





## Article

# Hydrogeochemistry of Surface Waters in the Iron Quadrangle, Brazil: High-Resolution Mapping of Potentially Toxic Elements in the Velhas and Paraopeba River Basins

Raphael Vicq <sup>1,\*</sup> , Mariangela G. P. Leite <sup>2</sup> , Lucas P. Leão <sup>2</sup> , Hermínio A. Nalini Júnior <sup>2</sup>,  
Darllan Collins da Cunha e Silva <sup>3</sup> , Rita Fonseca <sup>4</sup>  and Teresa Valente <sup>1,\*</sup> 

<sup>1</sup> Earth Science Institute, Pole of the University of Minho, Campus Gualtar, 4710-057 Braga, Portugal

<sup>2</sup> Department of Geology, Federal University of Ouro Preto, Morro do Cruzeiro Campus, Ouro Preto 35400-000, MG, Brazil; mgpleite@gmail.com (M.G.P.L.); lucas.leao@ufop.edu.br (L.P.L.); nalini@ufop.edu.br (H.A.N.J.)

<sup>3</sup> Institute of Science and Technology, São Paulo State University (UNESP), Campus Avenida Três de Março, Sorocaba 18087-180, SP, Brazil; darllan.collins@unesp.br

<sup>4</sup> Earth Science Institute, University of Évora, Largo Dos Colegiais 2, 7004-516 Évora, Portugal; rfoneca@uevora.pt

\* Correspondence: raphaelcosta@dct.uminho.pt (R.V.); teresav@dct.uminho.pt (T.V.)

## Abstract

This study delivers a pioneering, high-resolution hydrogeochemical assessment of surface waters in the Upper Velhas and Upper Paraopeba river basins within Brazil's Iron Quadrangle—an area of critical socioeconomic importance marked by intensive mining and urbanization. Through a dense sampling network of 315 surface water points (one every 23 km<sup>2</sup>), the research generates an unprecedented spatial dataset, enabling the identification of contamination hotspots and the differentiation between lithogenic and anthropogenic sources of potentially toxic elements (PTEs). Statistical methods, including exploratory data analysis and cluster analysis, were applied to determine background and anomalous concentrations of potentially toxic elements (PTEs). Geospatial distribution maps were generated using GIS. The results revealed widespread contamination by As, Cd, Cr, Ni, Pb, and Zn, with many samples exceeding Brazilian, European, and global drinking water standards. Arsenic and cadmium anomalies in rural and peri-urban communities raise concerns due to the direct consumption of contaminated water. The innovative application of dense spatial sampling and integrated geo-statistical methods offers new insights into the pathways and sources of PTE pollution, identifying specific lithological units (e.g., gold schists, mafic intrusions) and land uses (e.g., urban effluents, mining sites) associated with elevated contaminant levels. By establishing robust regional geochemical baselines and source attributions, this study sets a new standard for environmental monitoring in mining-impacted watersheds and provides a replicable framework for water governance, environmental licensing, and risk management in similar regions worldwide.

**Keywords:** high-density geochemical mapping; reference values; mining contamination; Brazil



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## 1. Introduction

The contamination of surface waters by potentially toxic elements (PTEs) is a growing global concern in recent decades, as increasing human activity places mounting pressure on freshwater systems, driven by the ability of these elements to bioaccumulate in aquatic ecosystems and pose long-term risks to environmental and human health [1]. These

contaminants can originate from a range of sources, including atmospheric deposition, natural geological weathering, and the discharge of untreated agricultural, industrial, and domestic effluents [2–4].

Exposure to PTEs has been linked to a wide array of health issues, including neurodegenerative disorders, cognitive impairment, hypertension, cancer, and even mortality [5,6]. Once introduced into aquatic environments, these elements can migrate into other environmental compartments such as soils, sediments, and biological tissues, ultimately entering the food chain and intensifying the risks to ecosystems and public health [3,7].

This issue is further exacerbated by rapid urbanization, demographic growth, agricultural expansion, and industrial development, which have contributed to the degradation and contamination of surface water resources worldwide [8–10]. These trends are particularly critical in developing countries, where land-use change and environmental degradation often outpace regulatory capacity and monitoring infrastructure [4,5,11].

Among the anthropogenic activities most strongly associated with surface water contamination, mining remains a significant and widespread contributor to elevated levels of heavy metals in aquatic systems [3,12–16]. Numerous studies worldwide have reported severe degradation in river basins affected by mining, including increased PTE concentrations, ecological imbalances, and health risks to local populations [16–21].

In Brazil, the Iron Quadrangle (IQ), located in the state of Minas Gerais, represents a region of strategic economic importance due to its mineral wealth and long-standing history of mining and steelmaking. Within this context, the Upper das Velhas and Upper Paraopeba river basins are particularly vulnerable, as they encompass densely populated areas, critical water supply sources, and regions heavily impacted by extractive activities. These basins have been extensively studied in the past two decades due to their diverse lithology and long-standing mining legacy [14–16,20–29].

However, many of these studies are limited by low spatial sampling density, restricted spatial coverage, or a lack of integration between geochemical, statistical, and spatial analysis.

To address these gaps, this study applies an innovative, high-density geochemical mapping strategy, involving the collection of 315 surface water samples from two major river basins within Brazil's Iron Quadrangle—achieving an unprecedented spatial resolution of one sample per 23 km<sup>2</sup>. The dataset is analyzed using multivariate statistical techniques and integrated with GIS-based spatial modeling to produce a comprehensive assessment of water quality across the region.

The primary goals of this research are to identify the most prevalent potentially toxic elements (PTEs) in the surface waters of the Upper das Velhas and Upper Paraopeba river basins, determine the main sources of contamination—whether predominantly geogenic or linked to human activities such as mining and urbanization—and to locate the areas that pose the highest environmental and public health risks. By addressing these key questions, the study aims to generate scientifically robust data that can support effective environmental monitoring, guide informed decision-making, and contribute to the sustainable management of water resources in one of Brazil's most environmentally sensitive and economically strategic mining regions.

