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Pollutants Co-occurring With Microcystins in Hypereutrophic Waters Used for Irrigation: A Case Study of the Crocodile West River Catchment

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ABSTRACT: Most urban water catchments are confronted with the challenges of eutrophication and other anthropogenic-related pollutants that can pose human health threats. To assess the suitability of using such anthropogenically polluted dam water for agricultural purposes the study monitored the co-existence of microcystins (MCs), metal pollutants, and anionic surfactants in irrigation canals and farm dams around Roodeplaat and Hartbeespoort Dams in South Africa. Field sampling was conducted four times between June 2019 and March 2021. The enzyme-linked immunosorbent assay (ELISA) method, a Hanna (HI96769) anionic surfactant portable photometer, and the inductively coupled plasma mass spectrometry (ICP-MS), were used to detect and quantify microcystins (MCs), anionic surfactants, and metals respectively. The results indicated that the water exceeded the guidelines for pH, EC, TDS, and nitrates. Eutrophication-related parameters such as MCs, chlorophyll *a*, and anionic surfactants were also relatively high. The Principal Component Analysis (PCA) showed the co-occurrence of MCs with EC, TDS, Pb, Cu, Al, and Ni in Hartbeespoort Dam-derived water, whereas pH and turbidity co-occurred with MCs in Roodeplaat Dam water. Such co-occurrences suggest that these parameters can be routinely monitored in place of MCs and this can be crucial in developing countries where resources and skilled manpower could be lacking.

KEYWORDS: Anionic surfactants, irrigation water, metals, microcystins, physicochemical parameters

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Introduction

Aquatic ecosystems are vulnerable to anthropogenic activities and disturbances, and pollution of these ecosystems impacts all forms of life. Among the negative impacts of contamination of surface waters include human diseases, deaths of aquatic organisms, decline in fishing activities, severe water shortages, and high costs of water treatment (Teixeira de Souza et al., 2021). Of particular interest are water reservoirs, which are ecosystems of interest since they are man-made and possess both natural and artificial phenomena (Padedda et al., 2017). These reservoirs are built to give humans services such as irrigation and drinking water, aquaculture services, hydroelectricity, managing floods, leisure, and tourism.

Technology advancement, human settlement, and industrialization have all accelerated the pollution of ground and surface water systems, soil, sediments, and air with harmful contaminants and chemicals (Isiuku & Enyoh, 2020). For example, agriculture contributes sediments and nutrients to aquatic ecosystems, urbanization introduces vast quantities of solids and organic contaminants and industries are large contributors of inorganic pollutants (Dalu & Froneman, 2016).

Among the most important global environmental challenges facing aquatic ecosystems is eutrophication (Padedda et al., 2017). Eutrophic conditions promote oxygen deficiency as a result of the excessive organic matter emanating from algal blooms that cannot be fully degraded, high levels of toxins

produced by cyanobacteria, production of bad odors and tastes (Padedda et al., 2017). Eutrophic waters also have problems of turbid waters, incidence of fish deaths, biodiversity loss, and loss of aesthetic value (Matthews & Bernard, 2015).

South Africa is renowned for having sound water policies and legislation, however, the severe deterioration of the country's water quality is a subject of concern (Griffin et al., 2014; Kruger et al., 2022). The country's leading water quality challenges are eutrophication, salinity, sedimentation, and microbial pollution (Roux et al., 2010). Over the last few years, acidification of surface waters as a result of a long history of poorly regulated gold mining in the country has also added to the burden (du Plessis, 2017).

Agriculture plays a significant role in the country's economy. Much of the water allocated to the agriculture sector goes to commercial agriculture (Pindihama & Gitari, 2020). The profitability and sustainability of this industry rely on the acceptability of the quality of water used to irrigate the crops and poor water quality can lead to lower yields and products of unacceptable quality.

Metals are naturally occurring in the environment. However, their environmental pollution is exacerbated through their continuous discharge in industrial effluents, wastewater treatment plants, agricultural activities and erosion, mining effluents, and waste dumps (Nde & Mathuthu, 2018). On the other hand, anionic surfactants are a common constituent of many

detergents due to their low cost and ease of synthesis. Anionic surfactants are discharged into aquatic ecosystems via untreated and treated wastewater, and they are not easily degraded under anoxic conditions such as those found in hypereutrophic water bodies (Pindihama & Gitari, 2023). Such hypereutrophic conditions are also a commonplace of harmful cyanobacterial blooms, which produce a variety of cyanotoxins such as microcystins (MCs) which pose a risk to both aquatic organisms and human health (Ge et al., 2021).

The Crocodile (West) and Marico catchment located in the North West Province in South Africa and covers parts of Gauteng is renowned for its poor water quality and hypertrophic water bodies (Pindihama & Gitari, 2020). The Crocodile and Marico rivers are the two main rivers in the catchment and these supply water to dams such as the Hartbeespoort, Rietvlei, Roodeplaat, and Bospoort Dams. Anthropogenic activities have severely altered these two rivers, with intense agriculture and mining activities having had unprecedented impacts on the water quality of these rivers (Nde & Mathuthu, 2018).

Surface water from the Crocodile and Marico rivers is mainly used for agriculture, domestic, industrial, and mining purposes and the poor quality of the water could have serious negative impacts on sectors like agriculture which rely on good water quality for their sustainability. The study thus investigated the suitability of using water derived from the Crocodile West and Marico water catchment for agricultural purposes by determining the co-existence of microcystins (MCs), metal pollutants, and anionic surfactants in irrigation water (canals and farm dams) around Roodeplaat and Hartbeespoort dam sites. Emphasis was also placed on the Principal Component Analysis of the variables monitored to identify a few simple parameters that can be reliably used for routine monitoring to assess the suitability of such water for agricultural purposes. The findings can assist in supporting water quality management and pollution control in the catchment and long-term mitigation of potential negative impacts of using such water for agricultural purposes.

Materials and Methods

Site Description

Hartbeespoort and Roodeplaat Dams situated in the North West and Gauteng Provinces of South Africa respectively, were selected as the sampling sites. These two dams are important reservoirs in the country. The Hartbeespoort is found along the Crocodile River and 90% of its inflow is derived from this river. The Crocodile River derives much of its inflow from the Magalies watershed and is a tributary of the Limpopo River system (Batayi et al., 2020). Water from the Hartbeespoort Dam is mainly used for irrigation, domestic uses and the dam is also used for recreational purposes. The Crocodile River drains from predominantly industrialized and highly populated areas and is subject to extreme levels of pollution.

