

Evaluation of potentially toxic elements and ecological risks associated with environmental liabilities in Tacna, Peru

*Original*

Evaluation of potentially toxic elements and ecological risks associated with environmental liabilities in Tacna, Peru / Cáceda Quiroz, César Julio; Maraza Choque, Gisela July; Fora Quispe, Gabriela De Lourdes; Farfan Pajuelo, Diana Galeska; Obando Velarde, Edwin Denis; Chiampo, Fulvia; Carpio Mamani, Milena. - In: PLOS ONE. - ISSN 1932-6203. - ELETTRONICO. - 20:11(2025), pp. 1-23. [10.1371/journal.pone.0311470]

*Availability:*

This version is available at: 11583/3005630 since: 2025-12-04T09:52:49Z

*Publisher:*

PLOS

*Published*

DOI:10.1371/journal.pone.0311470

*Terms of use:*

This article is made available under terms and conditions as specified in the corresponding bibliographic description in the repository

*Publisher copyright*

(Article begins on next page)

RESEARCH ARTICLE

# Evaluation of potentially toxic elements and ecological risks associated with environmental liabilities in Tacna, Peru

César Julio Cáceda Quiroz<sup>1</sup>\*, Gisela July Maraza Choque<sup>1</sup>\*, Gabriela de Lourdes Fora Quispe<sup>1</sup>\*, Diana Galeska Farfan Pajuelo<sup>1</sup>‡, Edwin Denis Obando Velarde<sup>1</sup>‡, Fulvia Chiampo<sup>2</sup>‡, Milena Carpio Mamani<sup>1</sup>©

**1** Project of Bioremediation, Jorge Basadre Grohmann National University, Faculty of Sciences, Professional School of Biology-Microbiology, Tacna, Perú, **2** Department of Applied Science and Technology, Politecnico di Torino, Corso Duca degli Abruzzi, Torino, Italy

© These authors contributed equally to this work.  
‡ DGFP, EDOV and FC also contributed equally to this work.  
\* [ccacedaq@unjbg.edu.pe](mailto:ccacedaq@unjbg.edu.pe)



## Abstract

Mining environmental liabilities (MELs) are abandoned deposits resulting from extractive activities that pose a high risk of contamination and remain an unresolved challenge for authorities worldwide. This study evaluated the contamination levels of potentially toxic elements (PTEs) and their associated ecological risks in MELs, using multiple environmental indices. Analyses were performed following the EPA 6020A method with acid digestion and inductively coupled plasma mass spectrometry (ICP-MS), while free cyanide and hexavalent chromium were determined using the EPA 9013A and EPA 7199 methods, respectively. The results revealed elevated concentrations of arsenic (1,102 mg/kg), cadmium (271 mg/kg), lead (15,961 mg/kg), and free cyanide (64 mg/kg), which exceeded regulatory standards by a considerable margin. Statistically significant differences were observed across the sites ( $p < 0.05$ ). In addition, the presence of flora, fauna, rivers, and rural communities in proximity to these abandoned mining sites amplifies both ecological and social risks. The applied indices consistently indicated severe levels of contamination and high ecological risk across all areas evaluated. Although no statistically significant differences were found in some indices ( $p > 0.05$ ), the magnitude of the recorded values remains ecologically relevant. Notably, each index has its own interpretative scale, allowing for an independent and robust evaluation of contamination severity and its potential ecological implications. Principal Component Analysis (PCA) revealed multiple sources of pollution, while Spearman correlation analysis identified strong associations among PTEs, suggesting common environmental dispersion pathways. This research provides a critical preliminary assessment of the risks associated with these environmental legacies and emphasizes the urgent need for remediation efforts at both

## OPEN ACCESS

**Citation:** Cáceda Quiroz CJ, Maraza Choque GJ, Fora Quispe GdL, Farfan Pajuelo DG, Obando Velarde ED, Chiampo F, et al. (2025) Evaluation of potentially toxic elements and ecological risks associated with environmental liabilities in Tacna, Peru. *PLoS One* 20(11): e0311470. <https://doi.org/10.1371/journal.pone.0311470>

**Editor:** Benedetto Schiavo, National Autonomous University of Mexico Institute of Geophysics: Universidad Nacional Autonoma de Mexico Instituto de Geofisica, MEXICO

**Received:** September 16, 2024

**Accepted:** October 30, 2025

**Published:** November 25, 2025

**Copyright:** © 2025 Cáceda Quiroz et al. This is an open access article distributed under the terms of the [Creative Commons Attribution License](https://creativecommons.org/licenses/by/4.0/), which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

**Data availability statement:** All relevant data are within the manuscript and its [Supporting Information](#) files.

**Funding:** This research was funded by the National University Jorge Basadre Grohmann through the 'Mining Canon and Mining Royalties Fund,' as sanctioned by Rectoral Resolution No. 4723-2015-UN/JBG. The funding supported the project titled 'Genomic Analysis of Cyanide-Degrading Microorganisms for the Remediation of Mining Environmental Liabilities in the Tacna Region'.

**Competing interests:** The authors have declared that no competing interests exist.

local and global scales. The current lack of action is largely attributed to the absence of comprehensive baseline assessments. The findings underscore the importance of prioritizing their management through sustainable strategies and international policies to mitigate environmental impacts.

## Introduction

Mining is one of the oldest and most significant anthropogenic activities worldwide and remains a fundamental economic sector for many countries. However, the inadequate management of waste generated during mining activities has triggered serious environmental impacts due to the accumulation of hazardous residues and other potentially toxic elements (PTEs) [1–3]. However, inadequate waste management during mining activities has resulted in negative effects due to the accumulation of hazardous waste [4], including heavy metals (HMs) and other potentially toxic elements (PTEs). These pollutants are characterized by high toxicity, persistence in the environment, bioaccumulation potential, and their capacity to disrupt biogeochemical cycles and reduce biodiversity. They are highly toxic when interacting with environmental elements such as water, soil, and air, and have the ability to accumulate in the human body [5,6]. Living organisms can be exposed to PTEs through trophic transfer processes in food chains, where contaminants migrate from soils to plants and, subsequently, to higher organisms (soil > plants > humans or soil > plants > animals > humans) [7].

This situation has led to sociopolitical conflicts and significant public health repercussions [1]. Historically, areas affected by mining activities lacked specific measures aimed at environmental remediation, primarily due to the absence of environmental regulations and legal frameworks. Only a limited number of countries implemented mining regulations and governmental recovery programs, resulting in the global accumulation of Mining Environmental Liabilities (MELs) [3,8,9]. MELs are defined as abandoned or inactive facilities, effluents, emissions, residues, or waste deposits produced by mining operations, which pose a permanent and potential risk to public health and ecosystems [10–12].

It is estimated that more than one million abandoned mines exist worldwide, including underground galleries, alluvial mines [8], tailings, unused pits, and altered topography [13], all of which generate toxic waste [8,13]. Latin America hosts some of the world's largest and oldest mines, particularly in countries such as Mexico, Chile, Bolivia, Peru, Colombia, and Ecuador [14]. The continent is especially vulnerable to PTE contamination due to (a) its history of intensive mining, (b) inadequate management of mining environmental liabilities, (c) weak enforcement of environmental regulations, (d) a high concentration of mining activities, and (f) the absence of biomonitoring systems [14,15]. In these regions, over 1,266 Mining Environmental Liabilities (MELs) have been officially reported in the Plurinational State of Bolivia, 492 in Chile, 522 in Colombia [9,16], and 6,026 in Peru [17]. Currently, Peru has approximately 11,743 mining concessions covering about 7,707,162 hectares of its national territory,

including areas in Amazonas, Áncash, Apurímac, Arequipa, Ayacucho, Cajamarca, Cusco, Huancavelica, Huánuco, Ica, Junín, La Libertad, Lambayeque, Lima and Callao, Loreto, Madre de Dios, Moquegua, Pasco, Piura, Puno, San Martín, and Tacna [18]. Like other countries, Peru faces significant challenges regarding Mining Environmental Liabilities (MELs). Although it was the first country in Latin America to establish a legal framework for MEL sites in 1993 [19], a substantial number of these MELs originated prior to the regulation, when the standards were less stringent than they are today [20].