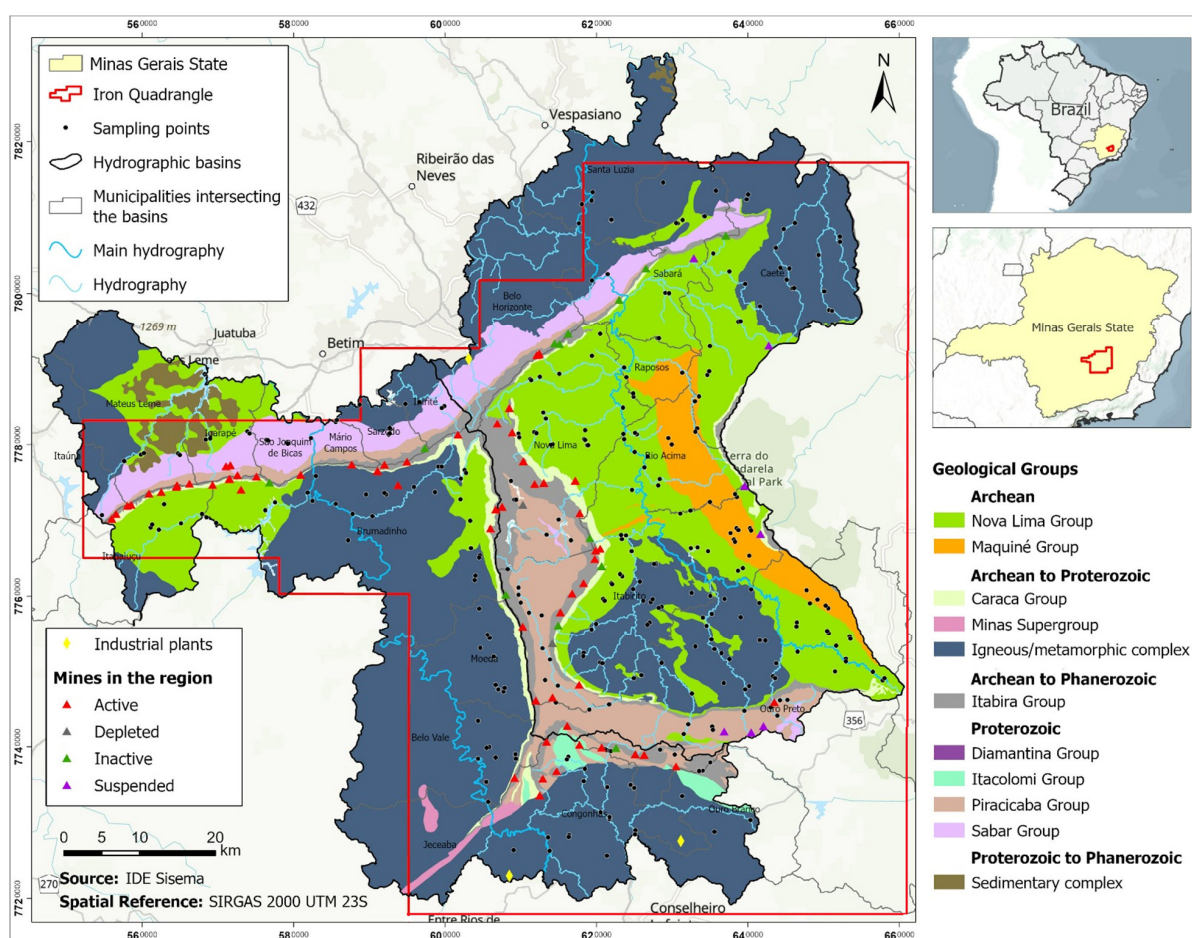
## 2. Study Area

The Upper Rio das Velhas and Upper Paraopeba basins, situated in Minas Gerais, southeastern Brazil, are part of the São Francisco River system. These basins hold significant strategic value, both environmentally and economically, as they encompass a high concentration of industrial and mining activities. Additionally, they are essential for supplying water to the Metropolitan Region of Belo Horizonte (MRBH), which is home to

more than 5.8 million people, making it the third-largest urban center in Brazil and the 52nd largest worldwide [30].

The Upper Rio das Velhas basin is located within the Iron Quadrangle (IQ), a region of historical and economic importance spanning roughly 3200 km<sup>2</sup>. Since the 17th century, during the early settlement of Minas Gerais, the area has undergone extensive urban development and mineral exploitation [31,32]. Its economy is strongly driven by mining—particularly of iron, gold, limestone, dolomite, bauxite, manganese, and topaz—alongside metallurgy, steel manufacturing, agriculture, and tourism [33].

The watershed is geographically bordered by Belo Horizonte to the north, Ouro Preto to the south-southeast, the Serra da Moeda to the west, and the Serra da Piedade to the east (Figure 1). The Rio das Velhas and its tributaries flow through a mosaic of land uses, from forested areas to densely urbanized zones and heavily mined landscapes. Mining activities—particularly for iron and gold—have significantly impacted water quality throughout the basin, with numerous studies reporting extensive contamination [14,15,21,24,26,29].



**Figure 1.** Simplified geological map of the Upper Velhas River and Paraopeba basin showing the location of sampling points.

The Upper Paraopeba basin covers roughly 4120 km<sup>2</sup> [34] and is home to over 1.3 million people [35], distributed among major municipalities such as Conselheiro Lafaiete, Congonhas, Ouro Branco, Jeceaba, Moeda, Brumadinho, Belo Vale, Sarzedo, and Belo Horizonte. It supplies approximately 53% of the water consumed in the MRBH [35]. Part of the basin lies within the Iron Quadrangle (IQ), an area of intense industrial activity, particularly steel production and mining of high-grade iron ore, construction materials (including sand and clay), and ornamental stones such as slate [35]. The Paraopeba River

basin gained international attention after the 2019 Brumadinho tailings dam disaster, which caused severe environmental impacts [16].

The Upper Velhas and Upper Paraopeba basins are underlain by a similar geological framework, with the Moeda Ridge forming a key topographic and hydrological boundary between them. This prominent ridge, oriented north to south, consists primarily of ancient gneissic and granitoid rocks belonging to the Archean Bonfim Complex [36]. The broader region features a complex stratigraphy divided into five principal lithostratigraphic units, detailed in the following sections and depicted in Figure 1.

These units, listed from oldest to youngest, are as follows:

- (i) Metamorphic Complexes are units that form the Precambrian crystalline basement and are characterized by deformed tonalitic gneisses, granites, granodiorites, and mafic to ultramafic intrusions [37,38]. These rocks belong to the Bonfim, Belo Horizonte, and Divinópolis complexes (Upper Paraopeba basin), as well as the Bação, Caeté, and Santa Bárbara complexes (Upper Rio das Velhas basin) [39].
- (ii) The Rio das Velhas Supergroup, composed of metavolcanic and metasedimentary sequences, is divided into the Nova Lima and Maquiné groups. The Nova Lima Group is predominantly composed of volcano-sedimentary rocks such as carbonaceous schists, banded iron formations (BIFs), phyllites, and metacherts. The overlying Maquiné Group begins with metaconglomerates and transitions into thick beds of sericitic quartzites, phyllites, and quartz-rich schists. These formations mark an early Paleoproterozoic stage in the geological evolution of the region [36].
- (iii) The Minas Supergroup, which lies unconformably over the Rio das Velhas Supergroup, comprises predominantly pelitic and quartz-rich metasediments organized into four lithostratigraphic groups [40]. The basal Caraça Group consists of metaconglomerates and metarenites deposited in fluvial to shallow marine settings. It is overlain by the Itabira Group, dominated by chemical sedimentary rocks and iron-rich itabirites. Next is the Piracicaba Group, composed mainly of metapelites and interbedded chemical layers. The sequence concludes with the Sabará Group, consisting of terrigenous sediments including basal conglomeratic phyllites, possibly deposited during tectonically active stages of basin evolution [40].
- (iv) The Itacolomi Group, composed of quartzites and metaconglomerates, was deposited in fluvial-deltaic to shallow marine environments and marks a transitional Paleoproterozoic phase [40,41].
- (v) Tertiary and Quaternary deposits, comprising unconsolidated sediments associated with modern fluvial systems and weathering processes, represent ongoing sedimentation since the Cenozoic [40,41].

### 3. Materials and Methods

#### 3.1. Sampling

To achieve a high sampling density, water samples were collected at the mouths of third-order drainage basins [42,43], as defined using ArcGIS 10.8 software. The selection process was carried out by overlaying topographic, hypsometric, and hydrographic maps at a 1:25,000 scale provided by the Institute of Water Management and the Geological Survey of Brazil. This approach led to the collection of 315 surface water samples in both basins, providing a sampling density of 1 sample per 23 km<sup>2</sup> (Figure 1). Due to the high sample volume, samples were collected only once throughout the study.

Water samples were collected, filtered using a cellulose acetate membrane (Millipore, 0.45 µm, Darmstadt, Germany), and acidified with three drops of nitric acid. The collected samples were preserved and transported to the laboratory within a few hours, stored at 4 °C until analysis [44]. To complement the field data, in situ measurements were taken at



each sampling point for pH, electrical conductivity (EC- $\mu\text{S cm}^{-1}$ ), total dissolved solids (TDS- $\text{mg kg}^{-1}$ ), and oxidation-reduction potential (ORP-mV), using a multiparameter probe (Ultrameter II, Myron L Company, Carlsbad, CA, USA).