Table 1. Description of the Sampling Stations.

SITE	SAMPLING POINT	DESCRIPTION
Hartbeespoort	H1	Farm dam
	H2	Canal
	Н3	Weir
	H4	Farm dam
Roodeplaat	R1	Canal
	R2	Farm dam
	R3	Farm dam

The Roodeplaat Dam on the other hand receives water from three major rivers namely the Hartbeespruit, Pienaars, and Edendalespruit Rivers. The Dam is located about 22 km northeast of Pretoria City, South Africa (Figure 1 shows the location of the two dams). The three inflowing rivers and the dam itself are highly contaminated by the human activities taking in and around them. The dam and its inflowing rivers are considered hyper-eutrophic and they receive effluent from two main wastewater treatment plants, urban discharge from households, industrial effluent, and agricultural run-off upstream of the Roodeplaat Nature Reserve (Marchand et al., 2012). Water from the dam is mainly used for irrigation, domestic and industrial purposes.

Sampling

Sampling, which involved monitoring of physicochemical parameters in situ and collection of water samples for ex situ analysis was conducted in June 2019, September 2019, February 2020, and March 2021 (with the major breaks in between due to COVID-19-related restrictions). Water samples were collected from farm dams and irrigation canals. Seven sampling sites (H1, H2, H3, and H4 around the Hartbeespoort Dam site and R1, R2, and R3 around the Roodeplaat Dam site) were selected for water sampling (Table 1). Figure 1 shows the location of the two dams and, Figure 2 shows the sampling points.

Glass amber bottles (100 mL) were used for microcystins (MCs) and anionic surfactants sampling and plastic HDPE (250 mL) bottles were used for metals, chlorophyll *a*, and nutrients (dissolved orthophosphates and nitrates) sampling. A 3 mL dose of 30% (v/v formalin) was added to each sampling bottle for anionic surfactants before sampling to preserve the samples from biodegradation.

All water samples were collected from farm dams and irrigation canals from a depth of approximately $0.5\,\mathrm{m}$ using a sampling rod. All water samples for metals determination were acidified with a drop of nitric acid (HNO $_3$) to prevent the precipitation of the metal species. All samples were properly labelled, collected in triplicates, and kept in cooler boxes packed

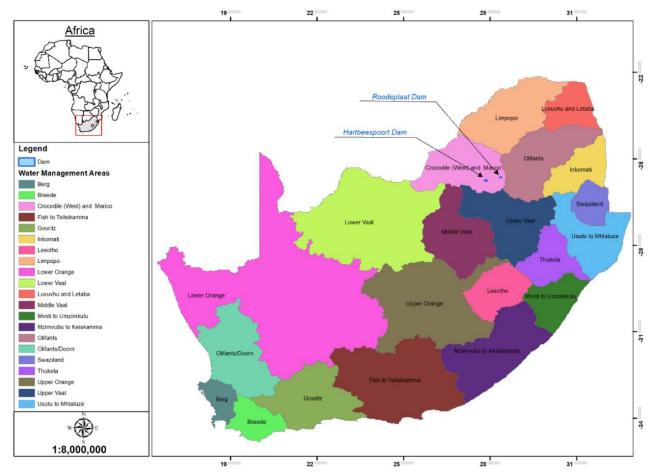


Figure 1. Location of Roodeplaat and Hartbeespoort dams in the crocodile west and Marico water catchment.

with ice for transportation to the laboratory for further processing and/or extraction (where applicable), and analysis.

Physicochemical Parameters Monitoring

A Jen-way pH/Cond meter (model 430) (United Kingdom) was used for the in situ monitoring of the water physicochemical parameters such as temperature, pH, total dissolved solids (TDS), and electrical conductivity (EC). A TB200 portable turbidimeter model (#TB200-10) was used to measure the turbidity of the water in situ. All meters were calibrated according to the manufacturer's instructions before use.

Determination of Nutrients, Microcystins, and Chlorophyll a

The levels of nutrients (dissolved orthophosphates and nitrates) in the samples were determined using Spectro-quant® Merck Pharo 100 model No: 07531-45 (Merck KGaA 64293 Darmstadt, Germany), using the photometric test kits supplied by Merck (Germany).

Chlorophyll *a* was used to estimate the levels of algal biomass in the water samples. Chlorophyll *a* was determined using the hot ethanol extraction method according to Lawton et al.

(1999). Spectrophotometric analysis of absorbency wavelength was done on a Spectro-star Nano (BMG LABTECH, 601-1106, Germany), and chlorophyll a levels were calculated according to Lawton et al. (1999).

The enzyme-linked immunosorbent assay (ELISA) method was used to determine the levels of total microcystins (MCs) in the water samples. The ELISA Microcystin Plate Kits (ENVIROLOGIX INC. (Kit Lot: 071499 Cat No: EP 022) were used for the assay according to the instructions that come with the kits and a microplate reader Spectro-star Nano (BMG LABTECH, 601-1106, Germany) was used to quantify the MCs after the assay.

Determination of Anionic Surfactants

The levels of anionic surfactants in the water were determined ex situ using the HANNA methylene blue active substances assay (MBAS) test kits according to the supplier's instructions. The assay is a colorimetric test that relies on the detection of anionic surfactants in the sample by methylene blue provided in the kits. The levels of anionic surfactants such as sodium dodecylbenzene sulfonate (within a range of 0.0 to 3.5 mg L^{-1}) are then measured on a HANNA HI96769 Anionic Surfactant Portable Photometer (Hanna Instruments, South Africa).

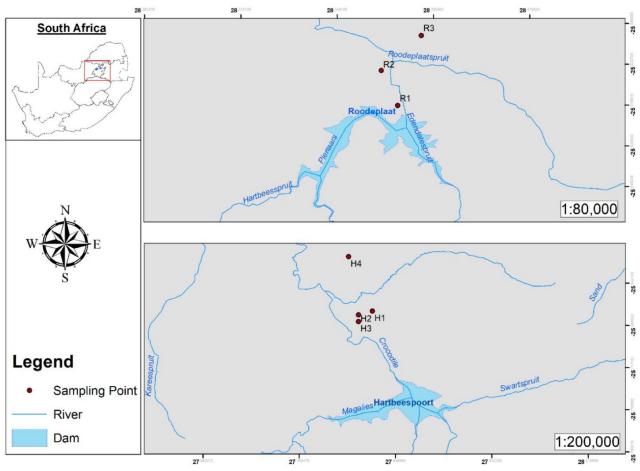


Figure 2. Study area with selected irrigation canals/farm dams sampling points at Roodeplaat and Hartbeespoort dam sites.

