

1 **Molecular Ecology of Coral Reef Microorganisms in the Western Indian Ocean coast of**
2 **Kenya**

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15

16 **Abstract**

17 Coral reefs face increased environmental threats from anthropomorphic climate change and
18 pollution, from agriculture, industries and tourism. They are economically vital for many
19 people worldwide, and harbour a fantastically diverse ecosystem, being the home for many
20 species of fish and algae. Surprisingly little is known about the microbial communities living
21 in and in the surrounding of coral reefs. Here we employ high throughput sequencing for
22 investigating the bacteria living in the water column and upper sediment layer in close
23 proximity to coral reefs on the Kenyan coast of the West Indian Ocean. We show that while
24 the read-level taxonomic distribution of bacteria is similar with ones obtained from 16S
25 metabarcoding, whole metagenome sequencing provides valuable functional insights not
26 available with 16S metabarcoding. We find evidence of pollution, marked by the presence of
27 *Vibrio* and more importantly the presence of antibiotic resistance notably to vancomycin, that
28 we attribute to the use of avoparcin in agriculture. Additionally, 175 bacterial genomes not
29 previously sequenced were discovered.

30

31 Our study is the first whole-metagenome study from the West Indian Ocean, provides a much-
32 needed baseline to study microbes surrounding coral reefs under different conditions as well
33 as the microbiome of coral reefs.

34

35 **Keywords:**

36 Coral reefs, Sequencing, Metagenomics, West Indian Ocean

37

38 **Introduction**

39 Coral reefs are one of the most biodiverse ecosystems in the world, thereby providing vast
40 ecological and socio-economic resources. However, coral reefs and consequently their
41 invaluable ecosystem services are increasingly under threat globally due to climate change and
42 a range of other human-related pressures, such as pollution from agriculture, industries and
43 tourism-related activities. These stressors lead to coral degradation the onset of which is most
44 often marked by bleaching following the expulsion of the symbiotic algae.

45

46 Addressing the challenges leading to coral death requires a comprehensive understanding of
47 corals and their interactions with other members of the reef ecosystems. Appreciation of this
48 fact has led to increased interest in marine microbiology research as microorganisms are
49 thought to be critical for reef ecosystem processes including coral homeostasis, nutrition and
50 protection against disease (Godoy-Vitorino, Ruiz-Diaz, Rivera-Seda, Ramírez-Lugo, &
51 Toledo-Hernández, 2017). Microbial communities are also known to respond and adapt quickly
52 to disturbance (Ainsworth, Thurber, & Gates, 2010). Therefore, studying coral reef-associated
53 microorganisms, as well as microorganisms living in close proximity of coral reefs, holds the
54 potential to help in improving the capacity to predict responses of coral reef ecosystems to
55 changing environmental conditions.

56 The advancement of DNA sequencing and analysis technologies, allowing sequencing DNA
57 directly without the need of cultivating organisms in laboratory settings, has augmented our
58 understanding of the complexity and diversity of natural microbial populations (Biller et al.,
59 2018). Most oceanic and costal surveys to date have used 16S metabarcoding, which provides
60 precious insights about population complexity and diversity, but only a broad overview of the
61 taxonomic distribution across samples with (i) limited resolution, especially for poorly
62 characterised samples such as environmental ones and (ii), no or poor functional and metabolic
63 insights of the sequenced communities (Poretsky, Rodriguez-R, Luo, Tsementzi, &
64 Konstantinidis, 2014; Rausch et al., 2019). Whole Metagenome sequencing (WMS) on the
65 other hand, has the potential for better taxonomic resolution, theoretically at the species level,
66 even though as for 16S taxonomic classification is highly tied to the database used and the type
67 and provenance of samples. Additionally, WMS also allows for reconstructing draft genomes
68 from metagenomes, providing exceptional phylogenomic insights as well as opening up
69 potential for functional annotation. Combined with recent advances in protein assembly
70 directly from metagenomic data, the method shows great promise to harness metabolic
71 pathways and functional knowledge from microbial communities.

72

73 The Western Indian Ocean (WIO), however, remains the least studied (Díez et al., 2016) of the
74 oceans, despite hosting the second largest hotspot for coral biodiversity globally, partly due to
75 the region's lack of technological capacity. Marine metagenomes, like most environmental
76 metagenomes, are diverse, making them especially difficult and expensive to analyse and
77 interpret. Here we deeply sequence microbiomes from the water column and the upper
78 sediment layer of three coastal reefs in Kenya, in an attempt to give an excellent taxonomic
79 overview of WIO coastal communities and to unravel the functional characteristics of those
80 rich environments.