### 3.2. Chemical Analyses and Quality Control

Water samples were analyzed for Al, As, Ca, Cd, Cr, Cu, Fe, K, Mg, Mn, Na, Ni, Pb, Ti, and Zn using inductively coupled plasma atomic emission spectrometry (ICP-AES; Spectro Ciros CCD). All analyses were performed at the Geochemistry Laboratory of the Federal University of Ouro Preto. Detection limits for each element are provided in Table 1. To ensure data accuracy, the concentration of each analyzed element was determined as the average of two measurements. Quality assurance procedures included the preparation of a blank every 10 samples and the duplicate analysis of 10% of the total sample set. Method accuracy was validated using certified reference material (NIST SRM 1643e—Trace Elements in Water), with measured concentrations showing recovery rates always between 86.8 and 105.7%, as presented in Table 2.

**Table 1.** Detection limits for major, minor, and trace elements determined by ICP-AES.

Elem	Detection Limit for Water ( $\mu\text{g}\cdot\text{L}^{-1}$ )	Elem	Detection Limit for Water ( $\mu\text{g}\cdot\text{L}^{-1}$ )
Al	7.3	K	0.00007
As	57.7	Mg	0.0004
Ca	0.0002	Mn	1.2
Cd	6.2	Ni	20
Cr	5.3	Pb	7.2
Cu	3.5	Ti	3.9
Fe	5.6	Zn	3.5

**Table 2.** Results for certified reference material (NIST SRM 1643e, trace elements in water, 50 mL).

Element	Certified ( $\mu\text{g/L}$ )	Found ( $\mu\text{g/L}$ )	Recovery (%)
Al	141.8	123.1	86.8
As	60.5	63.9	105.7
Ca	32.3	28.6	88.6
Cd	6.6	6.8	103.0
Cr	20.4	20.0	97.8
Cu	22.8	21.4	94.2
Fe	98.1	91.2	93.0
K	2.0	2.1	102.3
Mg	8.0	7.4	91.9
Mn	39.0	35.9	92.1
Na	20.7	18.7	90.0
Ni	62.4	57.8	92.6
Pb	19.6	18.8	95.6
Zn	78.5	75.7	96.4

### 3.3. Data Analysis

The entire dataset of water chemical analyses was subjected to exploratory data analysis using Minitab 18 software, and boxplot graphs were generated. To differentiate between normal concentrations and anomalies, the quartile separation method (Q1, Q2, and Q3) was employed to classify the data into reference values, high reference values, and outliers [45–47]. Anomalies were defined based on the boxplot's upper inner fence (UIF), which is calculated by multiplying the interquartile range (IQR) by 1.5. Specifically, the anomaly threshold is determined by the formula:  $Q3 + 1.5 \times (Q3 - Q1)$ .

The data were also analyzed using cluster analysis (CA) to explore associations and variations in element concentrations across different locations. CA is a multivariate analytical technique that groups similar observations into classes, employing similarity or distance measures to form a dendrogram [48].

### 3.4. Geochemical Maps

The dataset generated from surface water samples was used to create iso-value maps illustrating the spatial distribution of PTEs in the study area. The GIS environment was designed according to the World Geodetic System 1984 (WGS84) datum, and the geostatistical interpolation tool Inverse Distance Weighting (IDW) was used using ArcGIS 10.8 software, selecting 15 points as nearest neighbors. This tool, which considers the Euclidean distance between two points to establish their spatial correlation, has already been adopted in numerous works and was chosen based on the proximity of the sample points, which reflects well the real values in areas with dense sampling [49–51].

## 4. Results

### 4.1. Elemental Concentrations and Comparative Data

Table 3 presents descriptive statistics for selected elements and compares the observed concentrations with global and European reference medians [52,53].

**Table 3.** Descriptive statistics (for selected elements) of surface water samples from Upper Rio das Velhas and Upper Paraopeba Basin, Minas Gerais, Brazil, compared to data from Europe (EUR) and the world.

Elem	Unit	Min	Q1	Median	Q3	Máx	Mean	EUR * (Median)	World ** (Median)
Al	$\mu\text{g}\cdot\text{L}^{-1}$	7.3	15.5	25.3	70.0	2562	136.7	17.7	160
Fe	$\mu\text{g}\cdot\text{L}^{-1}$	7.8	159.2	353	671.6	2873	503.4	67	40
Ca	$\text{mg L}^{-1}$	0.4	2.3	3.7	6.8	2468	25.3	40.2	12
Mg	$\text{mg L}^{-1}$	0.14	0.89	1.76	2.94	673	20.81	6.02	2.9
K	$\text{mg L}^{-1}$	0.07	0.50	0.87	1.58	1446	5.86	1.60	2.3
As	$\mu\text{g}\cdot\text{L}^{-1}$	57.7	57.7	57.7	64.8	414	65	0.63	2
Cd	$\mu\text{g}\cdot\text{L}^{-1}$	6.2	6.2	6.2	7.8	19.6	6.92	0.01	0.2
Cr	$\mu\text{g}\cdot\text{L}^{-1}$	5.3	32.5	32.5	57.7	326.4	45.6	0.38	1
Cu	$\mu\text{g}\cdot\text{L}^{-1}$	3.5	4.2	4.2	67.3	263.7	34.3	0.88	7
Mn	$\mu\text{g}\cdot\text{L}^{-1}$	6.9	98.1	98.1	244.4	1135	183.7	15.9	10
Ni	$\mu\text{g}\cdot\text{L}^{-1}$	20	20	20	31.5	264.7	32.4	1.91	2.5
Pb	$\mu\text{g}\cdot\text{L}^{-1}$	7.2	8.2	8.2	21.3	201.4	24.9	0.09	0.03
Zn	$\mu\text{g}\cdot\text{L}^{-1}$	3.5	45.3	45.3	83.5	2198	88.9	2.68	20

Note(s): All data from Europe and areas of the world are median values. Q1: 1st quartile; Q3: 3rd quartile. EUR \* [52] Filtered < 0.45  $\mu\text{m}$ . WORLD \*\* [53] Filtered < 0.45  $\mu\text{m}$ .

The concentration distributions of most elements were positively skewed, with mean values exceeding medians. This was especially pronounced for Cu, where the mean was 8.2 times higher than the median. Among major elements, the abundance order was  $\text{Ca} > \text{Mg} > \text{K} > \text{Fe} > \text{Al} > \text{Mn}$ , while for trace elements, the average concentration order was  $\text{Zn} > \text{As} > \text{Cr} > \text{Cu} > \text{Ni} > \text{Pb}$ .

Significant variability was observed in Al, Fe, Ca, and Mg, with maximum concentrations two to three orders of magnitude greater than minimum values. Among trace elements, Mn and Zn also displayed large concentration ranges, while As and Cd exhibited narrower distributions.

Table 4 compares maximum values from this study with those reported for other mining-impacted rivers worldwide. Likewise, the highest concentrations of Cd and Pb exceeded the reported values in most of the mining-impacted rivers shown in Table 4.

When compared with prior studies in the same region, the concentrations of all PTEs were substantially higher, likely due to the greater sampling density used in this study, which included locations not previously investigated.

**Table 4.** Ranges of PTEs concentrations in surface water samples from various rivers around the world and from the Velhas and Paraopeba river basins ( $\mu\text{g}\cdot\text{L}^{-1}$ ).