Determination of Metals

The acidified water samples collected from the field were kept at 4 °C in a refrigerator, and 10 mL of the samples were transferred into 15 mL centrifuge tubes, labeled accordingly, and sent to the Stellenbosch University Central Analytical Facility for determination of cations using the Inductively Coupled Plasma Mass Spectrometry (ICP-MS) analysis.

Data Analysis

Data was captured into a Microsoft Excel (2013) spreadsheet and was later imported into SPSS version 28.0 for bivariate correlation analysis and into GraphPad Prism 10 for principal component analysis (PCA). Compared to other statistical techniques, PCA is a robust method that does not need data to be normally distributed and uncorrelated variables (Bensoltane et al., 2021). PCA helped to group the data and give hidden relationships between the variables monitored.

Results and Discussion

Water Quality

The physicochemical characteristics of the water are summarised in Tables 2 and 3.

PH. The mean pH of the water ranged from 7.24 ± 0.63 to 9.72 ± 0.86 , indicating that the water derived from the two dams is slightly neutral to alkaline. The mean pH of all the three sampling points from the Roodeplaat site and one out of the four sampling points (H4) exceeded the South African guideline for irrigation waters (DWAF, 1996). Irrigating plants with water having a pH above 8.4 can have serious implications on the plants' health and ultimately affect the crop's yield and quality (Hopkinson & Harris, 2019). Such alkaline pH may also promote the excessive proliferation of harmful algal blooms in the water (Edokpayi et al., 2014). This was also supported by Mbiza (2014) who found that pH ranging between 6 and 9 tends to favor cyanobacterial dominance. The findings of this study tend to suggest that the pH levels found throughout our sampling period, ranging between 6 and 10, suited the dominance of cyanobacteria.

TDS and EC. The mean TDS and EC ranged from 280.95 ± 146.46 (sampling point R2) to 453.50 ± 347.16 mg L^{-1} (sampling point H4) and 493.00 ± 267.14 (R2) to 732.50 ± 541.95 (H4) μS cm $^{-1}$ respectively. The observed TDS and EC levels revealed that two out of three canals and three out of four farm dams sampled exceeded the recommended thresholds for water intended for irrigation water (DWAF,

Table 2. Physical and Chemical Parameters for Different Monitoring Stations Studied.

PARAMETER	R1	R2	R3	H	H2	H3	H4	GUIDELINE
Hd	8.54 ± 1.10	9.35 ± 1.33	9.72 ± 0.86	7.24 ± 0.63	7.96 ± 0.48	7.52 ± 0.68	9.23 ± 0.16	*6.5–8.4
	7.51–9.92	7.48–10.59	8.93-10.55	6.29–7.61	7.24-8.22	6.62-8.21	9.01-9.34	
TDS (mg L ⁻¹)	303.05 ± 168.73	297.25 ± 162.99	280.95 ± 146.46	378.00 ± 197.51	434.50 ± 136.41	352.25 ± 148.74	453.50 ± 347.16	*0-260.0
	169.2–549	190–540	176.8–498	230–663	270-604	242–558	265–974	
EC (µs cm ⁻¹)	506.25 ± 281.72	493.00 ± 267.14	466.75 ± 243.84	601.75 ± 275.06	713.50 ± 218.19	590.75 ± 256.08	732.50 ± 541.95	*0-400.0
	285–918	312–890	293–828	378–990	453–987	395–947	440–1545	
C C C C C C C C C C C C C C C C C C C	18.88 ± 4.14	22.95 ± 7.08	21.78 ± 6.18	18.95 ± 4.94	20.08 ± 6.53	19.73 ± 3.43	21.93 ± 5.51	n.a
	15.1–23.3	16–32.8	15–29.9	14.1–23.4	11.9–27.3	15.8–22.6	16.4–29.3	
Nitrates (mg L ⁻¹)	3.55 ± 3.11	3.18 ± 2.92	3.87 ± 3.25	5.36 ± 2.34	12.34 ± 10.85	4.25 ± 1.69	3.99 ± 2.34	<*5 (as
	0-8.43	0.4–7.53	0-8.65	2.7–9.13	0-28.43	2.1–5.9	0.9–8.07	morganic iv)
Phosphates (mg L ⁻¹)	1.01 ± 0.55	0.56 ± 0.55	0.52 ± 0.29	$\boldsymbol{0.97\pm0.13}$	0.50 ± 0.21	0.98 ± 0.14	$\boldsymbol{0.45\pm0.31}$	0-2**
	0.43–1.7	0.17–1.5	0.21-0.9	0.76–1.1	0.08-0.7	0.7–1.1	0.05-0.9	
MCs (µg L¹)	1.08 ± 1.14	6.04 ± 5.90	1.55 ± 1.37	0.21 ± 0.12	0.17 ± 0.07	0.19 ± 0.12	0.44 ± 0.28	n.a
	0.18–2.87	0.5–15.57	0.2–3.53	0.12-0.42	0.08-0.31	0-0.38	0.04-0.8	
Surfactants (mg L-1)	0.23 ± 0.19	1.84 ± 1.20	0.26 ± 0.30	0.19 ± 0.18	0.22 ± 0.10	0.16 ± 0.17	1.03 ± 1.52	n.a
	0.06-0.55	0.28-3.49	0.05-0.97	0.02-0.54	0-0.33	0.01-0.45	0-3.49	
Turbidity (NTU)	4.63 ± 3.93	245.27 ± 305.60	29.60 ± 25.28	1.58 ± 0.88	37.02 ± 33.92	1.64 ± 1.18	32.28 ± 19.84	n.a
	0.77-8.62	3.77–588.85	8.33-57.55	0.79-2.525	12.9–75.81	0.93-3.005	11.04–50.32	
Chlorophyll a (µg L¹)	58.01 ± 70.13	176.13 ± 237.86	250.81 ± 120.79	31.97 ± 39.72	265.47 ± 172.92	19.83 ± 16.23	422.61 ± 575.75	n.a
	0-208.23	1.78–672.27	109.72–373.9	5.924–115.2	10.367–441.41	0-46.346	1.481–1408.9	

Note. Values represent mean ± standard deviation & Min-Max. *Department of Water Affairs & Forestry (DWAF, 1996). **Food and Agriculture Organization (FAO) guidelines of 1985 (Ayers & Westcot, 1985).