Environmental contamination caused by PTEs represents a significant challenge due to their high toxicity, long persistence, and non-biodegradable nature [20,21]. These elements tend to spread across agricultural fields, vegetation, and forest landscapes [22]. They also alter the biological and physicochemical properties of soils, causing detrimental effects on various plant physiological processes [23], and increasing the risk of surface [24], and groundwater contamination [25,26], as well as ecosystem degradation [27]. Furthermore, most PTEs possess carcinogenic properties [8,28], with As, Cd, Cr, and Ni classified as Category 1 heavy metals for carcinogenicity by the International Agency for Research on Cancer [28]. In Russia, high concentrations of Zn, Ni, Pb, Cu, and Cd are exacerbated by the interaction of mining waste, atmospheric precipitation, and acid mine drainage [29,30]. In Spain and China, the dispersion of these elements has contaminated surrounding areas, agricultural fields, urban soils, and forested landscapes [31,32]. In Ecuador, tailings deposits pose risks to both human populations and ecosystems due to the potential contamination of rivers, which serve as water sources for nearby communities [24]. In Peru, high concentrations of toxic elements such as Pb, As, Zn, and Cd, resulting from leaching processes, have impacted watersheds [1].

In many countries, these events generate ongoing environmental concerns, as PTEs are associated with environmental factors that can mobilize metals and residues [33,34], posing significant ecological risks. Consequently, hazard identification and risk characterization [35] are essential to assess the extent of contamination [36]. Various indices are used to evaluate the presence and concentration of anthropogenic contaminants in the environment, such as the Geoaccumulation Index (I-geo), Contamination Factor (Cf), Pollution Index (PI) [37], Pollution Load Index (PLI), Degree of Contamination (Cdeg) [38], and Ecological Risk Factor (RI) [39]. Given the complexity of landscapes and surroundings, integrating multiple assessment methods becomes imperative to determine the contamination levels caused by PTEs.

In this context, it is crucial to conduct a comprehensive assessment of contamination levels and the environmental risks associated with MELs, particularly in regions like Latin America, where their environmental, social, and public health impacts are significant. This research integrates multiple environmental assessment indices to provide a more comprehensive analysis of contamination. Additionally, it focuses on characterizing potential ecological risks and designing mitigation strategies, serving as a practical tool for environmental management and decision-making. The findings are vital for strengthening remediation policies and promoting more sustainable practices in mining activities, ultimately improving the health and well-being of affected communities.

The objective of this study was to evaluate the contamination levels caused by potentially toxic elements (PTEs) generated by mining environmental liabilities (MELs) and analyze associated environmental risks using evaluation indices such as the Geoaccumulation Index, Contamination Factor, Pollution Load Index, Degree of Contamination, Ecological Risk Factor, and Potential Ecological Risk Index. This approach addressed the lack of systematic evaluations in these areas, provided essential data that enhanced the understanding of environmental impacts and served as a foundation for planning and implementing bioremediation projects aimed at mitigating soil and water contamination and containing associated environmental risks.

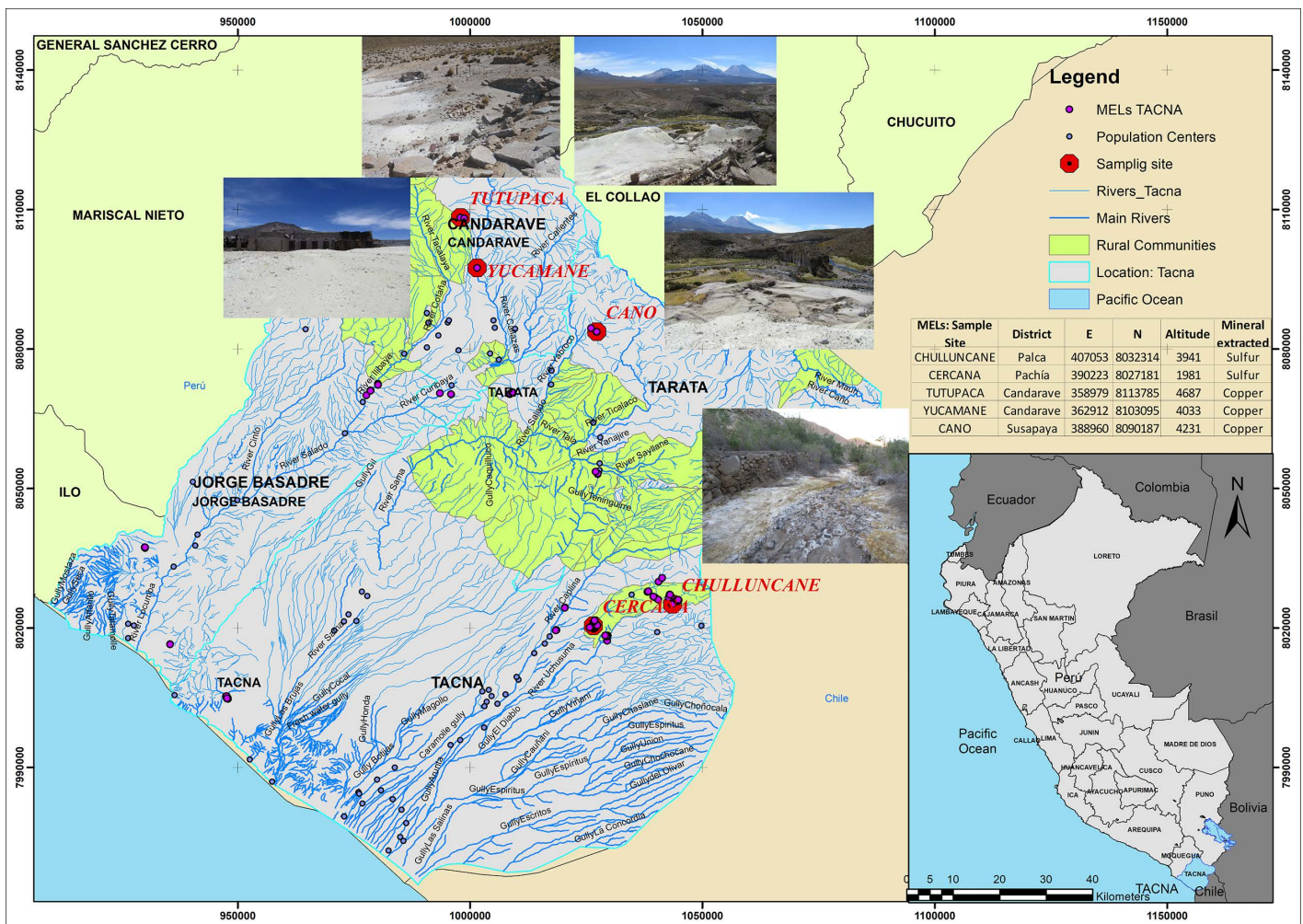
## Materials and methods

### Study area description

The Tacna region, located on the southern coast of Peru, is prominent in the mining sector, accounting for 6.9% of the country's copper reserves and ranking fourth nationally. It currently reports approximately 100 mining environmental liabilities (MELs) [40], with the main subtypes identified as mine entrances, mining waste, tailings, and infrastructure [16].

The study area corresponds to the MELs located in the districts of Palca, Pachía, Candarave, and Susapaya in the Tacna region (Fig 1), which originated from former mining operations primarily focused on copper and sulfur extraction. The generation of mining tailings, combined with the absence of an identified responsible party, has led to significant environmental degradation. In addition, the region's complex physiography and highly variable climatic conditions contribute to the intermittent activation of nearby rivers, posing a risk to surrounding ecosystems.

To assess the current condition of these MELs, a set of site-specific and environmental criteria was applied, including geolocation, associated mining activity, type of waste, distance to water bodies (0–100 meters), presence of vegetation, signs of fauna, proximity to affected sites (0–100 meters), populated centers, and rural communities. These criteria provided a comprehensive overview of the potential risks and the urgent need for remediation actions in this specific area [41].



**Fig 1. Location of Mining Environmental Liabilities (MELs) and Sampling Sites in the Tacna Region, Peru.** The map was generated using QGIS 3.32 and shows the distribution of MELs across the districts of Palca, Pachía, Candarave, and Susapaya. Sampling sites include Tutupaca, Yucamane, Cano, Chulluncane, and Cercana.

<https://doi.org/10.1371/journal.pone.0311470.g001>

## Sample Collection

In each study area, purposive sampling was conducted to select locations with the highest likelihood of contamination by potentially toxic elements (PTEs) [41,42]. Strategic points were chosen near water bodies, populated centers, and rural communities to adequately represent zones at greater environmental risk [41,43,44].

