



# Exploring the Microbiota of the Guarapiranga Water Reservoir With [Long-Read Sequencing Technology](https://www.frontiersin.org/articles/10.3389/fmars.2021.791101/full)

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## INTRODUCTION

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The water reservoir of Guarapiranga supplies drinking water to more than 3.7 million people in the São Paulo (Brazil) metropolitan area, one of the most densely populated and industrialized regions worldwide. This reservoir is also used for recreational purposes such as fishing, bathing and aquatic sports. As some densely populated areas abut its shore, the water quality may be affected by diffuse pollution discharges. Eutrophication is a recurrent problem for maintaining the quality of water in this reservoir, mainly due to the risk of toxin-producing cyanobacteria blooms. Since the early 1970s, the Guarapiranga reservoir has remained eutrophic [\(Mozeto et al., 2001\)](#page-3-0). Copper sulfate has been used as one of the strategies to control bacterial blooms [\(Beyruth, 2000\)](#page-3-1). Nevertheless, the occurrence of worrisome amounts of cyanobacteria in Guarapiranga is still reported in recent studies [\(Alcantara et al., 2021\)](#page-3-2).

Many actinomycetes and cyanobacteria are well known for their ability to produce diverse secondary metabolites including toxins (such as microcystin, saxitoxin and cylindrospermopsin) and taste-and-odor compounds [such as geosmin and 2-methylisoborneol (2-MIB)] (Sivonen and Jones, [1999;](#page-3-3) [Graham et al., 2010\)](#page-3-4). Cyanotoxins may be classified based on toxic mechanism, in particular hepatotoxins (e.g., cylindrospermopsins and microcystins) and neurotoxins (e.g., anatoxins and saxitoxins). Many cyanotoxins have multiple variants with a range of toxicities [\(Welker and von Döhren, 2006\)](#page-3-5). Several studies have reported the negative health and ecological effects of cyanotoxins [\(Carmichael, 1992;](#page-3-6) [Funari and Testai, 2008\)](#page-3-7). Therefore, Brazil and several other countries have set national standards for cyanotoxins in drinking and recreational waters [\(Hudnell, 2008\)](#page-3-8). Microcystins are the most common cyanotoxins in Brazilian aquatic ecosystems [\(Genuário et al., 2016\)](#page-3-9). Unlike toxins, the taste-and-odor compounds are not actually toxic and, usually, there are no regulations for the presence of these compounds in drinking water. However, taste-and-odor compounds are of concern to the consuming public, and they are the primary criteria of drinking water safety considered by consumers. Moreover, the co-occurrence of cyanotoxins and taste-and-odor compounds have been studied in surface waters worldwide. For instance, microcystin co-occurred with geosmin in 87% and 2-MIB in 39% of the cyanobacterial blooms sampled from 23 Midwestern United States lakes [\(Graham et al., 2010\)](#page-3-4).

Due to the potential impacts of algal and bacterial blooms to water quality, information and identification of public health-relevant microbial species in drinking water reservoirs is important. The metagenomic approach overcomes microbial culturing limitations, providing taxonomic and functional diversity information of the sampled environment. Despite the importance of the water reservoir of Guarapiranga, literature on its microbial diversity and



<span id="page-1-1"></span>pollution impact is scarce [\(Fontana et al., 2014;](#page-3-10) Alcantara et al., [2021;](#page-3-2) [Pierangeli et al., 2021\)](#page-3-11). Herein we report the first metagenomic analysis of surface water from the Guarapiranga reservoir. Microbial diversity and populational dynamics of this area can help assess the impact of pollution, eutrophication risk, and proliferation of toxin-bearing cyanobacteria, which can be useful for developing more efficient water treatment strategies to assure high standards of public health.

### METHODS AND DATA ANALYSIS

Surface water samples were collected from Guarapiranga reservoir near to the water abstraction point used by the water treatment plant at coordinates 23°40'23"S, 46°43'12"W. Samples were collected in December 2020 in the euphotic zone (0.5 m depth), following the methodology described by the Brazilian National Guide of Sampling Collection and Preservation [\(CETESB/ANA., 2011\)](#page-3-12), kept at 4◦C for transportation and processed within 24 h.

A total volume of 900 mL of pooled sample water was filtered using 0.22-µm pore bottle-top vacuum filter system (KASVI). After total filtration, the filter membrane was removed using two sets of sterile forceps and inserted into the PowerWater DNA bead tube, with the top side facing inward. Total genomic DNA was extracted with  $DNeasy^{\circledR}$ PowerWater® kit (QIAGEN), followed by an additional cleaning step using DNeasy columns (QIAGEN) for an efficient removal of contaminants. DNA concentration and purity were evaluated by both NanoPhotometer NP80<sup>®</sup> (IMPLEN) and Qubit<sup>TM</sup> fluorometer (Life Technologies).

The sequencing library was prepared from 450 ng of genomic DNA with the Rapid DNA Sequencing kit (SQK-RAD004) from Oxford Nanopore Technologies (ONT). DNA sequencing was performed using the minION device (ONT) with the FLO-MIN106 flow cell, and the quality of sequencing monitored in real time on the MinKNOW interface (ONT). Computational processing was as follows (default parameters were used unless otherwise noted): Basecalling was performed by Guppy v.4.4.1 with the high quality r9.4.1\_450bps\_hac model. Reads were assembled with metaFlye v.2.8.3 with the –meta and –plasmids flags [\(Kolmogorov et al., 2020\)](#page-3-13). Contamination filtering was done by comparing contigs with the NCBI UniVec database<sup>[1](#page-1-0)</sup>. Contigs that passed this check were classified with kaiju v.1.7.4 (Menzel et al., [2016\)](#page-3-14), with the RefSeq (2021-02-26) database downloaded

<span id="page-1-0"></span><sup>1</sup><https://www.ncbi.nlm.nih.gov/tools/vecscreen/univec/>

from the Kaiju Webserver<sup>[2](#page-2-1)</sup>. Functional annotation was provided by the IMG/JGI annotation pipeline [\(Chen et al., 2021\)](#page-3-15), and the assembly is available from JGI GOLD [\(Mukherjee et al., 2020\)](#page-3-16). Search for secondary metabolites in the assembly was performed with antiSMASH version 6 [\(Blin et al., 2021\)](#page-3-17).