River/Location	As	Cd	Cr	Cu	Ni	Pb	Zn
Mahanadi, India [54]	----	----	3.7	8.4	15.8	19.1	29.3
Karnaphuli, Bangladesh [55]	----	2.5–18.3	46–112	----	----	5.29–27.4	----
Mvudi, South Africa [56]	----	0.3–2	15–357	24–185	----	2–42	31–261
Mantaro, Peru [57]	----	----	----	1.13–14.6	----	2.8–9.5	6.3–58.3
Kalingarayan, India [58]	----	0–10	110–3400	0–1960	0–53	10–120	20–910
St. Sebastian, Sri Lanka [4]	----	----	3–78	397–2100	4–59	17–255	257–487
Europe [52]	----	0.002–1.25	0.01–43	0.08–14.6	0.03–24.6	0.05–10.6	0.09–310
Velhas and Paraopeba Basin							
Upper Velhas and Upper Paraopeba basins	57.7–414	6.2–19.6	5.3–326.4	3.5–263.7	20–264.7	7.2–201.4	3.5–2198
Mata Porcos basin [26]	<LLD *	<LLD *	<LLD	4.5–6.3	<LLD	73.7	3.9–66.9
Andaime e EPA Uaimii asin [59]	<LLD	9.8	7–12.1	5.3–7.6	<LLD	<LLD	6.3–26.5
Paraopeba basin [60]	3–15	5	40–160	4–5	4–52	5–47	20–300

Note(s): \* lower limit detection.

#### 4.2. Physicochemical Parameters

Table 5 presents the descriptive statistics of the physicochemical characteristics of the samples. The pH values ranged from 5.11 to 10.43, with 99.2% of samples falling within the acceptable range (5–9) established by Brazilian standards. Lower pH values were recorded in the Velhas basin (5.11 to 8.13), while higher values occurred in the Paraopeba basin (6.26 to 10.43), with the highest pH detected downstream of a steel plant in Congonhas.

**Table 5.** Descriptive statistics of physicochemical parameters of surface waters samples from upper Rio das Velhas and Upper Paraopeba basin, Minas Gerais, Brazil.

Parameter	Unit	Min	Q1	Median	Q3	Máx	Mean
pH	----	5.11	6.76	6.99	7.24	10.43	7.01
ORP	mV	−49	46	115	168	325	109.7
EC	$\mu\text{S}/\text{cm}$	4.2	27.7	39.5	62.7	476.3	59.1
TDS	$\text{mg L}^{-1}$	2.50	17.5	25.1	40.1	314	37.8

Redox potential (ORP) values were predominantly oxidative, ranging from −49 to 325 mV. Reducing conditions were more frequent in the Paraopeba basin, especially in urbanized areas such as Ibirité, Itatiaiuçu, Igarapé, and Mateus Leme, where domestic sewage discharges were observed.

Electrical conductivity (EC) ranged from 4.2 to 476.3  $\mu\text{S}\cdot\text{cm}^{-1}$ . Higher values were concentrated in regions under anthropogenic pressure, including Itabirito, Nova Lima, and Congonhas. A similar trend was observed for total dissolved solids (TDS), which ranged from 2.50 to 314  $\text{mg}\cdot\text{L}^{-1}$ . Elevated EC and TDS values were generally co-located and often associated with urban wastewater inputs.

#### 4.3. Classification of Contamination Levels and Spatial Distribution

Table 6 presents the classification of concentrations for selected PTEs using quartile-based thresholds and UIF (upper inner fence) values, alongside Brazilian drinking water standards [61].

**Table 6.** Limits for drinking water, concentration ranges, classification of reference values, and percentage of sampling points exceeding the drinking water limits for PTEs in the surface waters of Upper Paraopeba and Velhas River basin.

	Limit for Drinking Water (Brazilian Legislation— $\mu\text{g}\cdot\text{L}^{-1}$ ) [61]	Surface Waters Concentrations ( $\mu\text{g}\cdot\text{L}^{-1}$ )	Classification of Reference Values	% of Sampling Points Exceeding the Drinking Water Limits
As *	10	10–64.8 >64.8–75.5 >75.5	Background High Baseline Anomaly	27
Cd *	5	5–7.8 >7.8–10.2 >10.2	Background High Baseline Anomaly	26.4
Cr	50	5.3–57.7 >57.7–131.5 >131.5	Background High Baseline Anomaly	38.3
Cu	2000	3.6–67.3 >67.3–162.9 >162.9	Background High Baseline Anomaly	0
Ni	70	20–31.5 >31.5–48.8 >48.8	Background High Baseline Anomaly	10.1
Pb	10	7.2–21.3 >21.3–42.5 >42.5	Background High Baseline Anomaly	25.3
Zn	250	3.5–83.5 >83.5–177 >177	Background High Baseline Anomaly	3.2

Note(s): \* Due to the limit of quantification for arsenic (As) and cadmium (Cd) being higher than the values permitted by Brazilian legislation for drinking water, it was considered that all values within this range would be classified as background levels.

For arsenic, 26.7% of the samples exceeded the limit of quantification ( $57.7 \mu\text{g}\cdot\text{L}^{-1}$ ), with concentrations up to  $414 \mu\text{g}\cdot\text{L}^{-1}$ . Most elevated values occurred in the Velhas basin, particularly in Ouro Preto, Rio Acima, Nova Lima, Raposos, and Caeté. The Paraopeba basin had only two quantifiable values above  $90 \mu\text{g}\cdot\text{L}^{-1}$  in a minimally impacted area in the city of Brumadinho (Figure 2).

Cadmium levels ranged from  $<5$  to  $19.6 \mu\text{g}\cdot\text{L}^{-1}$ , with 73% of values below the detection limit. Among quantifiable samples, 74 points exceeded the drinking water limit ( $5 \mu\text{g}\cdot\text{L}^{-1}$ ). The spatial distribution (Figure 3) shows that most anomalies are observed in the Velhas basin, particularly in the headwaters and areas with mining or domestic effluent discharge.

Lead concentrations ranged from  $<7.2$  to  $201.4 \mu\text{g}\cdot\text{L}^{-1}$ . The median was  $8.2 \mu\text{g}\cdot\text{L}^{-1}$ , while 25.3% of samples exceeded the national standard ( $10 \mu\text{g}\cdot\text{L}^{-1}$ ). Approximately 75% of the samples showed lead concentrations of up to  $21.3 \mu\text{g}\cdot\text{L}^{-1}$ , which can be considered representative of the regional background (Figure 4a). A total of 60 samples exceeded the anomaly threshold of  $42.5 \mu\text{g}\cdot\text{L}^{-1}$ , with elevated values present in both basins.