Sampling was carried out at five mining environmental liability (MEL) sites—Tutupaca, Yucamane, Cano, Chulluncane, and Cercana—along with one reference site representing native soil conditions [2]. A total of 20 soil samples were analyzed: five replicates were collected at the reference site, and three replicates at each of the five MEL sites [45,46]. The difference in the number of replicates between sites was due to logistical and budgetary constraints commonly encountered in field studies of mining environmental liabilities.

Approximately 500 g of surface material (0–10 cm depth) [47], was collected at each sampling point, sealed in polyethylene bags [2], and transported to the laboratory for inorganic analysis following the Peruvian soil quality standards D.S. N° 11–2017-MINAM for industrial soils [10]. The GPS coordinates of all sampling locations are presented in Fig 1.

## Concentration of metals and free cyanide in mining environmental liabilities

The concentration of the following elements was determined in a laboratory accredited by the National Quality Institute (INACAL). For the analysis of arsenic, barium, cadmium, lead, chromium, and mercury, the EPA 6020A method of Microwave-Assisted Acid Digestion of Sediments, Sludges, Soils, and Oils was used, employing Inductively Coupled Plasma Mass Spectrometry (ICP-MS) [48] with detection limits of 0.02 mg/kg, 0.04 mg/kg, 0.02 mg/kg, 0.02 mg/kg, 0.2 mg/kg, and 0.03 mg/kg, respectively. Free cyanide was analyzed following the EPA 9013A/SMEWW-APHA-AWWA-WEF Part 4120 B method [49] with a detection limit of 0.05 mg/kg, and hexavalent chromium Cr(VI) was measured using the EPA 7199.1996 method for determination of Cr(VI) by Ion Chromatography [50], with a detection limit of 0.04 mg/kg. Additionally, the pH of the samples was determined according to the US EPA 9045D method [51] using a pH meter (Hanna Instruments HI3222) and electrode (Hanna Instruments HI1043-B), with a detection limit of 0.001 pH.

## Evaluation of potential environmental risks

For the assessment of potential ecological risks and pollution levels, the following indices were determined: Geoaccumulation Index (*I-geo*) [52–54], Pollution Load Index [38], Pollution Index, Contamination Degree [55], Modified Contamination Degree, Ecological Risk Factor, and Potential Ecological Risk Index [38]. These indices are crucial and widely employed to evaluate contamination levels in soil and sediments, serving as valuable tools in establishing potential ecological risks [55–60].

## Geoaccumulation index (*I-geo*) for assessing contamination from mining environmental liabilities

The Geoaccumulation Index (*I-geo*) was employed to evaluate the contamination levels of each metal on the soil surface. This index takes into account both the background value and analyzes the degree of contamination. The *I-geo* was calculated as described by Mueller [55]:

$$I-geo = \log_2 \left[ \frac{C_n}{1.5 \times B_n} \right] \quad (1)$$

Where  $C_n$  is the concentration of the examined metal in the soil sample,  $B_n$  is the background value, and 1.5 as a correction factor to account for potential variations in specific metal background values.

According to Mueller (1986), *I-geo* values are classified into seven groups:  $I-geo \leq 0$  non-contaminated;  $0 \leq I-geo \leq 1$ : non-contaminated to moderately contaminated;  $1 \leq I-geo \leq 2$ : moderately contaminated;  $2 < I-geo \leq 3$ : moderately to heavily contaminated;  $3 \leq I-geo \leq 4$ : highly contaminated;  $4 \leq I-geo \leq 5$ : heavily to extremely contaminated;  $5 < I-geo$ : extremely high contamination levels.

### Pollution factor

The Pollution Factor ( $C_f$ ) was employed to quantify the contamination from hazardous compounds [38,61]. It serves as an effective tool for monitoring pollution over a period of time [55]. The  $C_f$  value for each element was calculated using the following equation:

$$C_f = \frac{C_m}{C_b} \quad (2)$$

Where  $C_m$  is the concentration of the element in the collected samples,  $C_b$  is the background value of the specific metal in the native soil. According to Buat-Menard and Chesselet (1979), when  $C_f < 1$ : low pollution factor;  $1 \leq C_f < 3$ : moderate pollution factor;  $3 \leq C_f < 6$ : considerable pollution factor;  $C_f \geq 6$ : very high pollution factor [62].

### Degree of contamination

The degree of contamination ( $C_{deg}$ ) is the sum of the pollution factors for the investigated elements, and it was calculated using the following equation [38].

$$C_{deg} = \sum_{i=1}^{i=n} C_f \quad (3)$$

Where the following classification was proposed:  $C_{deg} < 6$ : indicates a low degree of contamination;  $6 < C_{deg} < 12$ : represents a moderate degree of contamination;  $12 < C_{deg} < 24$  signifies a considerable degree of contamination; and  $C_{deg} > 24$ : indicates a high degree of contamination, suggesting severe anthropogenic pollution.

### Modified contamination degree ( $mC_{deg}$ )

The modified contamination degree was introduced to estimate the overall contamination level at a site [63]. The  $mC_{deg}$  was calculated using the following equation:

$$mC_{deg} = \frac{\sum_{i=1}^{i=n} C_f}{n} \quad (4)$$

Where  $n$  is the number of elements analyzed,  $mC_{deg} < 1.5$ : null to very low degree of contamination;  $1.5 < mC_{deg} < 2$ : low degree of contamination;  $2 < mC_{deg} < 4$ : moderate degree of contamination;  $4 < mC_{deg} < 8$ : high degree of contamination;  $8 < mC_{deg} < 16$ : very high degree of contamination;  $16 < mC_{deg} < 32$ : extremely high degree of contamination;  $mC_{deg} \geq 32$ : ultra-high degree of contamination.

### Pollution load index

The Pollution Load Index ( $PLI$ ) integrates multiple pollutant factors to determine the contamination potential, representing the relationship between the production level and the pollutant load of each element concerning the total number of parameters analyzed [64,65]. The pollution load index was calculated from the values of the pollution factor of individual elements using the following equation.

$$PLI = \sqrt[n]{C_{f1} \times C_{f2} \times \dots \times C_{fn}} \quad (5)$$

Where  $n$  is the number of metals evaluated,  $C_{fn}$  is the pollution factor of a specific metal.  $PLI < 1$ : uncontaminated;  $PLI = 1$ : slightly contaminated;  $PLI > 1$ : environment deterioration.

## Assessment of ecological risk

The potential ecological risk index was proposed by Hakanson (1980) to evaluate the characteristics and environmental behavior of metal contaminants [38].

**Ecological risk factor (*Eri*).** The primary function of this index is to indicate the contaminating agents and prioritize pollution studies. The ecological risk factor (*Eri*) is calculated using the following equation, with  $C_f$  representing the pollution factor and  $T_n$  representing the toxic response factor, which indicates the potential hazard posed by specific metals, considering their toxicity and the environmental sensitivity to contamination. According to the standardized toxic response factor ( $T_n$ ) proposed by Hakanson (1980), Hg, Cd, As, Co, Cu, Pb, Cr, and Zn have toxic response factors of 40, 30, 10, 5, 5, 5, 2, 1, respectively.

$$Eri = T_n \times C_f \quad (6)$$

Where  $Eri < 40$ : low ecological risk;  $40 < Eri < 80$ : moderate ecological risk;  $80 < Eri < 160$ : considerable ecological risk;  $160 < Eri < 320$ : high ecological risk;  $Eri > 320$ : very high ecological risk.

**Potential ecological risk index (*IR*).** The potential ecological risk index in the soil was associated with the level of contamination, defined as the sum of individual ecological risk factors. This method comprehensively evaluates the synergy, toxicity, concentration, and ecological sensitivity of the analyzed elements [39]. The risk index for all measured metals was calculated using the following equation.

$$IR = \sum_{i=1}^n Eri \quad (7)$$

Where for the potential ecological risk index, the following terminology was utilized is  $IR < 150$ : Low ecological risk or low ecological contamination level;  $150 \leq IR < 300$ : Moderate ecological contamination level or moderate ecological risk;  $300 \leq IR < 600$ : Considerable ecological risk or serious ecological contamination level; and  $IR > 600$ : Very high ecological risk or severe ecological contamination level [38,45].