81

82 **Methods**

83 *Study Sites*

84 The study was conducted at three marine protected areas (MPA) covering three of the five
85 counties on the coast of Kenya Indian Ocean (Fig 1). Consisting of fringing reefs, each of the
86 three sites was selected for its distinct human activities. Located about 118 km north of
87 Mombasa, Malindi Marine National Park and Reserve is the oldest MPA in Kenya, having
88 been gazetted in 1968 (McClanahan, Kaunda-Arara, & Omukoto, 2010). Sampling was done
89 close to the reserve (3°15'35.1"S, 40°08'40.0"E) where artisanal fishing is allowed. The marine
90 park is famous for glass-bottom boat tours and snorkelling among other recreational touristic
91 activities. It also experiences significant year-round discharge of freshwater and sediments
92 from the Sabaki River which runs through a catchment area dominated with agricultural
93 settlements (Munyao, Tole, & Jungerius, 2003; van Katwijk et al., 1993). Mombasa Marine
94 National Park and Reserve (3°59'45.7"S, 39°44'50.1"E) was established in 1986 (Ngugi,
95 2001)– with restrictions of protection being enforced commencing 1991 (Tuda & Omar, 2012)
96 – and is, arguably, the most visited of Kenya’s marine parks by both local and international
97 tourists (Owens, 1978). Due to its proximity to the urbanised touristic city, the park experiences
98 pollution from hotels, hospitals, domestic and industrial waste disposals (Okuku et al., 2011;
99 Stephen Mwangi, David Kirugara, Melckzedek Osore, Joyce Njoya, Abdalla Yobe and
100 Thomas Dzeha, 2001). Moreover, because Mombasa is the primary port serving inland eastern
101 and central African countries, the park is also impacted by marine traffic activities including
102 oil pollution and dredge-spoil dumping (Stephen Mwangi, David Kirugara, Melckzedek
103 Osore, Joyce Njoya, Abdalla Yobe and Thomas Dzeha, 2001). Lastly on the southern coast, 90
104 km from Mombasa, the Kisite-Mpunguti site (4°42'54.0"S, 39°22'23.8"E) is a protected area
105 that comprises of Kisite Marine National Park and Mpunguti Reserve created in 1973 and

106 gazetted in 1978. It is bordered by sparsely populated coral islands and experiences the least
107 human activities because it is 11 km offshore (Emerton & Tessema, 2001).

108

109 ***Field Procedures***

110 Sampling was done between 2016 and 2017 within the coral reefs, 200 - 500 m from the shore,
111 at a depth of 1-2 m during low tides in the morning hours. At each site, seawater was collected
112 in 5 L water bottles within 10 - 20 cm of a colony of *Acropora* spp. - the dominant coral species
113 at the sites - for microbial DNA isolation. Additional triplicate 50 mL seawater samples were
114 collected in disposable centrifuge tubes for nutrient analysis. A 10 mL syringe barrel was used
115 to collect 2 cm column of sediment at the base of each sampled coral colony, 0.25 g of which
116 was suspended in a bead tube containing inhibitor-dissolving and nucleic acid-preserving
117 buffer. Samples were transported on ice to the laboratory for processing, typically within 3
118 hours of sampling.

119

120 Physicochemical parameters including water temperature, pH, salinity, and dissolved oxygen
121 were determined *in situ*, at the time of sampling within the coral reefs, using portable
122 multiprobe water quality meters, per manufacturer's instructions (YSI Inc., Yellow Spring,
123 OH).

124

125 ***Laboratory Procedures***

126 *Nutrient testing*

127 Spectrophotometry methods were used to determine seawater concentrations of nitrate (NO_2^- -
128 N), nitrite (NO_3^- -N), ammonium (NH_4^+ -N) and phosphate (PO_4^{3-} -P) nutrients (Supplementary
129 Table 1 and 2) as described in Ongore et al., 2013 (Ongore et al., 2013).

130

131 *DNA isolation*

132 For each site, 4 L of seawater was vacuum-filtered (VWR, West Chester, PA, USA) through a
133 0.2-um pore size membrane (Pall Corporation, Port Washington, NY, USA) to capture
134 microbial cells which were then added to a bead tube with lysis buffer. PowerWater® DNA
135 isolation kits were used to isolate microbial DNA from seawater samples while sediment
136 samples were extracted with PowerSoil® DNA isolation kits according to the manufacturer's
137 instructions (Mo Bio, Inc., Carlsbad, CA, USA). Quality and quantity of DNA were checked
138 by Nanodrop and suitability for sequencing of DNA samples for metagenomics analysis was
139 confirmed with 1% agarose gel (Rohwer, Seguritan, Azam, & Knowlton, 2002).

140

141 *Library preparation and DNA sequencing*

142 Sequencing libraries were prepared from 1µg of DNA according to the manufacturers'
143 preparation guide # 15036187 using the TruSeq DNA PCR-free library preparation kit
144 (20015962/3, Illumina Inc.).