Fable 3. Summary Statistics of Metals in Irrigation Water Samples.

METAL (MG/L)	Ξ	H2	Н3	H4	18 1	R2	R3	FAO/WHO (2007)	DWAF (1996)
В	0.043 ± 0.006	0.044 ± 0.006	0.042 ± 0.007	0.043 ± 0.006	0.049 ± 0.020	0.050 ± 0.019	0.049 ± 0.017	0.7	0.5–6.0
Ι	0.108 ± 0.168	0.332 ± 0.359	0.420 ± 0.592	0.442 ± 0.600	0.581 ± 0.948	0.455 ± 0.479	0.224 ± 0.209	5.0	5–20
Č	0.001 ± 0.002	0.003 ± 0.003	0.004 ± 0.007	0.001 ± 0.001	0.003 ± 0.005	0.001 ± 0.001	0.002 ± 0.001	n. a	0.1–1.0
Mn	0.492 ± 0.430	0.139 ± 0.053	0.518 ± 0.435	0.173 ± 0.103	0.393 ± 0.233	0.235 ± 0.127	0.075 ± 0.028	0.2	0.02–10
В	0.151 ± 0.183	0.068 ± 0.054	0.252 ± 0.443	0.131 ± 0.099	0.359 ± 0.575	0.099 ± 0.756	0.108 ± 0.064	n. a	5–20
Ē	0.004 ± 0.002	0.005 ± 0.001	0.005 ± 0.003	0.007±0.006	0.005±0.002	0.005±0.001	0.004±0.002	0.2	0.2–2.0
Cu	0.003 ± 0.004	0.004 ± 0.003	0.006 ± 0.005	0.006 ± 0.005	0.005 ± 0.006	0.006 ± 0.004	0.002 ± 0.001	0.2	0.2–0.5
Zn	0.076 ± 0.032	0.063 ± 0.035	0.049 ± 0.031	0.048 ± 0.020	0.143 ± 0.095	0.067 ± 0.039	0.042 ± 0.045	2.0	1.0–5.0
As	0.001 ± 0.000	0.002 ± 0.000	0.001 ± 0.000	0.002 ± 0.003	0.002 ± 0.001	0.002 ± 0.001	0.001 ± 0.000	0.1	0.1–2.0
Pb	0.017 ± 0.035	0.001 ± 0.002	0.003 ± 0.005	0.003 ± 0.004	0.002 ± 0.003	0.001 ± 0.002	0.001 ± 0.003	5.0	0.2–2.0

1996). The mean TDS and EC levels recorded, exceeded the South African guidelines for irrigation waters (see Table 2) in all six sampling points, with higher TDS and EC levels observed at the Hartbeespoort Dam sampling site compared to the Roodeplaat Dam site. These high TDS and EC levels indicate the presence of salts such as chloride, calcium, potassium, nitrate, bicarbonate, carbonate, and magnesium at high concentrations in the irrigation water which might have implications on the quality and health of the irrigated produce. High levels of salts may result in soil sodicity (DWAF, 1996; Edokpayi et al., 2014) and may reduce water available for plant uptake even in wet soils (Mezgebe et al., 2015).

Temperature. The mean water temperature across the sampled points ranged from 18.88 ± 4.14 to 22.95 ± 7.08 °C. A pattern of low-temperature levels in the winter (June), moderate in spring (September), and high in summer (February) was observed over the sampling period in both sites and this was obviously due to the seasonal temperature variations. Findings from previous studies show that temperatures above 20 °C (O'Neil et al., 2012) or 23 °C (Conradie & Barnard, 2012) favor harmful cyanobacterial blooms in the water. In another study, X. Wang et al. (2016) reported a direct proportion between temperature and *Microcystis* biomass in the water column. The water temperature in the two study sites can thus be said to be ideal for the growth of cyanobacterial blooms. There are no set thresholds/guidelines for water temperature in water intended for irrigation.

Turbidity. The mean levels of turbidity in the water ranged between 1.64 ± 1.18 to 245.27 ± 305.60 NTU. Turbidity levels were generally higher at the Roodeplaat Dam site compared to the Hartbeespoort Dam site. Turbidity levels were also higher in the summer sampling compared to the other three seasons and this could be due to the presence of silt, suspended algae, clay, micro-algae, and fine organic matter suspended in the irrigation canals due to run-off as a result of the rains during that time of the year. There are no guideline standards for turbidity in South Africa for water intended for irrigation.

Nutrients and Chlorophyll a. The mean levels of total nitrates in the irrigation water from the two dams ranged from 3.18 ± 2.92 to 12.34 ± 10.85 mg L⁻¹, with the highest nitrate levels having been reported at point H2 in February (2020). Nitrate levels were generally higher at the Hartbeespoort site compared to the Roodeplaat site and two sampling points from the Hartbeespoort site had reported mean nitrate levels above the 5 mg L⁻¹ threshold for irrigation waters (DWAF, 1996) and FAO (Ayers & Westcot, 1985).

The mean dissolved orthophosphate levels ranged between 0.45 ± 0.31 and 1.01 ± 0.55 mg L^{-1} , with all the sampling points falling within the recommended FAO (Ayers & Westcot, 1985) guideline of 0 to 2 mg L^{-1} for irrigation water. Phosphate

levels between 0.025 and 0.25 mg L^{-1} in a water body tend to support HABs and such levels of phosphates in a water body imply the water body is eutrophic (Balcıoğlu, 2019). Phosphate levels above 0.025 to 0.25 mg L^{-1} were reported in all the sampled sites throughout the monitoring period (Table 2).

Chlorophyll a was monitored to determine the trophic state and phytoplankton biomass. The mean chlorophyll a ranged between 19.83 ± 16.23 and $422.61 \pm 575.75 \,\mu\mathrm{g} \, \mathrm{L}^{-1}$. Generally, chlorophyll a was higher at the Roodeplaat Dam sampling site compared to the Hartbeespoort Dam site. Six of the seven sampling points (except for H3) were above the $30 \,\mu\mathrm{g} \, \mathrm{L}^{-1}$ of chlorophyll a, thus within the hypereutrophic state (Kansas Department of Health and Environment [KDHE, 2011]). Chlorophyll a is normally used to represent the algal biomass of a water body (Ramaraj et al., 2013). Like many other countries, South Africa does not have any limits for cyanobacteria and cyanotoxins in irrigation water or water for agricultural purposes (Pindihama & Gitari, 2020).