## Statistical analysis

To evaluate the concentrations of potentially toxic elements (PTEs) in mining environmental liabilities (MELs), the Shapiro–Wilk test was first applied to assess the normality of the data. When the assumption of normality was met, a one-way analysis of variance (ANOVA) was conducted to compare the means among the study areas, followed by Tukey’s post hoc test to identify significant differences. In cases where the data did not meet the normality assumption, the non-parametric Kruskal–Wallis test was applied, followed by Dunn’s test for multiple comparisons. All statistical analyses were performed at a 95% confidence level ( $\alpha=0.05$ ).

Furthermore, Principal Component Analysis (PCA) was conducted to explore the relationships between metals and their distribution across the different areas, facilitating an understanding of the variability in the collected data. Spearman’s correlation analysis was employed to investigate the relationships between PTEs within MELs.

All statistical analyses were performed using RStudio version 4.0.3 and QGIS software version 3.32.

## Results

### Characterization of the area and environmental liabilities

The study area characterization is summarized in [Table 1](#), which includes observations on vegetation, rural communities, water bodies, and human activity near the sampling sites. Shrub, scrub, and grassland vegetation were observed in the

**Table 1. Characterization of environmental liabilities.**

MELs	Mining Extraction	Coordinates (Altitude)	Residue Types	Water bodies	Vegetation	RC or PC*	Wildlife signs	Livestock	People access	pH
<b>Chulluncane District: Palca</b>	Cu	19k 0408217 8033184 (3941 m.s.n.m.)	Waste rock and tailings	Caplina River at a distance of about 20 m.	At a distance of 5 meters, scrub-type flora was observed.	Yes	Yes (Rodent feces were found inside the mine openings)	Sheep pens (300 m) and feces were observed.	No	4.98
<b>Cercana District: Pachía</b>	Cu	19k 0390208 8027180 (1981 m.s.n.m)	Waste rock and tailings	Caplina River at a distance of about 2 m.	At a distance of 1 meter, shrub-like flora was observed.	Yes	No	No	Yes (Farmers within 200 m)	7.41
<b>Tutupaca District: Candarave</b>	S	19k 0358602 8113940 (4687 m.s.n.m)	Waste rock	Not presented	On the residues, there was scrub-type flora.	Yes	Yes (Camelid and wild cat tracks were seen at a distance of 20 and 50 m, respectively)	No	No	2.13
<b>Yucamane District: Candarave</b>	S	19k 0362832 8103048 (4033 m.s.n.m)	Waste rocks	Callazas River at a distance of about 5 m.	At a distance of 1 meter, grassland-like flora was observed.	Yes	Yes (Traces of wild cats were seen on the waste)	Sheep feces were seen on the waste.	No	< 1
<b>Cano District: Susapaya</b>	S	19k 0388911 8090115 (4231 m.s.n.m)	Waste rocks	Not presented	On the residues, there was scrub-type flora.	No	Yes (Camelid tracks in the residue).	Camelid feces were observed.	Yes (Population a 3 meters)	< 1

\*RC: Rural Communities, PC: Population Centers. Cu: Copper, S: Sulfur.

<https://doi.org/10.1371/journal.pone.0311470.t001>

vicinity of the mining environmental liabilities (MELs). Evidence of wildlife was also recorded, including small mammals, camelids, and wildcats, as well as domestic livestock corrals associated with pastoral activities of the local communities.

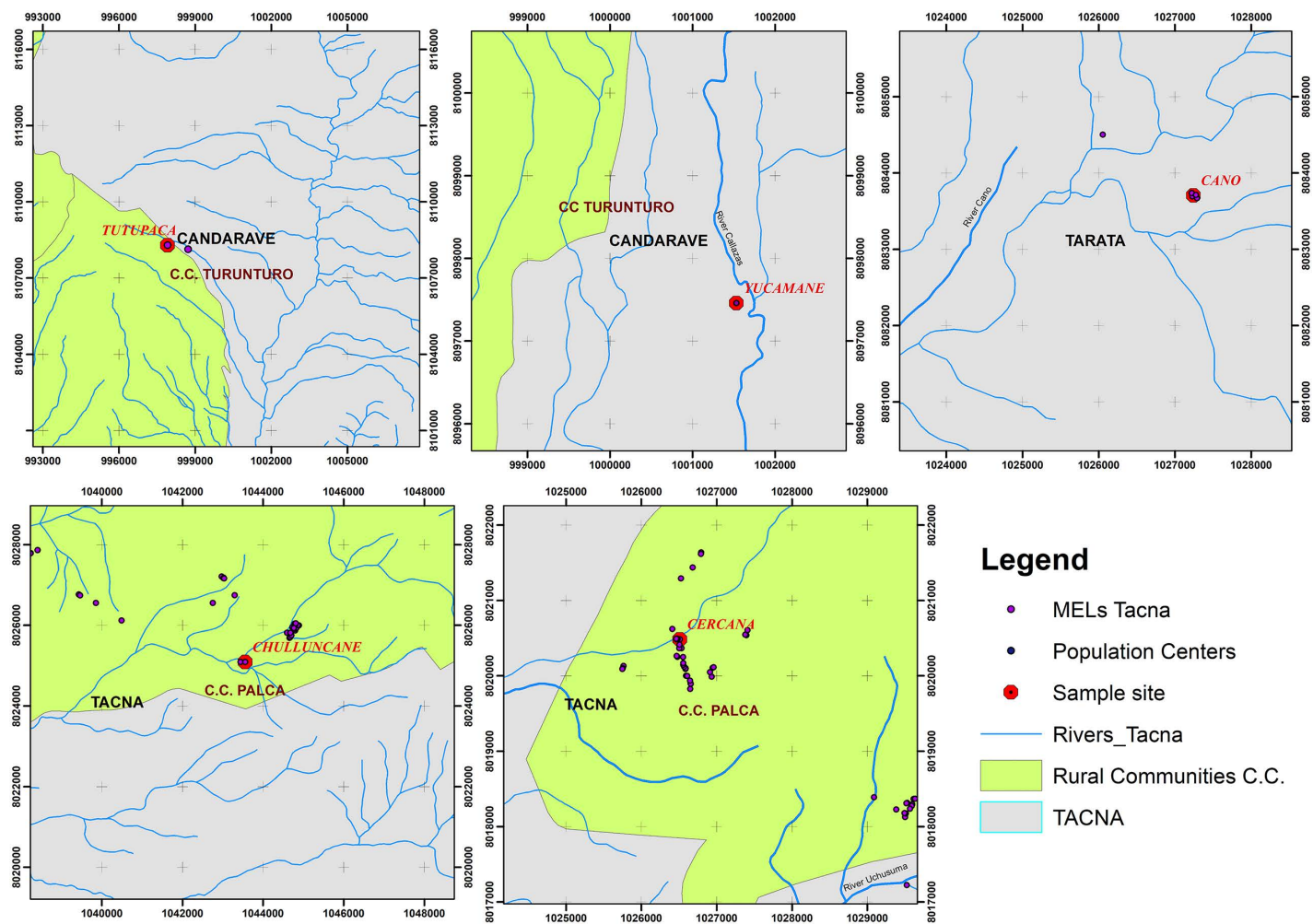
In the case of pH, values exhibited considerable variability among the sites, with extremely acidic conditions (< 2.1) recorded at Tutupaca, Yucamane, and Cano, while neutral conditions (pH 7.41) were observed at Cercana.

A critical finding was the immediate proximity of the sampling points to the region’s main river systems (Caplina, Callazas, Yungani, and Cano), which serve as essential water sources for both rural communities and local ecosystems. Particularly concerning is the location of human settlements, such as Turunturo and Palca, near areas affected by mining environmental liabilities (MELs) (Fig 2). This situation substantially increases the risk of contaminant exposure for surrounding ecosystems and populations, creating a complex environmental risk scenario that demands urgent and site-specific interventions.

This work is particularly relevant since many mining environmental liabilities are located in remote areas with limited accessibility, which hinders their proper characterization by governmental authorities. In most cases, these areas remain abandoned, lack legally identifiable responsible parties, and are not subject to comprehensive contaminant assessments. Based on the findings of this study, a clear environmental risk is associated with the identified contamination, and in the absence of direct responsible parties, it is the responsibility of the State to undertake the remediation and proper characterization of these sites to ensure the protection of ecosystems and the safety of local communities.