145 Briefly, the DNA was fragmented using a Covaris E220 system, aiming at 350bp fragments.
146 Resulting DNA fragments were end-repaired, and the 3' end adenylated to generate an
147 overhang. Adapter sequences were ligated to the fragments via the A-overhang and the
148 generated sequencing library was purified using AMPure XP beads (Beckman Coulter).

149 The quality of the library was evaluated using the FragmentAnalyzer system and a DNF-910
150 kit. The adapter-ligated fragments were quantified by qPCR using the Library quantification
151 kit for Illumina (KAPA Biosystems/Roche) on a CFX384Touch instrument (BioRad) before
152 cluster generation and sequencing.

153 A 200 pM solution of the individual sequencing libraries was subjected to cluster generation
154 and paired-end sequencing with 150bp read length using an S2 flowcell on the NovaSeq system
155 (Illumina Inc.) using the v1 chemistry according to the manufacturer's protocols.

156 Base-calling was done on the instrument by RTA 3.3.3 and the resulting .bcl files were
157 demultiplexed and converted to fastq format with tools provided by Illumina Inc., allowing for
158 one mismatch in the index sequence.

159 Sequencing was performed by the NGI SNP&SEQ Technology Platform in Uppsala, Sweden
160 www.sequencing.se.

161

162 *Bioinformatics Analyses*

163

164 The raw Illumina reads were trimmed at Q5 threshold (Macmanes, 2014), and the adapters
165 were removed using fastp v0.19.5 (Chen, Zhou, Chen, & Gu, 2018). Trimmed sequences were
166 deposited to the European Nucleotide Archive under the study accession PRJEB30838.

167

168 The trimmed reads were assigned a taxonomic classification using a combination of Kraken
169 v2.0.8 and bracken v2.2 against the nt database using default parameters (Lu, Breitwieser,
170 Thielen, & Salzberg, 2017; Wood, Lu, & Langmead, 2019). Rarefaction curves were computed
171 using R and vegan v2.5 (Oksanen et al., 2019; R Core Team, 2018).

172

173 The samples were assembled using megahit v1.1.4 with the options --k-min 27 --k-max 147 --
174 k-step 10 (Li, Liu, Luo, Sadakane, & Lam, 2015). The reads were then mapped to the
175 assemblies with bowtie v2.2.9 (Langmead & Salzberg, 2012) using default parameters and
176 binned into draft genomes with metabat v2.11.1 with option --minContig 1500 (Kang et al.,
177 2019). The genomes bins were then quality checked and refined with checkm v1.0.7 and
178 refinem v0.0.24 (Parks, Imelfort, Skennerton, Hugenholtz, & Tyson, 2015; Parks et al., 2017)
179 (scripts and refining parameters are available at <https://osf.io/5fzqu/>), and the best genome bins
180 were annotated using prokka v1.10 (Seemann, 2014) and eggno-mapper v1.0.3 (Huerta-Cepas

181 et al., 2017), as well as placed phylogenetically using gtdbtk v0.3.2 (Chaumeil, Mussig,
182 Hugenholtz, & Parks, 2019). The tree figure was generated using ggtree v1.14.6 (Yu, Smith,
183 Zhu, Guan, & Lam, 2017).

184

185 The trimmed reads were also assembled directly at the protein level using plasm (commit
186 26b5d6625a2fbef4cfaab4bfaa99b1682d35921c) (Steinegger, Mirdita, & Söding, 2018). The
187 resulting assemblies were then clustered at 40, 50 and 90% identity using cd-hit v4.7 (Fu, Niu,
188 Zhu, Wu, & Li, 2012) and annotated using eggno-mapper v1.0.3.

189

190 **Results**

191

192 *Taxonomic distribution of sediment and water associated organisms*

193 Of the 4.2 billion reads obtained, 608 million were classified as bacteria, 16 million as archaea,
194 12 million as viruses, 537 million as eukaryotic sequences and 3 billion remained unclassified.
195 The bacterial species richness was estimated at around 15000 for all samples (Supplementary
196 Fig 1), which is high but within reasonable magnitudes according to previously published large
197 metagenomes (Rodriguez-R & Konstantinidis, 2014). The vast majority of bacterial sequences
198 were identified as proteobacteria (Figure 2). The second most abundant phyla were
199 *Bacteroidetes* in the water samples and *Cyanobacteria* in the sediment samples.