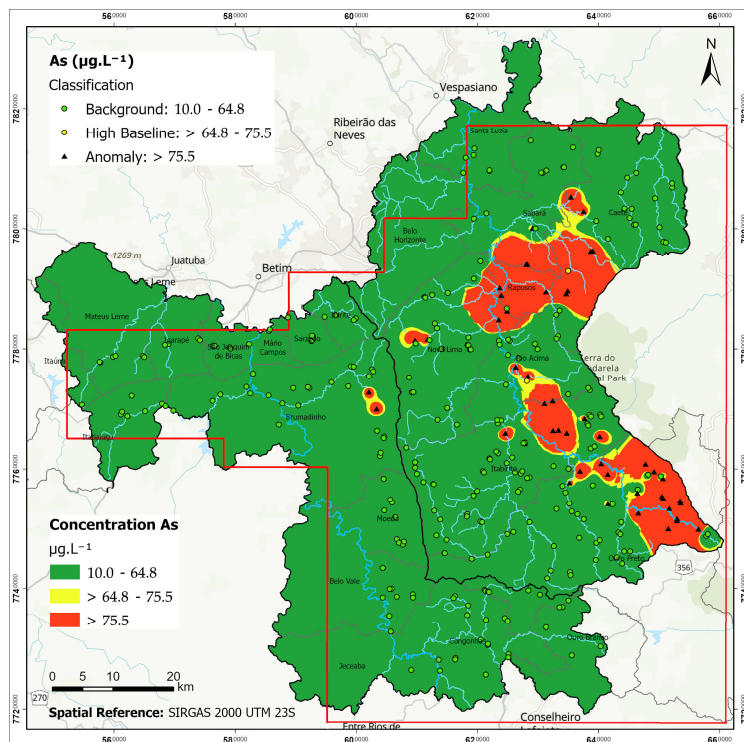
Zinc ranged from  $<3.5$  to  $2198 \mu\text{g}\cdot\text{L}^{-1}$ , with a median of  $45.3 \mu\text{g}\cdot\text{L}^{-1}$ . Only 2.8% of samples exceeded the Brazilian limit of  $250 \mu\text{g}\cdot\text{L}^{-1}$ . Zn anomalies were spatially dispersed, occurring in both rural and urban areas, as well as in some environmentally protected zones. Concentrations above the UIF value ( $177 \mu\text{g}\cdot\text{L}^{-1}$ ) were observed at 18 sites across the two basins (Figure 4b).

Chromium concentrations (Figure 5a) varied between  $<5.3$  and  $326.4 \mu\text{g}\cdot\text{L}^{-1}$ , with 38.3% of samples exceeding the drinking water threshold of  $50 \mu\text{g}\cdot\text{L}^{-1}$ . Anomalies above  $131.5 \mu\text{g}\cdot\text{L}^{-1}$  were recorded in 18% of the samples. Nickel levels ranged from  $<20$  to  $264.7 \mu\text{g}\cdot\text{L}^{-1}$  (Figure 5b). Seventy-five percent of samples were below  $31.5 \mu\text{g}\cdot\text{L}^{-1}$ . A total of 57 anomalies were identified, with 10.1% of samples exceeding the Brazilian standard ( $70 \mu\text{g}\cdot\text{L}^{-1}$ ).

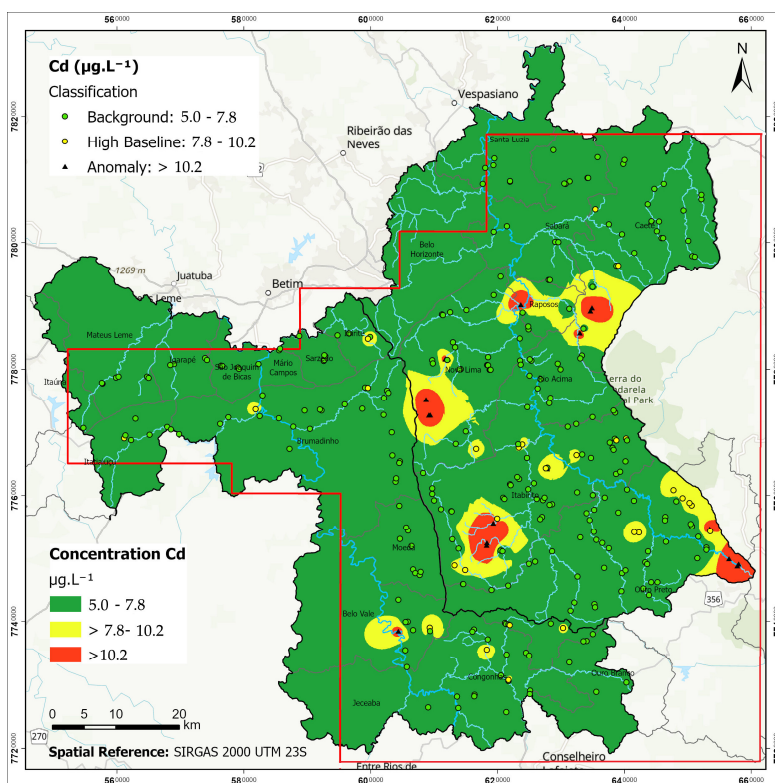
Copper values ranged from  $<3.5$  to  $263.7 \mu\text{g}\cdot\text{L}^{-1}$ . Although no samples exceeded the national limit of  $2000 \mu\text{g}\cdot\text{L}^{-1}$ , 2% of samples had concentrations above  $162.9 \mu\text{g}\cdot\text{L}^{-1}$  (UIF threshold), mainly in the Velhas basin. These anomalies, ranging from  $164.7$  to



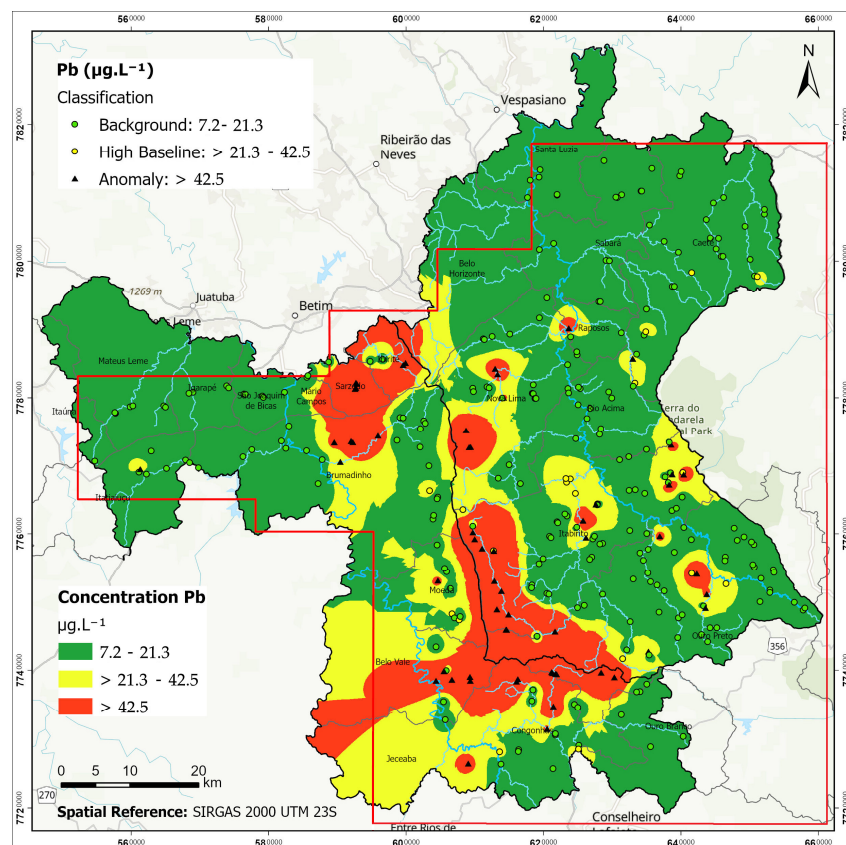
263.8  $\mu\text{g}\cdot\text{L}^{-1}$ , were spatially limited to an area of 0.2%. They were identified at six sites along the Rio das Velhas basin (Figure 6) and were located within the municipalities of Itabirito, Nova Lima, and Rio Acima.