### Soil Contamination by Potentially Toxic Elements (PTEs)

The results reveal alarming levels of contamination by potentially toxic elements (PTEs) in soils affected by mining environmental liabilities (MELs) (Table 2), with significantly elevated concentrations (mean ± standard deviation) of at least one contaminant in the studied zones (S1–S5) compared to the reference soil (S6). The concentrations recorded at sites



**Fig 2. Localization of rural communities near environmental liabilities and bodies of water.** Sample site: Tutupaca, Yucamane, Cano, Chulluncane, Cercana. Rural Communities: C.C. Turunturo and C.C. Palca.

<https://doi.org/10.1371/journal.pone.0311470.g002>

impacted by MELs significantly exceeded both the background soil values (TEL) and the permissible limits established by Peruvian environmental regulations (PEL). At the Cercana site, the concentrations of Pb, As, and Cd exceeded the permissible limits by factors of 19, 7, and 11, respectively. Similarly, at Tutupaca and Cano, free cyanide concentrations surpassed the regulatory thresholds by up to eightfold.

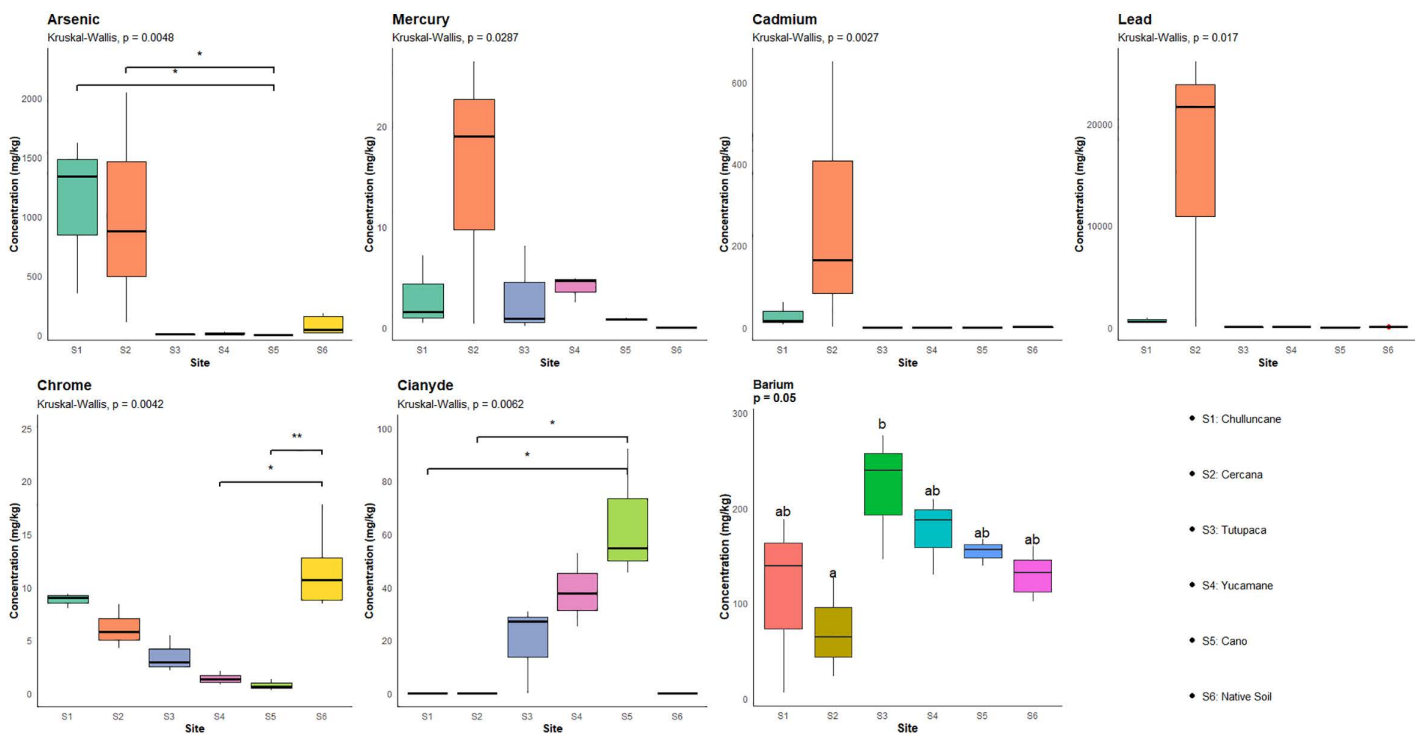
The descending order of PTE concentrations by site was as follows: Chulluncane: As> Pb>Ba>Cd>Cr>Hg>CN>Cr(VI); Cercana: Pb> As> Cd>Ba>Hg>Cr>CN>Cr(VI); Tutupaca: Ba>CN>Pb> As> Cr>Hg>Cr(VI)> Cd; Yucamane: Ba>CN>As> Pb>Hg>Cr>Cr(VI)> Cd; Cano: Ba>CN>Pb> As> Hg>Cr>Cr(VI)> Cd.

The comparative analysis among the evaluated sites (Table 2 and Fig 3) revealed statistically significant differences in the concentrations PTEs ( $p < 0.05$ ). The results demonstrate clear variations in contamination levels, allowing for the precise identification of the most affected areas. This analytical approach is essential for environmental management, as it enables the prioritization of contamination hotspots and informs the design of more effective remediation strategies.

Table 2. Concentration of Potentially Toxic Elements (mg/kg) in the environmental liabilities.

MELs Site	Type	Arsenic (mg/kg)	Barium (mg/kg)	Cadmium (mg/kg)	Chromium (mg/kg)	Mercury (mg/kg)	Lead (mg/kg)	Free Cyanide (mg/kg)	Hexavalent Chromium (mg/kg)
<b>Chulluncane</b>	MEL	1,102.67 ± 665.64**	111.08 ± 94.04 <sup>ab</sup>	27.83 ± 29.35**	8.81 ± 0.68**	3.03 ± 3.58*	620.33 ± 282.05*	0.04 ± 0**	0.03 ± 0 <sup>ns</sup>
<b>Cercana</b>	MEL	1009.67 ± 97.18**	71.47 ± 52.28 <sup>a</sup>	271.63 ± 337.67**	6.14 ± 2.09**	15.26 ± 13.4*	15,961.87 ± 13,953.11*	0.04 ± 0**	0.03 ± 0 <sup>ns</sup>
<b>Tutupaca</b>	MEL	5.15 ± 2.59**	220.33 ± 66.98 <sup>b</sup>	0.02 ± 0**	3.50 ± 1.72**	3.03 ± 4.42*	7.27 ± 2.01*	19.25 ± 16.73**	0.03 ± 0 <sup>ns</sup>
<b>Yucamane</b>	MEL	13.02 ± 9.90**	175.33 ± 40.77 <sup>ab</sup>	0.02 ± 0**	1.42 ± 0.63**	4.00 ± 1.33*	7.28 ± 1.55*	38.53 ± 13.82**	0.03 ± 0 <sup>ns</sup>
<b>Cano</b>	MEL	1.21 ± 0.80**	154.00 ± 14.11 <sup>ab</sup>	0.02 ± 0**	0.76 ± 0.54**	0.82 ± 0.14*	7.53 ± 7.64*	64.03 ± 24.64**	0.03 ± 0 <sup>ns</sup>
<b>Native Soil - TEL</b>	Native Soil	83.18 ± 77.7**	130.20 ± 23.65 <sup>ab</sup>	0.25 ± 0.21**	11.71 ± 3.03**	0.03 ± 0*	18.34 ± 15.63	0.05 ± 0**	0.04 ± 0 <sup>ns</sup>
<b>Peru* - PEL</b>	Industrial soil	140.00	2000.00	22.00	1000.00	24.00	800.00	8.00	1.40
<b>Ecuador*</b>	Soil quality criteria	5	200	0.5	20	0.1	25	0.25	2.5
	Remediation criteria (commercial & industrial only)	15	2000	10	90	10	150	8	1.4
<b>Brazil*</b>	Industrial	150	7300	160	400	7	4400	-	10
	Reference value for quality	3.5	75	<0.5	40	0.05	17	-	-
	Prevention Value	15	120	1.3	75	0.5	72	-	-
<b>Argentina*</b>	Soil quality guideline levels	50	2000	20	800	20	1000	100	-
<b>USA*</b>	SSL Development	5.0E-02	2.00E+00	5.00E-03	1.00E-01	2.00E-03	-	2.0E-01	1.00E-01

<https://doi.org/10.1371/journal.pone.0311470.t002>



**Fig 3.** The concentration of elements analyzed for each MELs. S1: Chulluncane, S2: Cercana, S3: Tutupaca, S4: Yucamane, S5: Cano, S6: Reference site (Native soil).