Microcystins. The mean total MC levels in the irrigation water samples ranged from 0.21 ± 0.12 to 6.04 ± 5.90 , with higher levels of MCs in Roodeplaat Dam water compared to the Hartbeespoort Dam water. The concentrations were well below the MC levels previously reported in other studies 580 µg L⁻¹ and a maximum level of 14,400 µg L⁻¹, such as Van Ginkel (2004) and Conradie and Barnard (2012). Median concentrations as high as $580 \,\mu g$ L⁻¹ and high reaching $14,400 \,\mu g$ L⁻¹ have been previously reported for the same dams (Van Ginkel, 2004; Turton, 2015). The huge drop in levels of MCs reported in the current study compared to the previous studies can be attributed to the huge efforts and measures that have been put in place by authorities to clean up the two dams and reduce the levels of nutrients reaching them. Despite much lower concentrations of MCs being reported in this study, there are no guidelines for these toxins in irrigation water in South Africa, but there could be an inherent risk when such water is used for irrigation purposes since these toxins can be bio-accumulated by plants.

Anionic Surfactants. Table 2 shows the levels of anionic surfactants recorded in the monitored sites. The mean levels of anionic surfactants in the monitored sites ranged from 0.16 ± 0.17 to $1.03\pm1.52\,\mathrm{mg}$ L⁻¹. Many countries in the world, including South Africa, do not have regulations for anionic surfactants in aquatic ecosystems and agricultural waters. Anionic surfactants in surface waters typically range between 0.001 and $20\,\mathrm{mg}$ L⁻¹ (Wang et al., 2015). The levels of anionic surfactants reported in this study were within this range during the sampling period. Even though the levels we reported in this study were relatively low, levels as low as 0.02 to $1.0\,\mathrm{mg}$ L⁻¹ have been reported to significantly impact aquatic organisms since these compounds are known to alter cell membranes and promote the uptake of other contaminants.

Metals. The levels of metals in the irrigation water were monitored to evaluate the metals of importance in these highly disturbed aquatic environments and determine metallic elements of importance to study and monitor. The levels of metal species observed in the irrigation water in Table 3 were all within the acceptable limit set by DWAF (1996) and the Food and Agriculture Organization of the United Nations (FAO) and the World Health Organization (WHO) (FAO/WHO), (2007) in Chiroma and Ebewele (2014) for water meant for irrigation purposes.

Compositional Relation

Correlation matrices generated by PCA are and helpful in preliminary data reduction of parameters. Getting rid of variables assists with reducing costs for sampling collection and analysis, minimizing time and equipment required, and also excluding some redundant factors that may result in over-emphasis of the findings. Table 4 acknowledges the interactions and correlations between the monitored parameters (values marked with asteriks).

Principal Components

The results of principal components analysis for water samples are summarized in Tables 5 and 6 and Figure 3. The PCA monitored the physical and chemical parameters to help characterize the patterns and groups formed. The analyzed matrix consists of 20 principal components (PCs) representing the 20 physicochemical parameters monitored at seven different sampling points (two different sites: Hartbeespoort and Roodeplaat sites) over the four sampling events of the study. Table 5 shows that much of the total variance is explained by the first 3 PCs, PC1 (23.80%), PC2 (18.62%), and PC3 (14.80%), which account for 57.22% of the total variance.

The first principal component, as given in Table 5 and Figure 3a, has a variance (eigenvalue) of 4.761 is contributed by TDS, EC, phosphates, B, Al, Ni, Cu, Zn, and Pb, and only phosphates contributed more than 0.5. The second PC, PC2, has an eigenvalue of 3.723 and is mainly contributed by metals Pb, B, Al, Cu, and Ni. Other contributors to PC2 are pH, phosphates, MCs, anionic surfactants, and Turbidity. The bi-plots (Figure 3bi and bii) show that sampling points from the same dam site are located close to each other, indicating they have similar principal component scores. The bi-plots (Figure 3b) differentiate the two sampling sites with respect to the physicochemical characteristics. More specifically, sampling points from the Roodeplaat Dam site have relatively lower PC1 scores and somewhat higher PC2 scores.

The positive side of PC1 coordinates largely represents the Hartbeespoort sampling site characterized by high loadings of TDS, EC, and metals such as Pb, Cu, Al, and Ni. The negative side of the PC1 isolates largely the Roodeplaat site and is mainly characterized by high PC scores of pH, MCs, anionic surfactants, and turbidity.

Table 4. Spearman Correlation Matrix of the Parameters Monitored.

PARAMETER	Æ	TDS	EC	TEMP	NO ₃ .	PO ₄ 3-	TURBIDITY	CHLOROPHYLL-A	MCS	SURFACTANTS	В	AL	CR	N	H	Z	CU	NZ	AS
TDS	.091																		
EC	329*	.176																	
Temp	.116	.148	322*																
NO ₃ -	.170	.115	152	.274*															
PO ₄ 3-	033	033	.137	267*	.080														
Turbidity	.336*	083	237	.444**	.203	198													
Chlo-a	.280*	.002	010	.118	.044	157	.127												
MCs	080	070	068	.183	.036	.001	018	.020											
Surfactants	.027	216	182	.308*	061	216	.661**	.547**	058										
В	237	.112	.232	267*	292*	260	385*	086	028	190									
Al	.164	293*	164	053	.033	081	.365*	164	048	.193	355**								
ŏ	0.070	.037	.264*	156	021	026	.785**	058	040	.271*	.031	.311*							
Mn	164	039	.026	287*	.253	117	.124	.072	089	017	690.	.181	.213						
Бе	064	.314*	.434**	079	.001	.186	.495**	117	019	.005	.044	.078	.433**	.173					
ïZ	000.	.042	039	180	038	225	.151	120	191	680.	.178	.336*	.560**	.229	.072				
Cu	125	121	.177	048	311*	.073	092	117	095	.004	.209	.119	.149	017	.191	.295*			
Zn	246	152	.122	154	250	300*	153	212	072	960.–	.338*	.182	.236	.218	.116	.387**	.348**		
As	067	095	620.	.040	128	.224	990.	067	060	.020	019	.029	.140	600	080	.296	.270*	.080	
Pb	065	.062	.315*	161	135	.365**	147	002	037	-0.022	680.	025	.249	.015	.420**	055	.185	.133	040
				;	17.	7 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1													

*Correlation is significant at the .05 level (2-tailed). **Correlation is significant at the .01 level (2-tailed).

