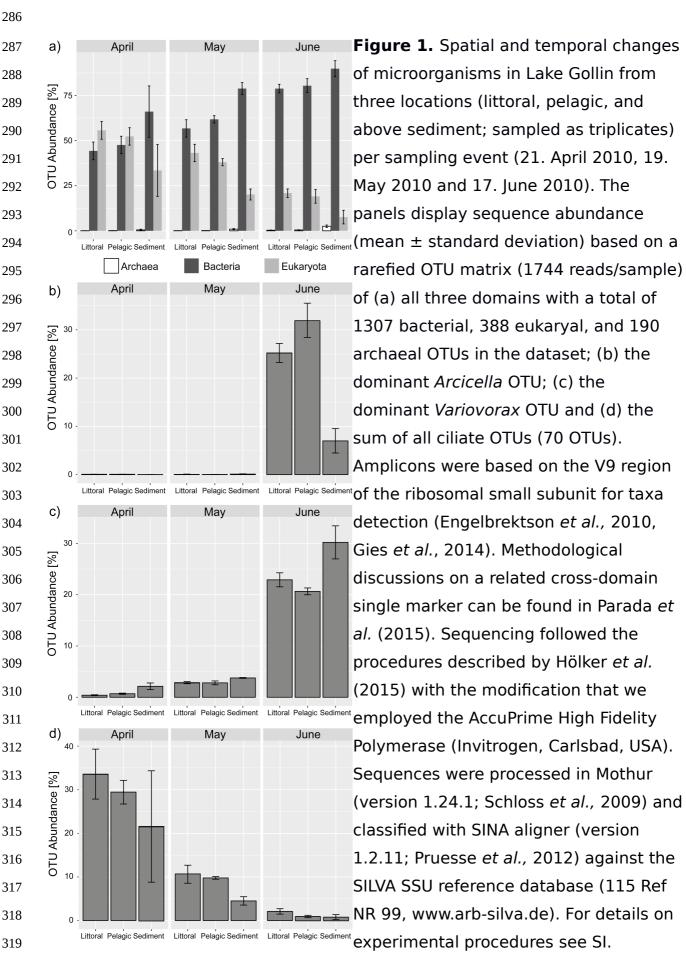
#### References

- 216 Barberán A, Casamayor EO, Fierer N. (2014). The microbial contribution to
- 217 macroecology. Front Microbiol 5: 203.
- 218 Bižić-Ionescu M, Amann R, Grossart, HP. (2014). Massive regime shifts and high
- 219 activity of heterotrophic bacteria in an ice-covered lake. *PloS one* 9(11):
- 220 e113611.

- Brothers SM, Hilt S, Attermeyer K, Grossart HP, Kosten S, Lischke B, Mehner T,
- Meyer N, Scharnweber K, Köhler J. (2013). A regime shift from macrophyte to
- 223 phytoplankton dominance enhances carbon burial in a shallow, eutrophic lake.
- 224 Ecosphere 4(11): 137. http://dx.doi.org/10.1890/ES13-00247.1
- 225 Crump BC, Peterson BJ, Raymond P., Amon RM, Rinehart A, McClelland JW,
- Holmes RM. (2009). Circumpolar synchrony in big river bacterioplankton. Proc
- 227 Natl Acad Sci 106(50): 21208-21212.
- 228 Engelbrektson A, Kunin V, Wrighton KC, Zvenigorodsky N, Chen F, Ochman H,
- 229 Hugenholtz P. (2010). Experimental factors affecting PCR-based estimates of
- microbial species richness and evenness. ISME J 4(5): 642-647.
- 231 Fuhrman JA, Cram JA, Needham DM. (2015). Marine microbial community
- 232 dynamics and their ecological interpretation. *Nat Rev Microbiol* 13(3): 133-146.
- 233 Gies EA, Konwar KM, Beatty JT, Hallam SJ. (2014). Illuminating microbial dark
- matter in meromictic Sakinaw Lake. Appl Environ Microbiol 80(21): 6807-6818.
- 235 Gilbert JA, Steele JA, Caporaso JG, Steinbrück L, Reeder J, Temperton B et al.
- 236 (2012). Defining seasonal marine microbial community dynamics. ISME J 6:
- 237 298-308.
- Hilt S, Wanke T, Scharnweber K, Brauns M, Syväranta J, Brothers S et al. (2015).
- 239 Contrasting response of two shallow eutrophic cold temperate lakes to a partial
- winterkill of fish. *Hydrobiologia* 749: 31-42.
- Hölker F, Wurzbacher C, Weißenborn C, Monaghan MT, Holzhauer SI, Premke K.
- 242 (2015). Microbial diversity and community respiration in freshwater sediments
- influenced by artificial light at night. *Philos T Roy Soc B* 370(1667): 20140130.
- Lima-Mendez G, Faust K, Henry N, Decelle J, Colin S, Carcillo F. et al. (2015).
- Determinants of community structure in the global plankton interactome.
- 246 Science 348(6237): 1262073.
- Lischke B, Weithoff G, Wickham SA, Attermeyer K, Grossart HP, Scharnweber K
- et al. (2016). Large biomass of small feeders: ciliates may dominate herbivory
- in eutrophic lakes. J Plankton Res 38(1): 2-15.