<https://doi.org/10.1371/journal.pone.0311470.g003>

The inclusion of a reference site, or native soil, characterized by low contaminant concentrations, strengthens the statistical interpretation by providing a baseline against which anthropogenic contamination levels can be assessed, thereby distinguishing natural background conditions from pollution caused by human activities.

Extremely acidic conditions ( $\text{pH} < 2.1$ ) were observed at Chulluncane, Tutupaca, Yucamane, and Cano, which enhance the mobility and bioavailability of heavy metals. Although the concentrations of total chromium (Cr) and its hexavalent form (Cr(VI)) remained below the thresholds established by national regulations, their presence in a highly acidic environment may increase their potential for dispersion and accumulation in the ecosystem.

For datasets with normal distribution, a one-way ANOVA followed by Tukey's post hoc test was applied at a 95% confidence level (different letters indicate significant differences). For data that did not meet the assumption of normality, the Kruskal–Wallis test followed by Dunn's post hoc test was used at the same confidence level.

Significance levels: ns = not significant; \* =  $p < 0.05$  (significant); \*\* =  $p < 0.01$  (highly significant). Statistical tests used: Kruskal–Wallis for Arsenic, Cadmium, Chromium, Mercury, Lead, and Free cyanide; ANOVA for Barium.

Peru\*: Limits established by Supreme Decree No. 011–2017; Ecuador\*: Executive Decree No. 3516; Brazil\*: CETESB Board Decision No 125/2021/E; Argentina\*: Decree No. 831/93 – Regulation of Law No. 24.051; USA\*: EPA/540/R/99/005.

The toxic elements associated with mining environmental liabilities reported in this study represent a source of pollution that raises concerns within the community due to the risks they pose to the ecosystem. In Table 3, presents a compilation of international studies that report on sampling locations, types of mining activities, and the specific contaminant metals investigated, in a manner comparable to the approach used in this study.

**Table 3. Soil contaminants from mining activities.**

Country	City/Region	Sampling location	Mining Extraction Type	Pollutants	Reference
Peru	Tacna	Soils Contaminated by Mining Environmental Liabilities	Cu, S	As, Cd, Pb, Hg, CN <sup>-</sup>	This study
Peru	Cajamarca	Soils Contaminated by Mining Environmental Liabilities	–	As, Ag, Cd, Cu, Pb, and Zn	[11]
China	Daye	Actividades de fundición	Cu	Cd, Cu, Pb, As	[66]
Spain	Madrid	Abandoned Monica mine	Minerals (arsenopyrite, matildite and sphalerite)	As, Cu, Zn, Cd, Pb, W, Ag, Fe	[31]
Mexico	Santa Maria de la Paz	Mining Area	Pb-Zn-Ag (Cu-Au) skarn ore system	As, Cu, Pb y Zn,	[67]
Ghana	Tarkwa, Ashanti, Atewa	Mining areas	Au	As, Cd, Hg, Zn, Co, Cu, Mn, Fe, Al, V, Cr, Pb	[54]
China	Hunan,	Nonferrous metal mine	Zn, Pb	Zn, Pb, Cd, Cu, As	[39,68]
Turkey	Kutahya	Contaminated soils by mining area	Ag	As, Ag, Pb	[69]
Venezuela	Bolívar	Soils Of The Mining Sector	Au	Hg	[70]
Kosovo	K. Mitrovica	soil of mining centres	Pb, Zn, As, Cd	As	[71]
Colombia	In northern Colombia	Soils Contaminated with Mining Activities	Au	Hg, Pb y Cd	[72]
Slovakia	Central Spiš	Soil Heavy Metal Pollution	Cu, Hg	Hg, Zn y Cd	[73]
India	Karnataka	Tailings	Au	Cd, Cu, Pb, Zn	[2,74]
Poland	Zloty Stok	Mining soil	Au, As	As	[75]
Peru	Pasco	soil in mining towns	Ag, Au	Pb	[76]
Kosovo	Mitrovica	Soil and tailing	Pb, Cd, Zn	Pb	[77]
Colombia	Sabana de Bogotá	Soil	–	Pb	[78]
Cyprus	Lefke	Soil and plant	Cu	Fe, Zn, Pb, Cd, Cu, Ni, Cr	[79]
Mexico	San Francisco of Oro (Chihuahua)	Soil	–	Pb, Zn, Cd, As	[80]
Ethiopia	Adola	Sediment, water and plant	Au	Al, Mn, Fe, As, Ni, Cr, Cu, Co, Pb, W, Sb, Mo, Zn, V	[53]
Poland	Tarnobrzeg County	Mining Soil Substrate	S	N, Ca, Mg, Al, S	[81]
China	Hainan	Soils, mine tailing, and groundwater samples	Au	Pb, As, Cd, Hg, CN <sup>-</sup>	[26]

<https://doi.org/10.1371/journal.pone.0311470.t003>

## Environmental indices

**Geoaccumulation index.** Calculations of the Geoaccumulation Index indicate elevated contamination levels at several Mining Environmental Liability (MEL) sites [Table 4](#). Specifically, the Chulluncane MEL exhibits extreme contamination levels for Cd and Hg (5.235 and 5.229, respectively) and strong contamination levels for As and Pb (3.807 and 3.122). The Cercana MEL shows extreme contamination levels for Hg, Pb, and Cd (7.011, 6.585, and 5.713, respectively), as well as high to extreme concentrations of As (4.301).

In Tutupaca, contamination is extreme only for free CN<sup>-</sup> (5.421), while Hg contamination is at high to extreme levels (4.445). The Yucamane MEL exhibits extreme contamination levels for CN<sup>-</sup> and Hg (8.94 and 6.411, respectively), while the Cano MEL shows extreme contamination for free CN<sup>-</sup> (9.671) and high to extreme contamination levels for Hg (4.174).

This analysis underscores the severity of contamination in several locations, highlighting the urgent need to implement mitigation measures and establish continuous monitoring to reduce environmental impacts in these areas.

**Table 4. The study includes the Geoaccumulation Index of environmental liabilities.**

Pollutant	Geoaccumulation Index				
	Chulluncane	Cercana	Tutupaca	Yucamane	Cano
As	3.807	4.301	-2.583	-4.632	-7.777
Ba	-2.135	-1.414	0.341	-0.339	-0.367
Cd	<b>5.235</b>	<b>5.713</b>	-2.392	-2.755	-3.832
Cr	-1.603	-1.701	-2.028	-3.601	-4.348
Hg	<b>5.2289</b>	<b>7.011</b>	4.445	<b>6.411</b>	4.174
Pb	3.122	<b>6.585</b>	-0.682	-1.055	-1.191
CN <sup>-</sup>	-0.907	-0.907	<b>5.421</b>	8.94	<b>9.671</b>
Cr(VI)	-1	-1	-1	-1	-1

$\leq 0$ , Unpolluted;  $0 \leq I\text{-geo} \leq 1$ , Unpolluted to moderately polluted;  $1 \leq I\text{-geo} \leq 2$ , Moderately polluted;  $2 < I\text{-geo} \leq 3$ , Moderately to strongly polluted;  $3 \leq I\text{-geo} \leq 4$ , Strongly polluted;  $4 \leq I\text{-geo} \leq 5$ , Strongly to extremely polluted; and  $5 < I\text{-geo}$ , Extremely high polluted.

<https://doi.org/10.1371/journal.pone.0311470.t004>

### Contamination factor

The results obtained from the Contamination Index ( $C_f$ ), shown in Table 5, provide a framework to understand and quantify the presence of hazardous compounds in the environment caused by Mining Environmental Liabilities (MELs). According to the analysis, sites with  $C_f$  values exceeding 6 indicate a high level of contamination.

The contamination levels were ranked in descending order for each site. In Chulluncane, the order is  $Hg > Cd > As > Pb$ . In Cercana,  $Pb > Hg > Cd > As$ . In Tutupaca,  $CN^- > Hg$ . In Yucamane,  $CN^- > Hg$ . Finally, in the MEL located in Cano,  $CN^- > Hg$ . The predominant contaminants in each MEL are Hg, Pb, and  $CN^-$ , which are particularly significant in terms of environmental impact.