200

201 At the genera level, *Pseudomonas* was ubiquitous in all samples (Figure 2), and dominant in
202 the sediment, whilst the diversity of Proteobacteria was found to be much higher in the water
203 samples, constituting the five most abundant genera. A non-negligible fraction of *Vibrio* was
204 also found in all sampling sites, mainly in the water samples. The most abundant cyanobacteria
205 in the Sediment samples were *Nostoc*, *Stanieria*, *Cyanothece*, *Calothrix* and *Synechococcus*

206 (with *Synechococcus* being also found in abundance in the water samples). In water,
207 Bacteroidetes were dominated by Flavobacteriaceae, more specifically the genera
208 *Flavobacterium*, *Zunongwangia*, *Chryseobacterium* and *Capnocytophaga*. Lastly, abundant
209 traces of *Bacillus*, *Paenibacillus*, *Lactobacillus* and *Streptococcus* were found.

210

211 The classified archaeal reads were mostly divided into two phyla: Euryarchaeota and
212 Thaumarchaeota, with the former dominating the water samples and the latter the sediment
213 samples. The Thaumarchaeota fraction is explained by the presence of *Nitrosopumilus*, a
214 common organism living in seawater. The Euryarchaeota fraction is a bit more diverse but is
215 mainly comprised of methanogens (Supplementary Fig 2).

216

217 **Assembly and Functional annotation of proteins**

218 A total of 21 million proteins were assembled, 12 million of which were unique proteins (after
219 clustering at 90% identity). A total of 424 distinct KEGG pathways were identified in the data,
220 which supports high diversity in function, especially in the water samples. Of note is that, in
221 the 20 most abundant pathways, we found a total of 952017 genes associated with antibiotic
222 biosynthesis, making it the second most abundant KEGG category after Biosynthesis of
223 secondary metabolites (Fig. 3).

224

225 Amongst less abundant but still expressed pathways, we also find carbon, methane and nitrogen
226 metabolism, as well as photosynthesis (Supplementary Fig 3). Additionally, the most abundant
227 pathways associated with antibiotics were related to monobactam, streptomycin and
228 vancomycin. (Supplementary Fig 4.).

229

230

231 **Metagenome-assembled genomes**

232 A total of 782 genome bins were recovered. Of those, 193 presented more than 50%
233 completeness and less than 15% contamination according to the checkm results. One hundred
234 seventy-eight of those were bacterial genomes, while 15 were classified as archaea.

235

236 Twenty-eight of the 178 bacterial genomes had a >95% match to an already published genome.
237 The remaining 150 are either new strains or new species. All genomes were classified to at
238 least the Phylum level. More than half of the recovered Bacteria were Proteobacteria,
239 Bacteroidetes and Cyanobacteria (Fig. 4).

240

241 The recovered archaeal genomes all came from water samples. Of the 15, 7 were classified as
242 known archaea from the order Poseidoniales, and eight are newly discovered archaeal species,
243 all putatively placed in the Poseidoniaceae family.

244

245 **Discussion**

246

247 Bacterial communities from Indian Ocean reefs – and coastal waters – are critically
248 understudied. Here we present a catalogue of the microorganisms present in the upper sediment
249 layer and the water near coral reefs, as well as a catalogue of putative proteins and functions of
250 said microorganisms.

251

252 This study presents – to the extent of our knowledge – the first metagenomes taken from the
253 coastline of the West Indian Ocean, and offers a baseline for much needed further work on
254 conservation and monitoring of the West Indian ocean coasts. We present and publish a
255 catalogue of 12 million putative proteins and 193 draft genomes, including 175 previously

256 unpublished bacteria. While it had been valuable also to investigate the coral microbiome itself,
257 our study presents a solid baseline for monitoring water quality which we hypothesise may be
258 a good proxy for coral health. Indeed, while physicochemical properties of coastal waters have
259 remained stable in the region regardless of pollution status, bacterial communities may not be.
260

261 The taxonomic distribution of bacterial species, as presented in this study, while diverse, is
262 consistent with previously published coastal metabarcoding studies (Kelly et al., 2014). The
263 presence of *Vibrio* in the water samples is worrying, especially given the presence of *Vibrio*
264 *coralliilyticus* and *Vibrio owensii*. The former may be commensal at some water temperatures,
265 but the pathogenicity of both species is well documented (Gibbin et al., 2019; Ushijima, Smith,
266 Aeby, & Callahan, 2012).