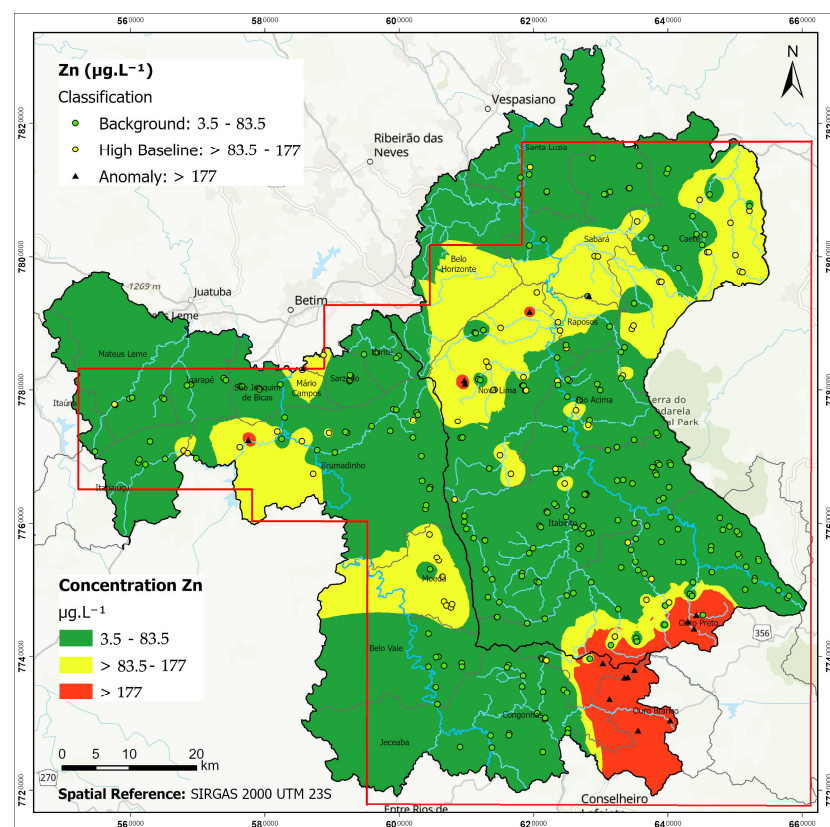
**Figure 2.** As geochemical map of surface waters in Upper Velhas River and Paraopeba River basin, IQ region, Brazil.



**Figure 3.** Cd Geochemical map of Surface waters in Upper Velhas River and Paraopeba River basin, IQ region, Brazil.

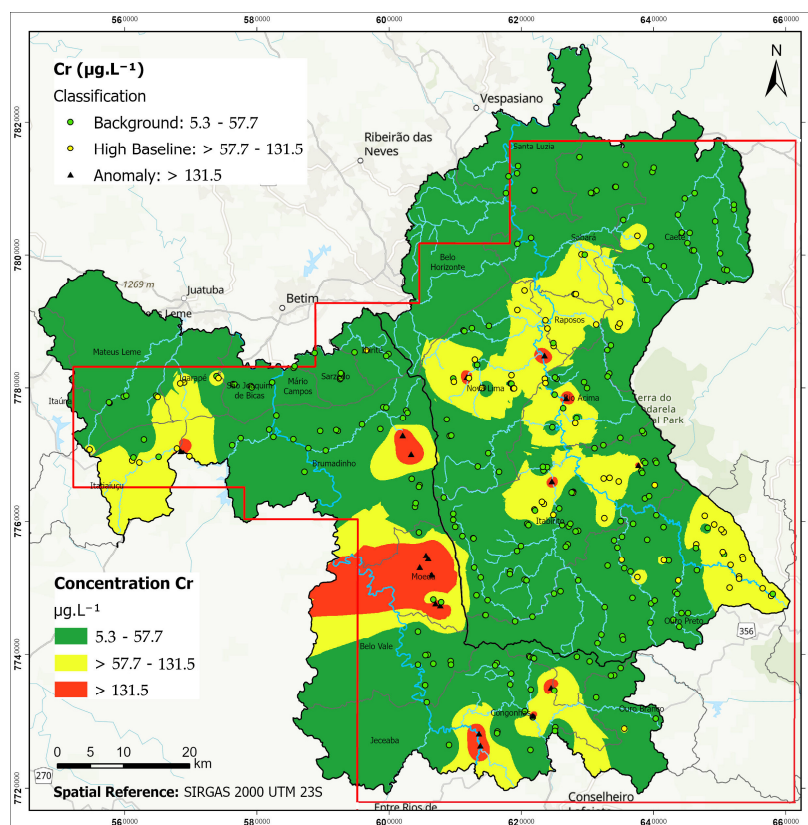


(a)

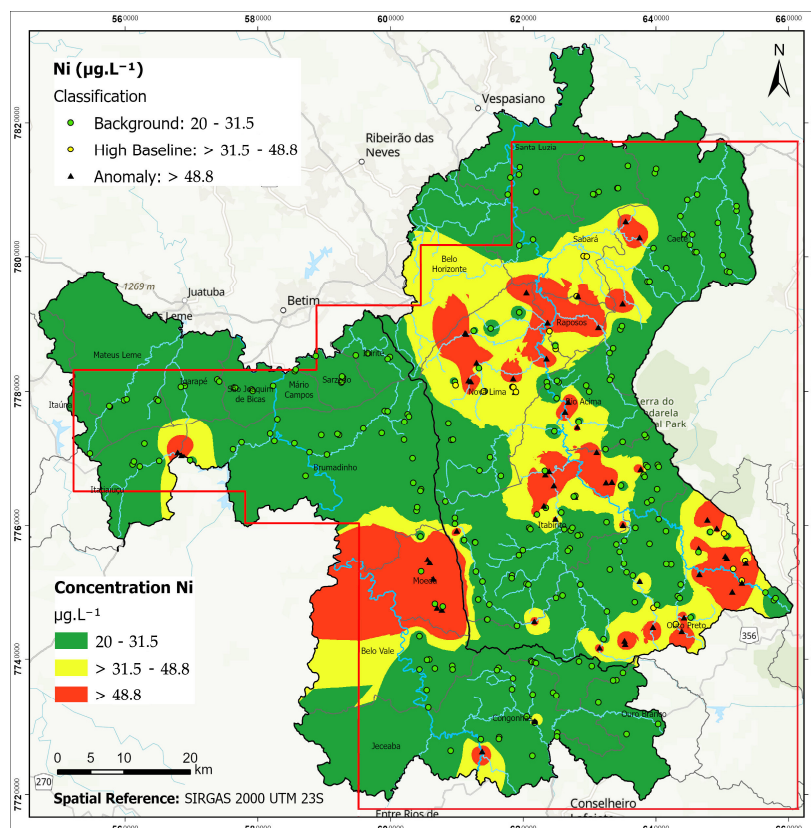


(b)

**Figure 4.** Pb (a) and Zn (b) geochemical map of surface waters in Upper Velhas River and Paraopeba River basin, IQ region, Minas Gerais, Brazil.