High  $C_f$  values emphasize the substantial influence of anthropogenic contaminants, whereas lower values reflect the geological distribution of soil components, underscoring the need for proper monitoring and management in these areas.

### Pollution load index

The Pollution Load Index (PLI) values obtained for each evaluated site (Fig 4) reflect the levels of contamination by potentially toxic elements (PTEs), in the following descending order: Cercana (12.3) > Chulluncane (4.3) > Yucamane (1.8) > Tutupaca (1.95) > Cano (1.02). The overall average across all evaluated areas was 4.3. All sites exhibit PLI values greater than 1, indicating the presence of contamination likely associated with mining environmental liabilities (MELs). These values may be related to persistent mineral extraction processes, which contribute to the increase in environmental pollution.

Although some sites exhibit considerably high PLI values, statistical analysis did not reveal significant differences among them ( $p=0.05552$ ), as the result was slightly above the 5% significance threshold. Nevertheless, the Cercana site stands out as a critical hotspot due to its elevated contamination index, underscoring the need for complementary assessments and the implementation of targeted remediation measures, even in the absence of statistical significance.

### Degree of contamination, modified degree of contamination, and potential ecological risk

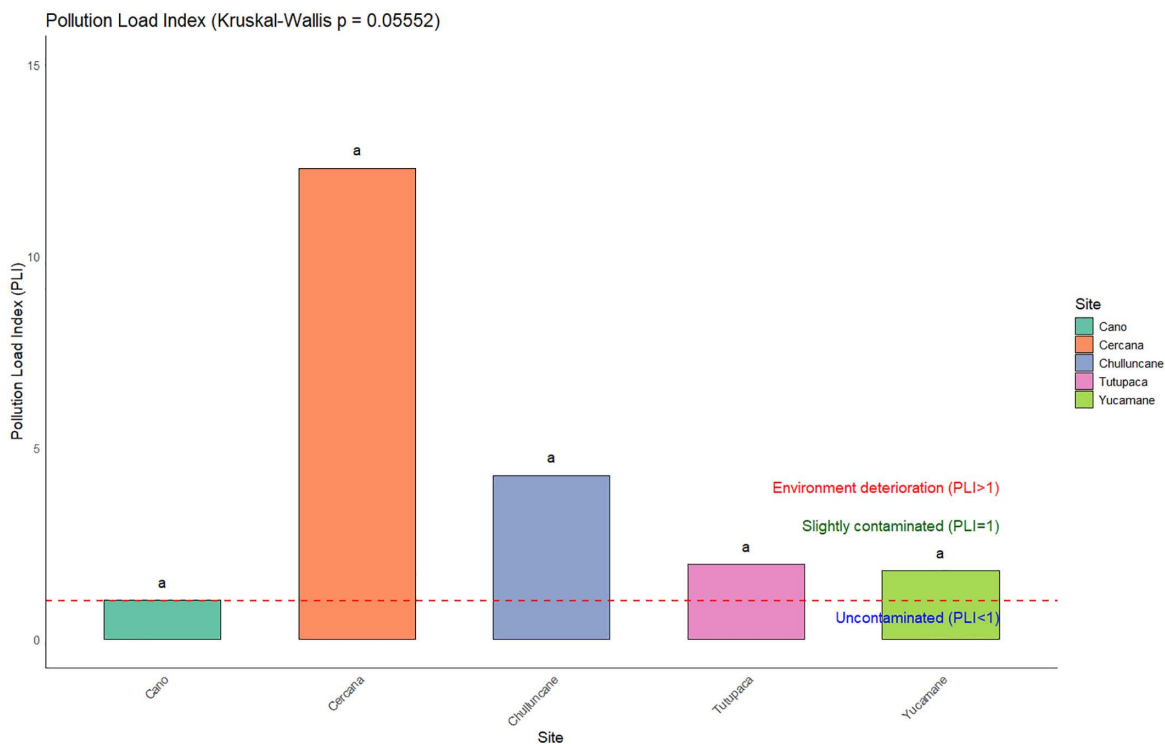
The environmental indices applied ( $Cdeg$  and  $mCdeg$ ), along with the ecological risk index (Er), provided an integrated assessment of contamination intensity and the ecological risk associated with potentially toxic elements (PTEs) at the evaluated sites. These values were compared across sites and classified according to categorical thresholds proposed in the literature, which facilitated the interpretation of contamination and ecological risk levels.

**Table 5. Contamination Factor Index of Environmental Liabilities Included in the Study.**

Pollutant	Pollution Factor				
	Chulluncane	Cercana	Tutupaca	Yucamane	Cano
As	25.367	52.057	0.271	0.072	0.008
Ba	0.694	0.701	1.967	1.209	1.167
Cd	84.333	468.328	0.286	0.222	0.105
Cr	0.495	0.480	0.397	0.13	0.090
Hg	100.856	508.778	101.156	133.444	27.333
Pb	14.003	732.196	0.957	0.734	0.932
CN	0.800	0.800	384.933	770.667	1,280.667
Cr(VI)	0.750	0.750	0.750	0.750	0.750

$C_f < 1$ : low;  $1 \leq C_f < 3$ : moderately;  $3 \leq C_f < 6$ : considerably;  $C_f \geq 6$ , Very high.

<https://doi.org/10.1371/journal.pone.0311470.t005>



**Fig 4. Pollutant Load Index (PLI) for five sites.** A PLI value greater than 1 indicates environmental deterioration. The red dashed line denotes the upper threshold established according to the interpretative scales of the index. The letter 'a' indicates no significant differences between sites (Kruskal-Wallis test with Dunn's post hoc analysis).

<https://doi.org/10.1371/journal.pone.0311470.g004>

According to the results of *Cdeg* and *mCdeg*, all sites exceeded the upper limits defined by the interpretative scales, indicating contamination by multiple PTEs. The highest *Cdeg* value was observed at Cercana (2,640), followed by Cano (1,311), Yucamane (907), Tutupaca (490), and Chulluncane (227). The *mCdeg* index, which minimizes the influence of extreme values and offers a more stable assessment, confirmed this pattern. Cercana again exhibited the highest value

(330), followed by Cano (163), Yucamane (113), Tutupaca (68), and Chulluncane (28). In all cases, both *Cdeg* and *mCdeg* values far exceeded the maximum thresholds of their respective interpretative scales (24 and 32, respectively).

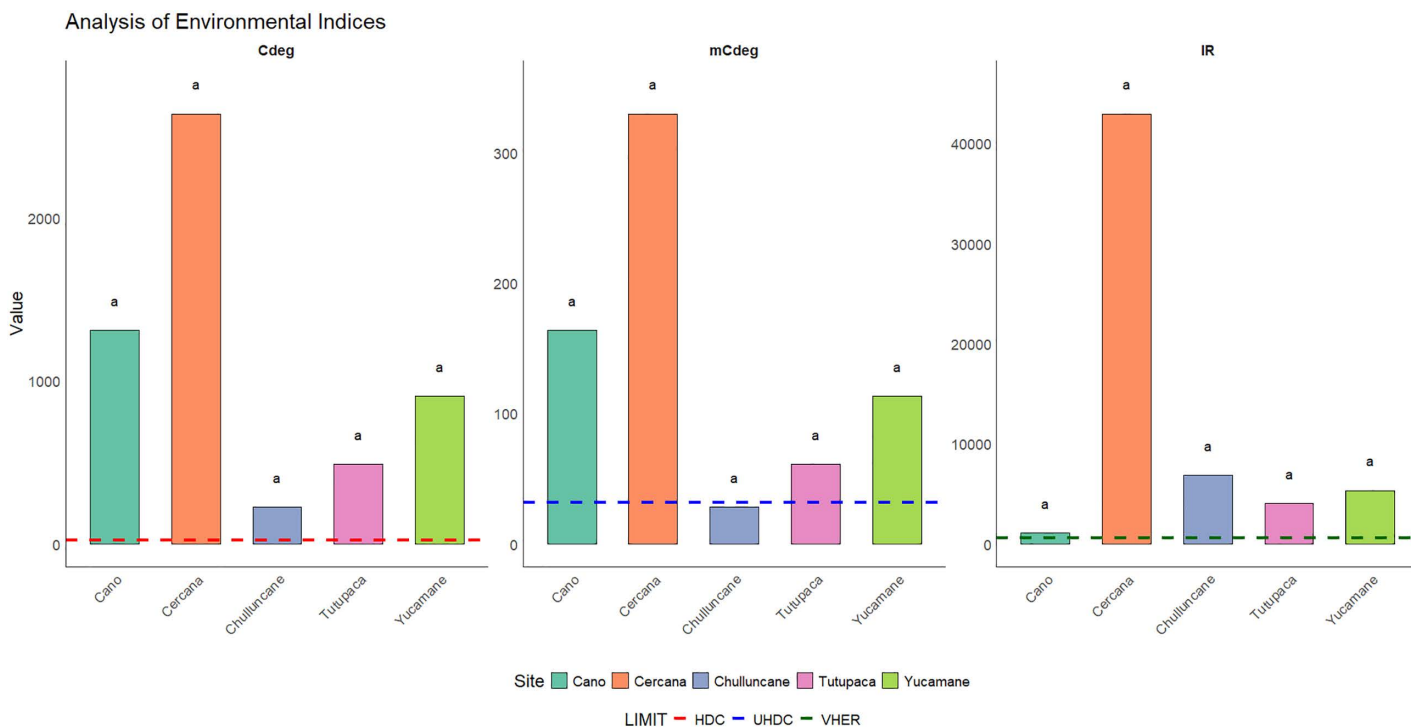
Regarding potential ecological risk (Fig 5), all sites exceeded the established maximum value (600), placing them within the very high ecological risk category. This indicates severe contamination with a significant latent risk, primarily driven by anthropogenic sources of As, Ba, Cd, Hg, Pb, and CN<sup>-</sup>.