Table 5. Total Variance of Water Samples Explained by The Principal Components.

COMPONENT	EIGENVALUE	PROPORTION OF VARIANCE	CUMULATIVE PROPORTION OF VARIANCE (%)
PC1	4.761	23.80%	23.80
PC2	3.723	18.62%	42.42
PC3	2.96	14.80%	57.22
PC4	1.593	7.97%	65.19
PC5	1.524	7.62%	72.81
PC6	1.366	6.83%	79.64
PC7	1.048	5.24%	84.88
PC8	0.647	3.24%	88.11
PC9	0.5888	2.94%	91.06
PC10	0.4723	2.36%	93.42
PC11	0.3421	1.71%	95.13
PC12	0.3251	1.63%	96.75
PC13	0.2376	1.19%	97.94
PC14	0.1311	0.66%	98.60
PC15	0.1044	0.52%	99.12
PC16	0.08219	0.41%	99.53
PC17	0.05938	0.30%	99.83
PC18	0.022	0.11%	99.94
PC19	0.01211	0.06%	100.00
PC20	0.0005	2.50E-05	100.00

When creating Water Quality Indices, one must choose parameters from the principal components created and selected. It is not the scope or intent of the current study to come up with a suitable Water Quality Index for the study areas or come up with variables of crucial importance but to suggest a few variables that can be representatives of the study area.

Based on the principal components reported here, selecting variables such as EC, TDS, and any one of the metals such as Pb, Cu, Al, and Ni seems adequate to understand the pollution statutes of the irrigation water derived from the Hartbeespoort Dam. Future long-term monitoring and development of a Water Quality Index for irrigation water can thus be suggested. For the irrigation water derived from the Roodeplaat Dam, use variables such as pH and turbidity, which could be adequate. Even though variables such as MCs and anionic surfactants were found to closely correlate with these two, their complexity to measure and the resources required make them less desirable.

Similar to our findings, Lukhabi et al. (2023) reported that Water Quality Indices in an African context prioritize chemical parameters such as heavy metals, followed by physical parameters and nutrients. Lukhabi et al. (2023) reported con-

straints in resources such as human capital, finances, and infrastructure as reasons for choosing these parameters.

Previous studies have applied PCA for water quality assessments and reliably reduced the number of variables. Similar to our application in this study, Ou et al. (2017) used PCA to study three-year water quality data for monitoring stations in Florida and managed to reduce the number of stations from 22 to 19. In another study, Iticescu et al. (2019) used similar multivariate techniques to study the Danube region, one of the largest basins in the European Union. From the 18 physicochemical parameters they studied, Iticescu et al. (2019) used PCA to establish the correlation between the variables, reduce the number of variables, and establish seasonal gradients in the data. In another related study, Zavareh et al. (2021) found atmospheric temperature, turbidity, and water temperature as the critical variables to represent the stream water quality of the Virginia, Maryland (U.S.A) watersheds.

All these studies discussed here demonstrated the applicability of PCA in establishing associations among variables, predicting the potential sources of pollutants and reducing the number of variables/datasets. However, it is important to

Table 6. Correlation Matrix of Principal Component Analysis for Water Samples.

VARIABLE	PC1	PC2	PC3
рН	63323	.339563	25709
TDS	.384174	54621	.676306
EC	.396541	53937	.682772
Temp	72389	29808	.312453
Nitrates	104	58959	.255283
Phosphates	.673121	.305699	1089
MCs	70095	.287293	.080867
Turbidity	85584	.222924	.306966
Chlo-a	37742	27854	.0876
Anionic Surfactants	68658	.291508	.25956
Turbidity	85584	.222924	.306966
В	.285911	.632973	25952
Al	.338345	.619851	.57297
Cr	65637	.373146	.252825
Mn	16884	35071	23303
Fe	10377	30829	.578463
Ni	.222911	.456951	.480057
Cu	.370167	.606883	.544254
Zn	.370414	.005307	.227509
As	.066222	.04674	.444268
Pb	.379804	.698521	.186545

mention that the use of PCA and other Water Quality Indices as suggested here, is limited to:

- · region specificity,
- distortion in the event of extreme weather conditions such as excessive rains or temperatures,
- episodic events such as oil or other pollutant spills or excessive discharges and
- the existence of other emerging contaminants, such as pharmaceuticals, nanoparticles, etc., is not considered here.

Based on these findings, PCA was used to characterize the primary physicochemical data of this water catchment area and generate a set of new independent principal components. The PCA suggests that in these hyper-eutrophic and severely polluted water conditions, the monitoring of a few simple parameters such as TDS, EC, pH, and a few metals such as Pb, Cu, Al, Ni, and Cu can be adequate to understand the pollution status of the irrigation water being derived from these two dams.

Conclusion

The current study assessed the water quality of the irrigation water derived from the Hartbeespoort and Roodeplaat Dams. The two dams are found in the Crocodile (West) and Marico catchment which is renowned for its poor water quality and hyper-eutrophication levels. The irrigation water was found to exceed the permissible guidelines for parameters such as pH, EC, TDS, and nitrates. Other eutrophication-related parameters such as MC levels, chlorophyll a, and anionic surfactants were also found to be relatively high, even though there are no guidelines for these in irrigation water locally. The study also used principal component analysis (PCA) to evaluate these highly contaminated water bodies in a bid to come up with a few principal components and variables that can be monitored routinely but still represent all the other variables of concern in these waters. Using this statistical technique, the most representative variables for the Hartbeespoort Dam-derived waters were EC, TDS, and any of the metals such as Pb, Cu, Al, and Ni. For the Roodeplaat Dam water, variables such as pH and turbidity were deemed adequate. The use of such parameters can be applied to develop a custom-made Water Quality Index (WQI) that can be used to monitor and assess the human impact on the irrigation water derived from these two dams. The use of such a technique to assess the water quality of such anthropogenically polluted waters can be very essential, particularly in developing countries such as South Africa, where resources, equipment, and skilled manpower could be lacking. Such WQIs can be easy to carry out since they will not need the monitoring of variables such as MCs and anionic surfactants, which require sophisticated and costly assays/techniques. Such narrowing of the parameters required to assess water quality can prove to be resource-saving and accurate, but they hugely rely on the catchments being studied and the expertise of selecting the indicator variables/parameters.