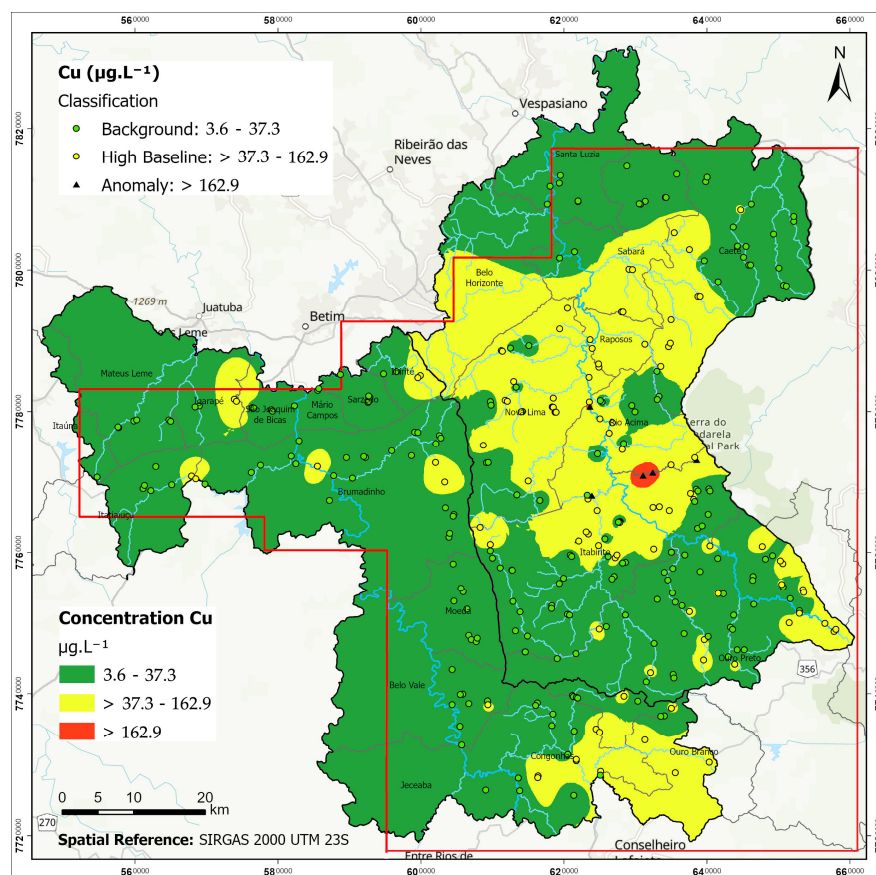
(a)



(b)

**Figure 5.** Cr (a) and Ni (b) geochemical map of surface waters in Upper Velhas River and Paraopeba River basin, IQ region, Minas Gerais, Brazil.





**Figure 6.** Cu geochemical map of surface waters in Upper Velhas River and Paraopeba River basin, IQ region, Minas Gerais, Brazil.

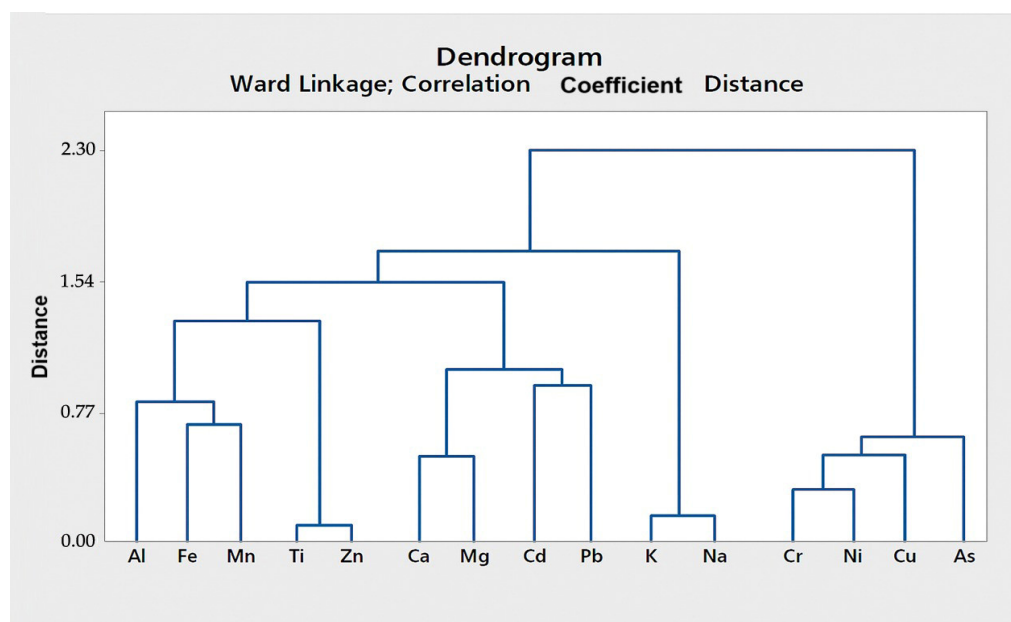
#### 4.4. Multivariate Analyses

Cluster analysis (CA) was applied to the geochemical dataset to identify patterns of elemental association in surface waters from the Upper Velhas and Upper Paraopeba basins. Three main clusters were identified among the major elements (Figure 7): Group I: Fe, Al, and Mn; Group II: Ca and Mg, and Group III: Na and K. Within Group I, Fe and Mn show closer proximity in the dendrogram, while Al appears at a greater distance, indicating lower similarity within the group. Group II elements, Ca and Mg, are closely associated, as are Na and K in Group III. Among the trace elements, three main clusters were identified (Figure 6): Group I: Ti and Zn, with a very strong correlation ( $R^2 = 0.91$ ); Group II: Cd and Pb, with a relatively low correlation, and Group III: Cr, Ni, Cu, and As.

Ti and Zn form a tightly grouped pair, while Cd and Pb, although included in the same cluster, show greater internal distance. Cr, Ni, Cu, and As cluster together, but two subgroups are distinguishable: Cr and Ni show strong correlation ( $R^2 = 0.67$ ), whereas Cu and As are separated by a greater distance in the dendrogram, consistent with their low statistical correlation ( $R^2 = 0.28$ ).

Although Group I elements are classified within the same cluster, they are relatively distant from each other. However, it can be inferred that Fe and Mn are associated due to their significant presence in itabirites, hematites, and phyllites of the Minas Supergroup. Although Al is not associated with itabirites, it may be present in phyllites, and high concentrations have been observed in areas that drain over the aforementioned rocks in densely urbanized regions.





**Figure 7.** Cluster analysis of major, minor and trace elements in surface waters in Upper Velhas River and Paraopeba River basin, IQ region, Minas Gerais, Brazil.

The results for Group II suggest that calcium and magnesium originate from similar geological sources, primarily linked to dolomites, limestones, and dolomitic itabirites within the Minas Supergroup—specifically the Itabira Group and Cauê Formation. In contrast, sodium and potassium (Group III) exhibit a strong geochemical affinity associated with granitic and gneissic rocks found in the region’s metamorphic complexes.

Regarding trace elements, three main groups were observed (Figure 7): Group I (Ti and Zn), Group II (Cd and Pb), and Group III (Cr, Ni, Cu, As). The elements in Group I showed a significant correlation ( $R^2 = 0.91$ ), and this association may be attributed to the presence of these elements in the phyllites and itabirites of the Minas Supergroup, as most joint anomalies were observed in areas draining over this lithotype.

Group II, involving Cd and Pb in the same cluster, showed the greatest relative distance between elements, indicating a low correlation. This association is believed to be related to the interaction between lithology (phyllites and itabirites) and anthropogenic activity, as joint anomalies of these elements were found in areas heavily impacted by mining activities.

In Group III, two trends can be observed, explained by the metallic associations of Co–Ni–Cr and Cu–As found in the schists of the Nova Lima Group (Rio das Velhas Supergroup), as identified in other studies [14,15,20,23,24,29]. These associations are related to sulfide veins and gold deposits occurring in the region. Cu and As show a greater distance between them, which is supported by their low correlation ( $R^2 = 0.28$ ). However, Cr and Ni show a high correlation ( $R^2 = 0.67$ ).