A total of 512,095 reads were obtained, with average length of 2,282 bp. The assembly has 655 contigs and a total of 18,457,687 bp, with a N50 of 41,334 bp. Bacteria correspond to 89.7% of the assembled metagenome (**[Figure 1](#page-1-1)**, **[Supplementary File 1](#page-2-0)**), and the most abundant bacterial phyla identified were Proteobacteria (35%); Terrabacteria (28%); Fibrobacteres, Chlorobi, and Bacteroidetes (FCB group, 17%); Planctomycetes, Verrucomicrobia, and Chlamydiae (PVC group, 8%); and Acidobacteria (7%). Viruses represent 9.9% of the assembly, 85% of which are Caudovirales bacteriophages, and 15% are protist and algae-infecting Megaviricetes. Only 0.4% of the metagenome (two species) was identified as archaea, genus Halobacteria.

Due to the importance of cyanotoxins and taste-and-odor compounds to drinking water quality, the presence of genes related to biosynthesis of these substances were verified by using a manually-curated dataset of 3,265 sequences of genes from the NCBI gene database (**[Supplementary File 2](#page-2-2)**). We then translated and compared these sequences with the assembled metagenome with tBLASTn. None of the 2,102 microcystin, 505 geosmin, 450 saxitoxin, 146 cylindrospermopsin, and 62 2-MIB biosynthesis genes were found in the Guarapiranga metagenome, even though we recovered genomic fragments from 49 cyanobacteria species. We hypothesize that organisms that express these compounds are either absent from the samples or present in such low concentrations that our sampling was not able to detect them. Moreover, it is known that massive amounts of copper sulfate and other chemicals have been used since 1970's by the São Paulo State agency responsible for basic sanitation (SABESP) for the control of algae and cyanobacteria [\(Leal et al., 2018\)](#page-3-18).

The metagenomic analysis is the first step toward the identification of key organisms responsible to produce toxins and taste-and-odor compounds. The presence of these microorganisms is not a sine qua non condition for the release of such compounds in the water body, which surely depend on the expression of specific enzymes involved in the biosynthetic pathways. Nevertheless, the detection of these microorganisms is a precocious indication of a potential production of toxins and taste-and-odor compounds, which can warn water supplier companies of an imminent danger. Hence, metagenomics can contribute to water quality control management.

From the functional annotation results we highlight photosynthesis and carbon fixation genes like transketolases, phage-related genes like integrases and lysozymes; and transmembrane transport (**[Supplementary File 3](#page-2-3)**). The majority of transmembrane transport genes are related to the ABC multidrug transport system or the AcrAB-TolC multidrug efflux pump. Both are known to be related to antibiotic resistance [\(Abdi et al., 2020\)](#page-3-19). Using AntiSMASH, we identified gene clusters related to the synthesis of proteusin, terpenes, arylpolene, and RRE-containing secondary metabolites.

Among identified species (**[Supplementary File 4](#page-2-4)**) we highlight the following: Aquirufa nivalisilvae (contig 491, 251,358 bp), which belongs to a relatively new (2019) genus of widespread freshwater bacteria [\(Pitt et al., 2019\)](#page-3-20); Candidatus Nitrosacidococcus tergens (contig 572, 144,006 bp), a species originally isolated from the biofilter unit of a pig farm in the Netherlands, able to grow and oxidize ammonia at pH 2.5 [\(Picone et al., 2021\)](#page-3-21); and Frigoriglobus tundricola (contig 636, 180,833 bp), a species originally isolated from tundra wetland in Russia, and which is a cellulolytic planctomycete (Kulichevskaya et al., [2020\)](#page-3-22).

#### DATA AVAILABILITY STATEMENT

The raw reads obtained in this project have been deposited in the NCBI Short Read Archive under the accession number PRJNA758495. The assembly and annotation are available under the JGI GOLD project ID Gp0563454.

### AUTHOR CONTRIBUTIONS

DS: sample preparation and sequencing. SA: base calling, binning, assembling, annotations, and gene analysis. EB, JS, CS, and RF: experimental design, sampling, manuscript preparation, and miscellaneous stuff. All authors contributed to the article and approved the submitted version.

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### SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found [online at: https://www.frontiersin.org/articles/10.3389/fmars.](https://www.frontiersin.org/articles/10.3389/fmars.2021.791101/full#supplementary-material) 2021.791101/full#supplementary-material

<span id="page-2-0"></span>Supplementary File 1 | Relative abundances of microbial taxa in water sample collected from Guarapiranga reservoir (São Paulo, Brazil).

<span id="page-2-2"></span>Supplementary File 2 | Curated dataset of taste-and-odor compounds (2-MIB and geosmin) cyanotoxins (cylindrospermopsin, microcystin and saxitoxin) genes.

<span id="page-2-3"></span>Supplementary File 3 | Count of functional categories present in the assembly evaluated with different databases.

<span id="page-2-4"></span>Supplementary File 4 | List of the contigs larger than 100kb, their sizes and their respective classifications given by Kaiju.

<span id="page-2-1"></span><sup>2</sup><http://kaiju.binf.ku.dk/server>

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