267
268 Even though there were no obvious differences in the distribution of phyla between sites and
269 sample types, variations were observed in the abundances of three ecologically important
270 genera. *Candidatus Pelagibacter*, *Prochlorococcus* and *Synechococcus*, which are considered
271 to be ubiquitous in marine environments (Biller, Berube, Lindell, & Chisholm, 2015; Morris
272 et al., 2002; Ruffing, Jensen, & Strickland, 2016), had higher abundances in water at the Kisite-
273 Mpunguti site. *Candidatus Pelagibacter* is believed to be the most successful clade of
274 organisms on Earth and, although a heterotroph, it is known to thrive at the low nutrient
275 concentrations typical of open ocean conditions (Zhao et al., 2017). Overall, members of the
276 *Alphaproteobacteria* class are known to have higher relative abundance in habitats with higher
277 coral cover than in nutrient-rich algae-dominated habitats. Besides *Candidatus Pelagibacter*,
278 no differences were found in the distribution of genera from the class *Alphaproteobacteria*,
279 between sites or samples. On the other hand, members of *Synechococcus* and *Prochlorococcus*
280 are cyanobacteria that are considered the most important primary producers in the tropical

281 oceans, responsible for a large percentage of the photosynthetic production of oxygen (Biller
282 et al., 2015; Kim et al., 2018; Waterbury, Watson, Guillard, & Brand, 1979). Being autotrophs,
283 members of these genera are usually found in great abundance in ocean zones low in nutrients
284 (Dinsdale et al., 2008; Kelly et al., 2014). Also, cyanobacteria have high adaptive capacities
285 for nutrients and light harvesting, a competitive advantage over other marine microorganisms
286 (Louati et al., 2015). As such, *Synechococcus* and *Prochlorococcus* may have outcompeted the
287 other microbes at the Kuruwitu site where its distance from the coast, settlement and increased
288 human activities, may have had limited nutrients essential for their growth.

289
290 The main strength of metagenomics over metabarcoding is the insight into function, provided
291 by the protein assembly as well as the binning. We showed that the water samples the presence
292 of many antibiotic-related pathways, for both biosynthesis and resistance. It is particularly
293 striking that the majority of Metagenome-Assembled-Genomes (MAGs) from the
294 *Bacteroidetes* phylum indicated the presence of the vancomycin resistance pathway. While
295 surprising at first given vancomycin is not considered a first-line therapy antibiotic, it may be
296 explained by the use of avoparcin as a food supplement in agriculture. Antibiotic resistant
297 bacteria have been observed widely in aquatic environments following antibiotic
298 contamination from wastewater treatment plants or agricultural runoffs (Schmieder &
299 Edwards, 2012). Avoparcin is a glycopeptide antibiotic that is chemically very similar to
300 vancomycin; there have been earlier concerns about the use of avoparcin in agriculture in
301 various countries as well as Kenya (Bager, Madsen, Christensen, & Aarestrup, 1997; Nilsson,
302 2012; Raphael, Sam, Anne, Peter, & Samuel, 2017), and it would be reasonable to think it
303 would be the cause of vancomycin resistance gene clusters in coastal waters.

304

305 Most assembled proteobacteria showed signs of being autotrophic, presenting carbon fixation
306 and metabolism pathways. Some also seemed to be able to fix nitrogen. The cyanobacteria
307 retrieved from the sediment layer exhibited photosynthetic pathways. These organisms may
308 contribute a great deal of nutrient exchange in the whole ecosystem, even though they are not
309 living in direct symbiosis with corals, their contribution cannot be ruled insignificant.
310 Lastly, quorum sensing was found to be one of the most abundant pathways. While relatively
311 little is known about it, bacteria use quorum sensing as a way to chemically communicate with
312 each other, which has its importance in nutrient cycling across and within microbial
313 communities (DeAngelis, Lindow, & Firestone, 2008).

314

315 The difference in taxonomic distribution between the read-level classification and the genome
316 binning is quite striking in a few aspects. Almost no draft genomes from the sediment samples
317 passed the threshold for draft genomes of acceptable quality, and this could be explained by a
318 combination of factors and biases at different levels of the experiment, leading to assemblies of
319 poorer quality. All sediment samples resulted in more prominent and more fragmented
320 assemblies (Supplementary table 3) than the water samples. Metagenomes are notoriously
321 tricky to assemble, due to their variable genome coverage and non-clonal nature (Breitwieser,
322 Lu, & Salzberg, 2019), and additional factors such as unusual GC content or repeat-rich
323 genomes may have played a role. The total size of the assemblies may also indicate that the
324 sediment samples are more diverse and complex than their water counterpart, but that diversity
325 and complexity may be poorly represented in our results, due to the incomplete nature of our
326 biological databases and the imperfectability of our algorithms.