## 5. Discussion

The geochemical profiles of surface waters in the Upper Velhas and Upper Paraopeba basins reveal significant enrichment in PTEs, with concentrations well above regional and international baselines. The comparison with European and global reference medians [52,53] highlights the magnitude of contamination: Fe, Mn, and Zn presented median concentrations 5.2–16.9 times higher than the European values and 2.3–9.8 times higher than global medians (Table 2). However, the most extreme enrichments were observed for Pb and Cr, with median values up to 91 and 85.5 times higher than those reported for Europe and 273 and 32 times higher than global references, respectively.

This pronounced geochemical anomaly reflects the interplay between lithological controls and anthropogenic pressures. The elevated background levels of Fe, Mn, and Al align with the weathering of itabirites, phyllites, and hematite-bearing lithologies of the Minas Supergroup, particularly in areas affected by mining (Figure 1). The consistent association of Fe and Mn with these units confirms prior findings in iron ore provinces [62,63]. Similarly, high Zn concentrations, often co-occurring with Ti, suggest a strong lithogenic influence linked to phyllitic and itabiritic terrains, as supported by the strong correlation between these elements ( $R^2 = 0.91$ ).

In contrast, the distribution of As, Cr, Ni, and Cd reveals a strong spatial correlation with sulfide-rich lithologies, particularly the Nova Lima Group schists, which are known to harbor primary gold deposits and already naturally contain high levels of these elements [15,24,29]. Arsenic concentrations reached  $414 \mu\text{g}\cdot\text{L}^{-1}$ , with 26.7% of samples exceeding the national limit of  $10 \mu\text{g}\cdot\text{L}^{-1}$  (Table 5). These values are mostly concentrated in the Rio das Velhas basin, particularly in Ouro Preto, Nova Lima, and Rio Acima (Figure 2), where arsenic-bearing minerals such as arsenopyrite, realgar, and arseniferous pyrite are abundant [24,25].

The spatial overlap between As and Cd anomalies is noteworthy. Despite a high quantification limit for Cd ( $5 \mu\text{g}\cdot\text{L}^{-1}$ ), 74 samples surpassed this threshold, particularly in mining-influenced zones of Itabirito and Nova Lima (Figure 3). This co-occurrence is supported by previous studies [25] and suggests a mixed control involving both lithological sources and anthropogenic inputs, including mining and metallurgical effluent discharges.

Lead concentrations exhibited the largest anomalous area (13.8%), with values up to  $201.4 \mu\text{g}\cdot\text{L}^{-1}$  (Figure 4a), far exceeding the national limit ( $10 \mu\text{g}\cdot\text{L}^{-1}$ ) in 25.3% of samples (Table 5). Elevated Pb levels were prevalent in both basins, notably in the southwestern Velhas basin and phyllite/itabirite domains of the Paraopeba basin, where mining activities are intensive.

Chromium and nickel displayed similarly elevated levels, with maximum of  $326.4$  and  $264.7 \mu\text{g}\cdot\text{L}^{-1}$ , respectively, values that surpass other studies conducted in the same basins. Cr exceeded the drinking water limit ( $50 \mu\text{g}\cdot\text{L}^{-1}$ ) in 38.3% of samples, while Ni surpassed its threshold ( $70 \mu\text{g}\cdot\text{L}^{-1}$ ) in 10.1% (Table 5). The co-occurrence of Cr and Ni anomalies, especially in rural zones of Moeda and Nova Lima (Figure 5a,b), reflects their shared natural geogenic source in mafic dikes and ultramafic rocks, since the region does not have intense economic activities, consistent with known Cr–Ni associations in the Nova Lima Group [14,20].

Although Cu concentrations did not exceed national limits ( $2000 \mu\text{g}\cdot\text{L}^{-1}$ ), localized anomalies ( $>162.9 \mu\text{g}\cdot\text{L}^{-1}$ ) were detected at six sites in the Velhas basin (Figure 6), closely associated with the schists of the Nova Lima Group and areas with intense land use. Cu and As clustered together in the multivariate analysis (Figure 6), but with a weak correlation ( $R^2 = 0.28$ ), indicating distinct geochemical behaviors or source pathways.

The multivariate analysis (Figure 7) elucidates the geochemical structure of the region. Among the major elements, three groups were identified: Fe, Mn, and Al (Group I); Ca and Mg (Group II); and Na and K (Group III). Group I reflects the weathering of ferruginous rocks, especially in mining zones. Group II elements are derived from dolomitic and calcareous rocks, while Group III reflects contributions from silicate weathering in granitic and gneissic terrains. Among the trace elements analyzed, the Ti–Zn and Cd–Pb clusters indicate distinct geogenic associations, suggesting different lithological origins and sources of contamination. The Ti–Zn pair is related to volcano-sedimentary units, while the Cd–Pb association, in addition to reflecting natural components present in the iron formations of the Minas Supergroup and in metasedimentary rocks, also suggests strong anthropogenic influence, primarily linked to industrial, urban, and mining activities, which favor the

accumulation of these metals in water systems. On the other hand, the Cr–Ni–Cu–As cluster reveals a clear relationship with the metallogenic patterns typical of the Nova Lima Group. These elements are commonly associated with mafic and ultramafic rocks, and especially with mineralized hydrothermal veins rich in sulfides, characteristic of the region's gold mineralization [20,24,29].

Altogether, the integration of spatial distribution (Figures 2–6), multivariate analysis (Figure 7), and regulatory comparison (Tables 2 and 5) highlights the significant environmental burden on surface waters in these basins. The presence of multiple PTEs above legal thresholds, particularly in areas of limited water treatment and socioeconomically vulnerable populations, poses a tangible risk to human health. These findings emphasize the need for targeted environmental management and urgent public health interventions. Furthermore, the methodological approach adopted, based on dense spatial sampling, geochemical mapping, and multivariate interpretation, provides a valuable framework for water quality monitoring in other mining-impacted catchments.

## 6. Conclusions

This study provides a detailed geochemical assessment of surface water quality in two major river basins of Brazil's Iron Quadrangle, revealing widespread contamination by potentially toxic elements (PTEs) such as arsenic, cadmium, chromium, and lead. Many concentrations exceed both national and international water quality standards, highlighting significant environmental and health risks.

Elevated PTEs levels were strongly linked to mining-affected lithologies and zones receiving untreated urban discharge. Critical risk areas include rural and peri-urban regions in the Velhas basin, where arsenic and cadmium pose long-term health threats, and the Paraopeba basin, where chromium and nickel anomalies are closely tied to mafic rock formations and industrial effluent sources, as these were observed in a region with intense metallurgical activity. Overall, the contamination patterns underscore the dual impact of natural geological background and human activities on regional water quality.

Through geochemical clustering and spatial analysis to differentiate lithogenic and anthropogenic sources, the study provides a clearer understanding of contamination pathways. This integrated approach enables more effective targeting of mitigation strategies and prioritization of monitoring efforts.

Importantly, this study advances regional water management by employing a high-resolution, replicable methodology that enhances source identification and contamination mapping. Unlike earlier research limited by low sampling density or coarse spatial resolution, this approach allows for more accurate environmental assessments in mining-affected areas.

The geochemical baselines, risk zones, and multielemental relationships identified here are directly applicable to monitoring programs, licensing decisions, and rehabilitation planning. These tools can also inform public policy aimed at safeguarding water resources and protecting vulnerable populations in other regions under similar pressures.

This research offers a scalable and replicable framework for water quality monitoring in mining-affected areas worldwide. The results are directly applicable to policy-making, environmental risk assessment, public health interventions, and watershed rehabilitation planning. In particular, the identification of vulnerable rural and peri-urban populations consuming contaminated water underscores the urgent need for targeted water treatment and governance measures. By bridging critical knowledge gaps and setting methodological standards, this study contributes significantly to both the science and practice of environmental geochemistry.

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