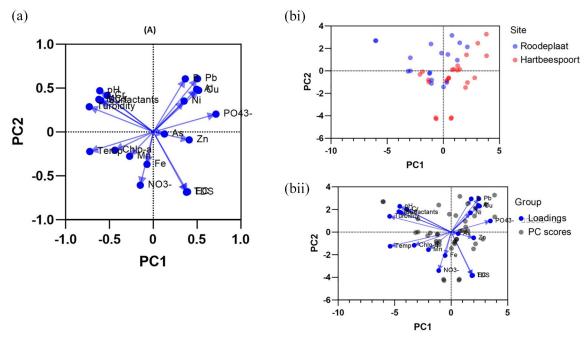


Figure 3. Result of the Principal Component Analysis (PCA) carried out on the physical and chemical variables monitored in water at the different sites throughout the study: (a) Loadings between variables and principal components PC1 and PC2; (bi & bii) Bi-plots showing the distribution of the sampling sites concerning their physical and chemical characteristics in the principal components plane PC1 X PC2.

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Author Contributions

GP: Conceptualization, Methodology, Data curation Roles/Writing—original draft; Writing—review & editing, Investigation; Methodology. SS: Conceptualization, Methodology, Data curation Roles/Writing—original draft; Writing—review & editing, Investigation; Methodology. WG: Conceptualization, Data curation Roles, Supervision; Funding acquisition; Investigation; Resources; Writing—review & editing. RM: Conceptualization, Data curation Roles, Supervision; Funding acquisition; Investigation; Resources; Writing—review & editing.

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Data Availability

All datasets used in this study are available upon reasonable request from the corresponding author.

REFERENCES

Ayers, R. S., & Westcot, D. W. (1985). Water quality for agricultura. FAO 29.
Balcioğlu, E. B. (2019). Seasonal changes of LAS, phosphate, and chlorophyll-a concentrations in coastal surface water of the Prince Islands, Marmara Sea. Marine Pollution Bulletin, 138(September 2018), 230–234. https://doi.org/10.1016/j.marpolbul.2018.11.027

Batayi, B., Okonkwo, J. O., Daso, P. A., & Rimayi, C. C. (2020). Poly- and perfluoroalkyl substances (PFASs) in sediment samples from Roodeplaat and Hartbeespoort Dams, South Africa. *Emerging Contaminants*, 6, 367–375. https://doi. org/10.1016/j.emcon.2020.09.001

Bensoltane, M. A., Zeghadnia, L., Bordji, N., Gagan, M., & Bouranen, S. (2021). Drinking water quality assessment using principal component analysis: Case study of the town of Souk Ahras, Algeria. Egyptian Journal of Chemistry, 64(6), 3069–3075. https://doi.org/10.21608/ejchem.2021.53654.3112

Chiroma, T. M., & Ebewele, O. R. (2014). Comparative assessement of heavy metal levels in soil, vegetables and urban grey waste water used for irrigation In Yola And Kano. *International Refereed Journal of Engineering and Science*, 3(2), 1–09. www.irjes.com

Conradie, K. R., & Barnard, S. (2012). The dynamics of toxic Microcystis strains and microcystin production in two hypertrofic South African reservoirs. *Harmful Algae*, 20(December), 1–10. https://doi.org/10.1016/j.hal.2012.03.006

Dalu, T., & Froneman, P. W. (2016). Diatom-based water quality monitoring in southern Africa: Challenges and future prospects. Water \mathcal{SA} , 42(4), 551–559. https://doi.org/10.4314/wsa.v42i4.05

- du Plessis, A. (2017). Primary Water Quality Challenges for South Africa and the Upper Vaal WMA. In: Freshwater Challenges of South Africa and its Upper Vaal River. Springer Water. Springer, Cham. https://doi.org/10.1007/978-3 -319-49502-6 6
- DWAF. (1996). Water quality guidelines volume 4 agricultural use: Irrigation department of water affairs and forestry. 4. Pretoria, South Africa: Department of Water Affairs and Forestry. http://www.dwa.gov.za/IWQS/wq_guide/edited/Pol_saWQ guideFRESHIrrigationvol4.pdf
- Edokpayi, J. N., Odiyo, J. O., & Olasoji, S. O. (2014). Assessment of heavy metal contamination of Dzindi River, in Limpopo province, South Africa. *International Journal of Natural Sciences Research*, 2(10), 185–194. http://pakinsight.com/?ic=journal&journal=63
- Ge, S., Qiao, X., Zhao, X., Li, X., & Liu, Y. (2021). Microcystin in source water: Pollution characteristics and human health risk assessment. RSC Advances, 11(11), 6415–6422. https://doi.org/10.1039/d0ra08983d
- Griffin, N. J., Palmer, C. G., & Scherman, P.-A. (2014). critical analysis of environmental water quality in south africa: Historic and current trends report to the water research commission. Water Res. Comm, 1(5). (Issue 2184).
- Hopkinson, S., & Harris, M. (2019). Effect of pH on hydroponically grown bush beans (phaseolus vulgaris). *International Journal of Environment, Agriculture and Biotechnology*, 4(1), 142–145. https://doi.org/10.22161/ijeab/4.1.23
- Isiuku, B. O., & Enyoh, C. E. (2020). Pollution and health risks assessment of nitrate and phosphate concentrations in water bodies in South Eastern, Nigeria. Environmental Advances, 2(August), 100018. https://doi.org/10.1016/j.envadv.2020 .100018
- Iticescu, C., Georgescu, L. P., Murariu, G., Topa, C., Timofti, M., Pintilie, V., & Arseni, M. (2019). Lower danube water quality quantified through WQI and multivariate analysis. Water (Switzerland), 11(6), 1305. https://doi.org/10.3390/w11061305
- Kansas Department of Health and Environment (KDHE). (2011). Chlorophyll A criteria for public water supply lakes or reservoirs. Bureau of Water, KDHE, Topeka, Kan.
- Kruger, A., Pieters, R., Horn, S., Zijl, C. Van, & Aneck, N. (2022). The role of effect—based methods to address water quality monitoring in South Africa: A developing countrys' struggle. *Environmental Science and Pollution Research*, 29(56), 84049–84055. https://doi.org/10.1007/s11356-022-23534-3
- Lawton, L., Marsalek, B., Padisák, J., & Ingrid, C. (1999). Chapter 12. Determination of cyanobacteria in. *Toxic cyanobacteria in water: A guide to their public health consequences, monitoring and management.* Taylor & Francis.
- Lukhabi, D. K., Mensah, P. K., Asare, N. K., Pulumuka-Kamanga, T., & Ouma, K. O. (2023). Adapted water quality indices: Limitations and potential for water quality monitoring in Africa. Water, 15(9), 1–30. https://doi.org/10.3390/w15091736
- Marchand, M. J., van Dyk, J. C., Barnhoorn, I. E. J., & Wagenaar, G. M. (2012). Histopathological changes in two potential indicator fish species from a hypereutrophic freshwater ecosystem in South Africa: A baseline study. *African Journal of Aquatic Science*, 37(1), 39–48. https://doi.org/10.2989/16085914.2011.636902
- Matthews, M. W., & Bernard, S. (2015). Eutrophication and cyanobacteria in South Africa's standing water bodies: A view from space. South African Journal of Science, 111(5–6), 1–8. https://doi.org/10.17159/sajs.2015/20140193
- Mbiza, N. X. (2014). Investigation of the effectiveness of techniques deployed in controlling cyanobacterial growth in Rietvlei Dam, Roodeplaat dam and hartbeespoort dam in crocodile (West) and marico water management area. [MSc (Environmental Management) Dissertation]. February, 1–85.
- Mezgebe, K., Gebrekidan, A., Hadera, A., & Weldegebriel, Y. (2015). Assessment of physico-chemical parameters of Tsaeda Agam River in Mekelle City, Tigray, Ethiopia. *Bulletin of the Chemical Society of Ethiopia*, 29(3), 377–385. https://doi.org/10.4314/bcse.v29i3.5
- Nde, S. C., & Mathuthu, M. (2018). Assessment of potentially toxic elements as nonpoint sources of contamination in the upper crocodile catchment area,