327

328 In conclusion, the pathways analysis, as well as the annotation of the draft genomes, provide
329 insights into the putative nutrients exchange and other interactions between bacteria and the

330 environment, including corals. Through nitrogen fixation, photosynthesis and carbon
331 metabolism, water and sediment bacteria may prove valuable to nutrient cycling in a healthy
332 reef. Additionally, we hypothesise that coastal bacterial communities are a potential health
333 indicator for reefs, especially regarding antibiotic resistance, potentially from agricultural
334 runoff, as well for opportunistic *Vibrio* pathogens. While metagenomics is expensive and
335 inconvenient to use in a monitoring setting, our dataset may prove valuable in designing more
336 targeted primer-based approaches to detect pollution in coastal communities. It is also possible
337 that – with the advance of long-read portable sequencers such as the oxford nanopore MinION,
338 the cost barrier for field sequencing for monitoring purposes drops dramatically, making
339 metagenomics a viable approach for monitoring coastal communities. Long-read sequencing
340 could also be used for obtaining full-length 16s sequences, which could potentially provide
341 resolution up to the species level.

342

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352

353

354 **Data accessibility**

355

356 Trimmed sequences were deposited to the European Nucleotide Archive under the study
357 accession PRJEB30838.

358 Scripts and Refining parameters for the genome binning are available at <https://osf.io/5fzqu/>

359

360 **Author contributions**

361

362 SW designed the study, conducted field sampling and laboratory processing, drafted and
363 revised the manuscript.

364 HG designed the study, performed the bioinformatics analyses and drafted the manuscript.

365 EV, OKL, NW, EBR, AMD, SV helped design the study and edited the manuscript.

366

367

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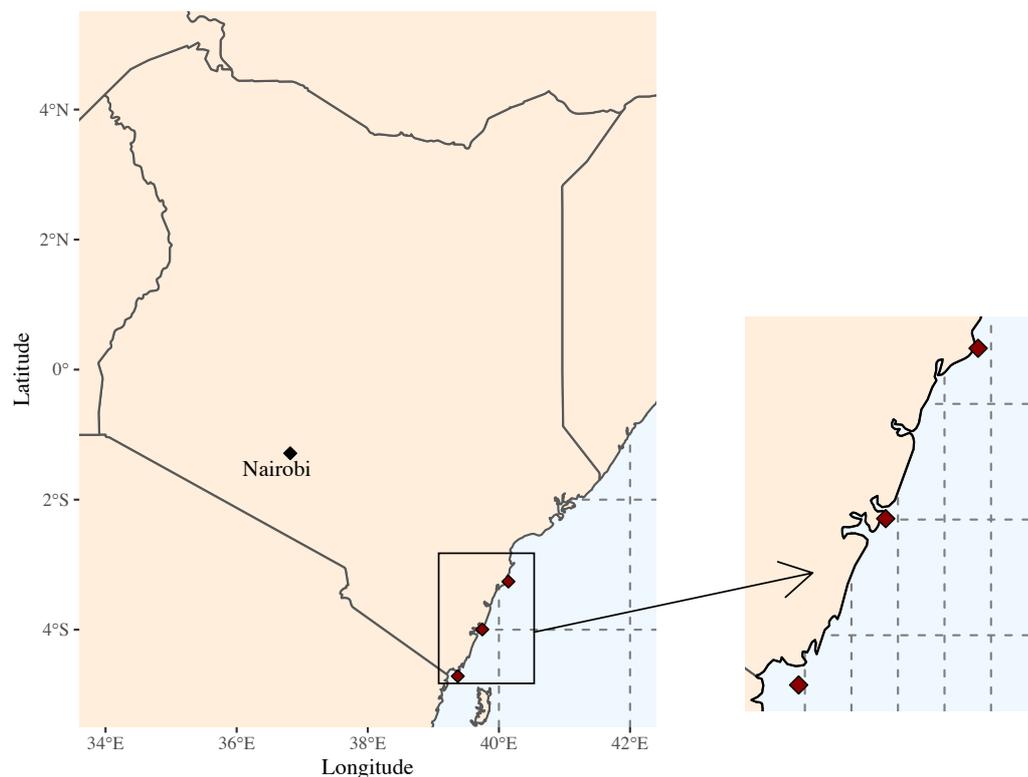
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531 **Tables and Figures**