- Needham DM, Fuhrman JA (2016). Pronounced daily succession of
- 251 phytoplankton, archaea and bacteria following a spring bloom. *Nat Microbiol* 1:
- 252 16005. http://dx.doi.org/10.1038/nmicrobiol.2016.5
- 253 Parada AE, Needham DM, Fuhrman JA. (2015). Every base matters: assessing
- 254 small subunit rRNA primers for marine microbiomes with mock communities,
- time series and global field samples. Environ Microbiol doi: 10.1111/1462-
- 256 2920.13023.
- Peter H, Sommaruga R. (2016). Shifts in diversity and function of lake bacterial
- communities upon glacier retreat. ISME / doi: 10.1038/ismej.2015.245
- 259 Pruesse E, Peplies J, Glöckner FO. (2012). SINA: accurate high-throughput
- 260 multiple sequence alignment of ribosomal RNA genes. *Bioinformatics* 28(14):
- 261 **1823-1829**.
- Savio D, Sinclair L, Ijaz UZ, Parajka J, Reischer GH, Stadler P, et al. (2015).
- 263 Bacterial diversity along a 2600 km river continuum. *Environ Microbiol* 17(12):
- 264 4994-5007.
- Schloss PD, Westcott SL, Ryabin T, Hall JR, Hartmann M, Hollister EB, et al.
- 266 (2009). Introducing mothur: open-source, platform-independent, community-
- supported software for describing and comparing microbial communities. Appl
- 268 Environ Microbiol 75(23): 7537-7541.
- 269 Shade A, Caporaso JG, Handelsman J, Knight R, Fierer N. (2013). A meta-
- 270 analysis of changes in bacterial and archaeal communities with time. ISME J
- 271 **7(8)**: 1493-1506.
- 272 Shade A, Jones SE, Caporaso JG, Handelsman J, Knight R, Fierer N, Gilbert JA.
- 273 (2014). Conditionally rare taxa disproportionately contribute to temporal
- 274 changes in microbial diversity. *MBio* 5(4): e01371-14.
- 275 Singer E, Bushnell B, Coleman-Derr D, Bowman B, Bowers RM, Levy A et al.
- 276 (2016). High-resolution phylogenetic microbial community profiling. *ISME* / 10:
- 277 2020-2032.
- Steele JA, Countway PD, Xia L, Vigil PD, Beman JM, Kim DY, et al. (2011). Marine
- 279 bacterial, archaeal and protistan association networks reveal ecological
- 280 linkages. *ISME J* 5(9): 1414-1425.
- Tang CQ, Leasi F, Obertegger U, Kieneke A, Barraclough TG, Fontaneto D.
- 282 (2012). The widely used small subunit 18S rDNA molecule greatly
- underestimates true diversity in biodiversity surveys of the meiofauna. PNAS
- 284 109:16208-16212. 10.1073/pnas.1209160109.

# **Figure Legends**



**Figure 2.** Seasonal appearance of *Arcicella* exhibited pronounced maxima and minima over the course of the 2 years and appeared in the particle-attached (> 5  $\mu$ m) and free-living fraction (0.2 - 5  $\mu$ m). *Arcicella* was detected using a PCR assay (see experimental procedures S1) and evaluated based on gel electrophoresis band intensity where 0 = no PCR product, 1 = very weak product, 2 = weak product, 3 = medium product, 4 = strong product.