- north-west province, South Africa. International Journal of Environmental Research and Public Health, 15(4), 576. https://doi.org/10.3390/ijerph15040576
- O'Neil, J. M., Davis, T. W., Burford, M. A., & Gobler, C. J. (2012). The rise of harmful cyanobacteria blooms: The potential roles of eutrophication and climate change. *Harmful Algae*, 14, 313–334. https://doi.org/10.1016/j.hal.2011 .10.027
- Ou, M., Liang, S., Zhang, R., & Xiong, Q. (2017, December). Evaluation of water quality for the Beilun Gulf and Zhenzhu Bay by principal component analysis. In 2017 International Conference on Advanced Mechatronic Systems (ICAMechS) (pp. 324–328). IEEE. https://doi.org/10.1109/ICAMechS.2017.8316492
- Padedda, B. M., Sechi, N., Lai, G. G., Mariani, M. A., Pulina, S., Sarria, M., Satta, C. T., Virdis, T., Buscarinu, P., & Lugliè, A. (2017). Consequences of eutrophication in the management of water resources in Mediterranean reservoirs: A case study of Lake Cedrino (Sardinia, Italy). Global Ecology and Conservation, 12, 21–35. https://doi.org/10.1016/j.gecco.2017.08.004
- Pindihama, G. K., & Gitari, M. W. (2020). Cyanobacterial toxins: An emerging threat in South African irrigation water. Water and Environment Journal, 34(3), 506– 516. https://doi.org/10.1111/wej.12473
- Pindihama, G. K., & Gitari, M. W. (2023). The effect of the linear alkylbenzene sulfonate, sodium-dodecyl-sulfonate (SDS), on the bioaccumulation of Al, Sr and Mn by Brassica oleracea and Solanum tuberosum. *Water SA*, 49(3), 282–290.
- Ramaraj, R., Tsai, D. D. W., & Chen, P. H. (2013). Chlorophyll is not accurate measurement for Algal Biomass. Chiang Mai Journal of Science, 40(4), 547–555.
- Roux, S., Oelofse, S., & Lange, W. J. (2010). Can SA afford to continue polluting its water resources? With special reference to water pollution in two important catchment areas. Science real and relevant conference, 1–13. Can SA afford to continue polluting its water resources? With special reference to water pollution in two important catchment areas (csir.co.za)
- Teixeira de Souza, A., Carneiro, L. A. T. X., da Silva Junior, O. P., de Carvalho, S. L., & Américo-Pinheiro, J. H. P. (2021). Assessment of water quality using principal component analysis: A case study of the Marrecas stream basin in Brazil. *Environmental Technology (United Kingdom)*, 42(27), 4286–4295. https://doi.org/10.1080/09593330.2020.1754922
- The Food and Agriculture Organization of the United Nations (FAO) and the World Health Organization (WHO) (FAO/WHO) (2007). FAO/WHO framework for the provision of scientific advice on food safety and nutrition. Food Safety and Nutrition Food Quality, Standards Service, Agriculture Organization of the United Nations. Plant Production, Protection Division, World Health Organization. Food Safety Dept. Zoonoses, Foodborne Diseases, & World Health Organization. Microsoft Word FinalEnglishFramework.doc (fao.org)
- Turton, A. (2015). Sitting on the Horns of a Dilemma: Water as a Strategic Resource in South Africa. @Liberty, 22, 1–28. liberty-2013-sitting-on-the-horns-of-a-dilemma-2013-water-as-a-strategic-resource-in-south-africa (irr.org.za)
- Van Ginkel, C. E. (2004). A National Survey of the Incidence of Cyanobacterial Blooms and Toxin Production in Major Impoundments. Directorate: Resource Quality Services Department of Water Affairs and Forestry, April, 54. Rapport South Africa.
- Wang, X., Liu, W., Xin, C., Zheng, Y., Cheng, Y., Sun, S., Li, R., Zhu, X. G., Dai, S. Y., Rentzepis, P. M., & Yuan, J. S. (2016). Enhanced limonene production in cyanobacteria reveals photosynthesis limitations. *Proceedings of the National Academy of Sciences of the United States of America*, 113(50), 14225–14230. https://doi.org/10.1073/pnas.1613340113
- Wang, Z., Zhang, J., Song, L., Li, E., Wang, X., & Xiao, B. (2015). Effects of linear alkylbenzene sulfonate on the growth and toxin production of Microcystis aeruginosa isolated from Lake Dianchi. *Environmental Science and Pollution Research*, 22(7), 5491–5499. https://doi.org/10.1007/s11356-014-3784-9
- Zavareh, M., Maggioni, V., & Sokolov, V. (2021). Investigating water quality data using principal component analysis and granger causality. *Water*, 13(3), 343.