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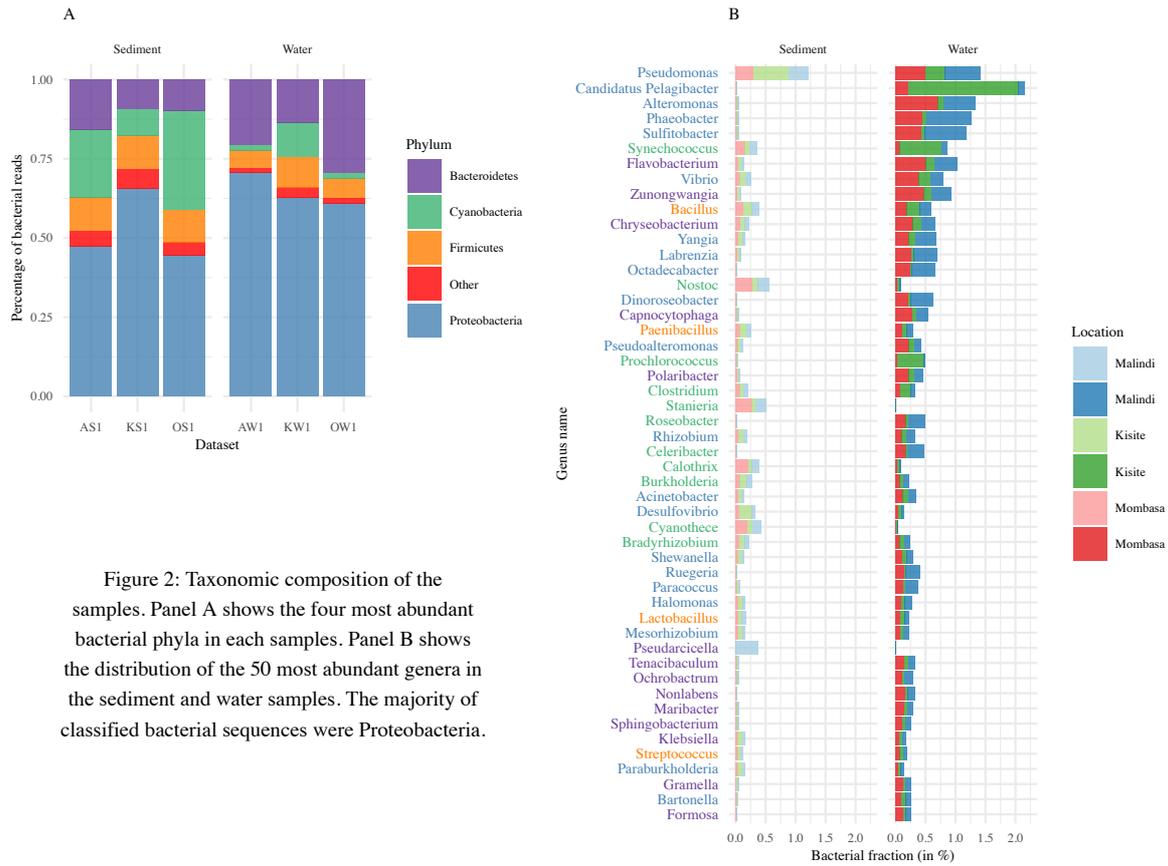
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535 *Figure 1:* Location of the sampling sites. The three sampling sites are indicated in red,
536 respectively from top to bottom: Malindi, Mombasa and Kisite. Each of the three sites was
537 selected for its human activities. Sampling was done in 2016 and 2017, 200 - 500 m from the
538 shore, at a depth of 1-2 m during low tides in the morning hours.

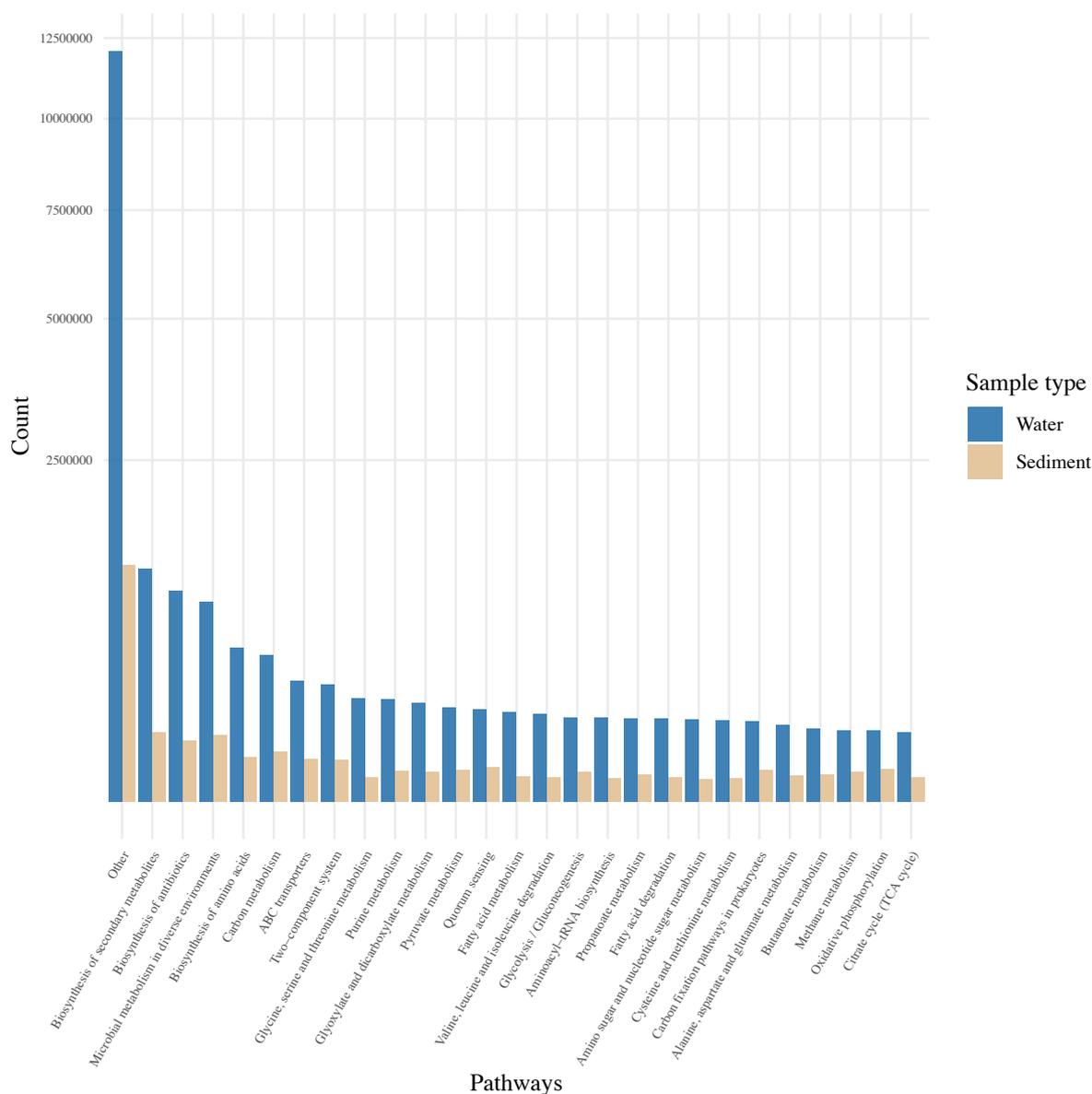
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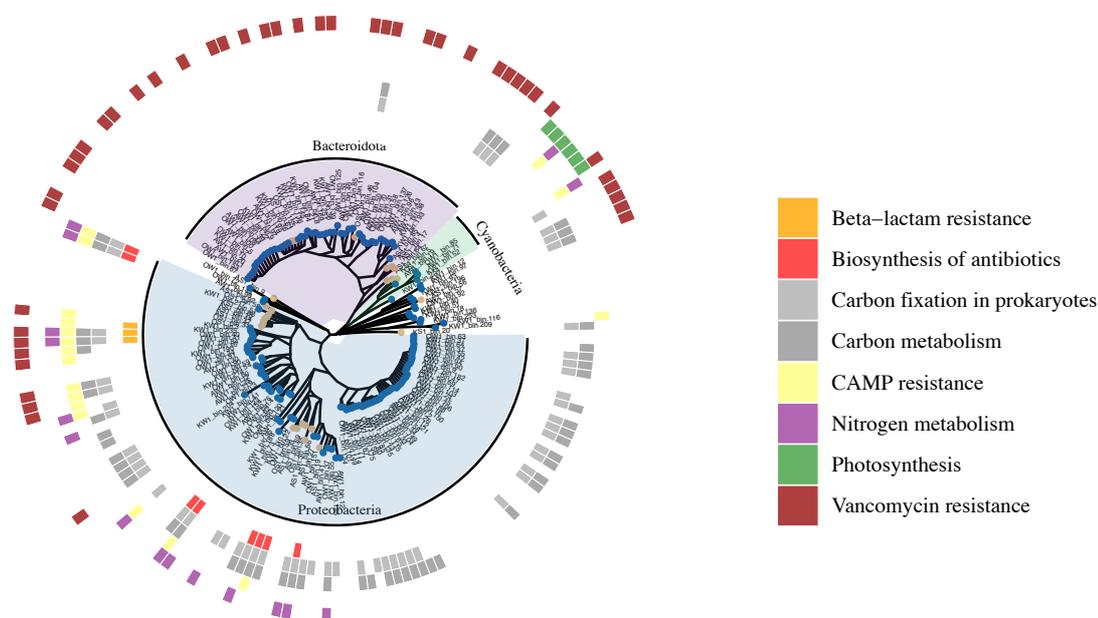
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544 Figure 3: Distribution of proteins associated to KEGG pathways from the plasm protein
 545 assemblies. The 20 most abundant pathways for both sediment and water are displayed here.



546

547 Figure4: phylogenetic tree for the 178 bacteria recovered from the metagenome assemblies.
548 The tree was generated with pplacer and plotted with ggtree. In blue are the bacteria recovered
549 from the water samples and in brown from the sediment samples. The outer circles represent
550 selected pathways that are present in the assemblies.