Although notable differences in contamination levels were observed among the sites, statistical analysis did not reveal significant differences ( $p > 0.05$ ), possibly due to internal variability. Nevertheless, the magnitude of the recorded indices supports the urgent need for site-specific remediation measures for these mining environmental liabilities.

### Principal component analysis (PCA) of EPT and site distributions

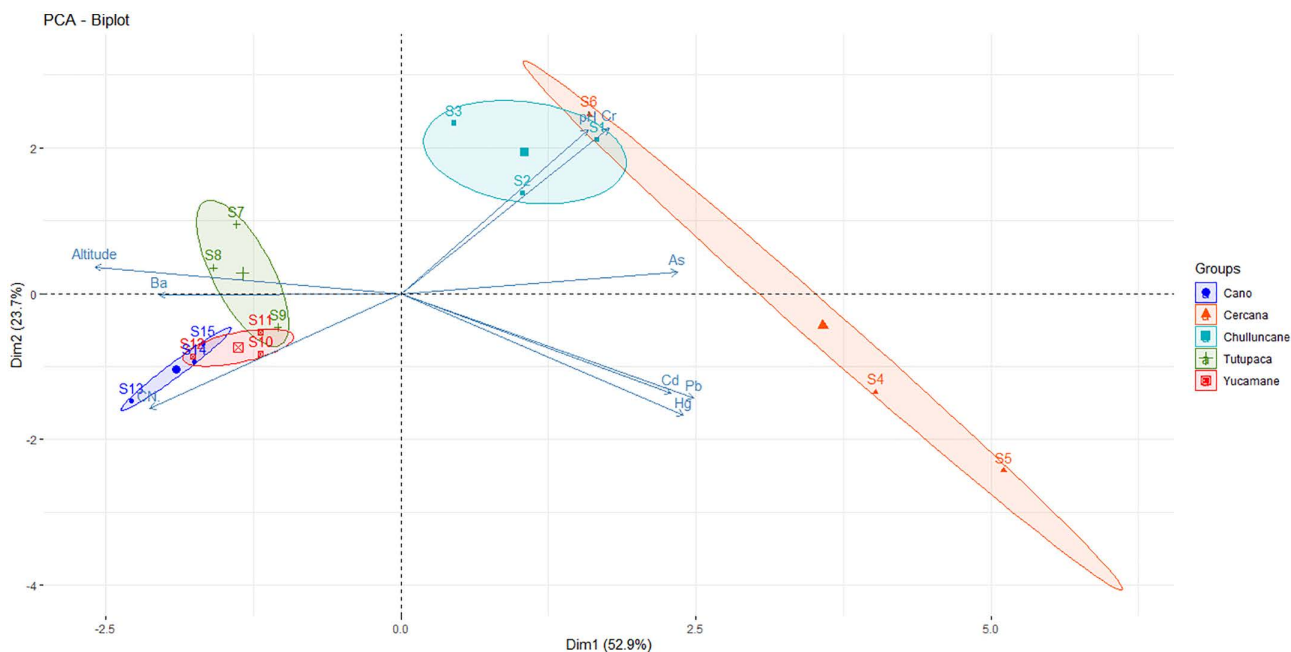
The first two axes of the PCA accounted for 76.6% of the total variance (PC1: 52.9%, PC2: 23.7%), reflecting the relationship between environmental variables, specifically potentially toxic elements (PTEs) and altitude, and the sampling sites associated with mining environmental liabilities, grouped into five zones: Cano, Cercana, Chulluncane, Tutupaca, and Yucamane (Fig 6).

The sites in Cercana (S4–S6) were strongly associated with elevated concentrations of Cr, Pb, and As, while Yucamane (S10–S12) showed a moderate association with Hg and Cd, suggesting a direct influence of mining liabilities in both areas. In contrast, Tutupaca (S7–S9) aligned primarily with altitude and Ba, and Cano (S13–S15) was related to CN<sup>-</sup>, indicating distinct geochemical conditions compared to the other sites. Chulluncane (S1–S3) occupied an



**Fig 5. Potential ecological risk.** The figure illustrates the Degree of Contamination (*Cdeg*), the Modified Degree of Contamination (*mCdeg*), and the Ecological Risk Index (IR). The dotted lines indicate the upper limits established by the interpretative scales for each index: HDC > 24 (high degree of contamination, red line), UHDC ≥ 32 (ultra-high degree of contamination, blue line), and VHER > 600 (very high ecological risk, green line). Statistical analysis was performed using the Kruskal–Wallis test followed by Dunn’s post hoc test. No statistically significant differences were found among the sites ( $p > 0.05$ ); different letters would indicate significant differences.

<https://doi.org/10.1371/journal.pone.0311470.g005>



**Fig 6. Principal Component Analysis (PCA) graphs of EPT concentrations (As, Cd, Cr, Pb, Br, Hg, and CN) and their spatial distribution in environmental sites of S1: Cercana, S2: Chulluncane, S3: Tutupaca, S4: Yucamane, S5: Cano.** Circular lines on the PCA graphs overlap to indicate sampling sites in the same area.

<https://doi.org/10.1371/journal.pone.0311470.g006>

intermediate position, without a strong association with any particular PTE. This analysis reveals distinct geochemical patterns in the distribution of contaminants and highlights the utility of PCA for identifying geochemical variability and assessing the environmental impact of mining liabilities, thereby supporting more effective management and monitoring strategies.

### Correlation between parameters

The Spearman correlation analysis reveals significant relationships between potentially toxic elements, pH, and altitude, offering key insights into environmental processes and the distribution of contaminants in the evaluated areas (Fig 7). Strong positive correlations were observed between Cd/Hg ( $r = 0.87$ ), Cd/Pb ( $r = 0.78$ ), Hg/Pb ( $r = 0.91$ ),  $\text{CN}^-/\text{Cr}$  ( $r = -0.77$ ), As/Cr ( $r = 0.59$ ), As/Hg ( $r = 0.55$ ), and  $\text{CN}^-/\text{pH}$  ( $r = 0.71$ ). These associations suggest a shared contamination source, likely linked to mining environmental liabilities, as well as similar environmental processes governing their distribution. In addition, the positive correlation between Cr and pH ( $r = 0.79$ ) indicates that less acidic conditions may reduce chromium mobility in soils, thereby limiting its dispersion. Negative correlations were also relevant. The strong inverse relationship between  $\text{CN}^-$  and Cr ( $-0.77$ ) reflects differences in geochemical behavior or origin. Likewise, the negative correlations of Pb ( $-0.76$ ) and Hg ( $-0.67$ ) with altitude, reflecting that the concentrations of these metals decrease in higher-altitude zones, possibly due to topographic and climatic factors that limit their deposition or transport.

Overall, these correlations highlight the interaction between chemical (pH) and geographic (altitude) factors and the concentrations of potentially toxic elements in mining environmental liabilities. The co-occurrence of elements such as Cd, Hg, and Pb supports the interpretation of a common anthropogenic origin, likely derived from similar pollution sources associated with past mining activities.

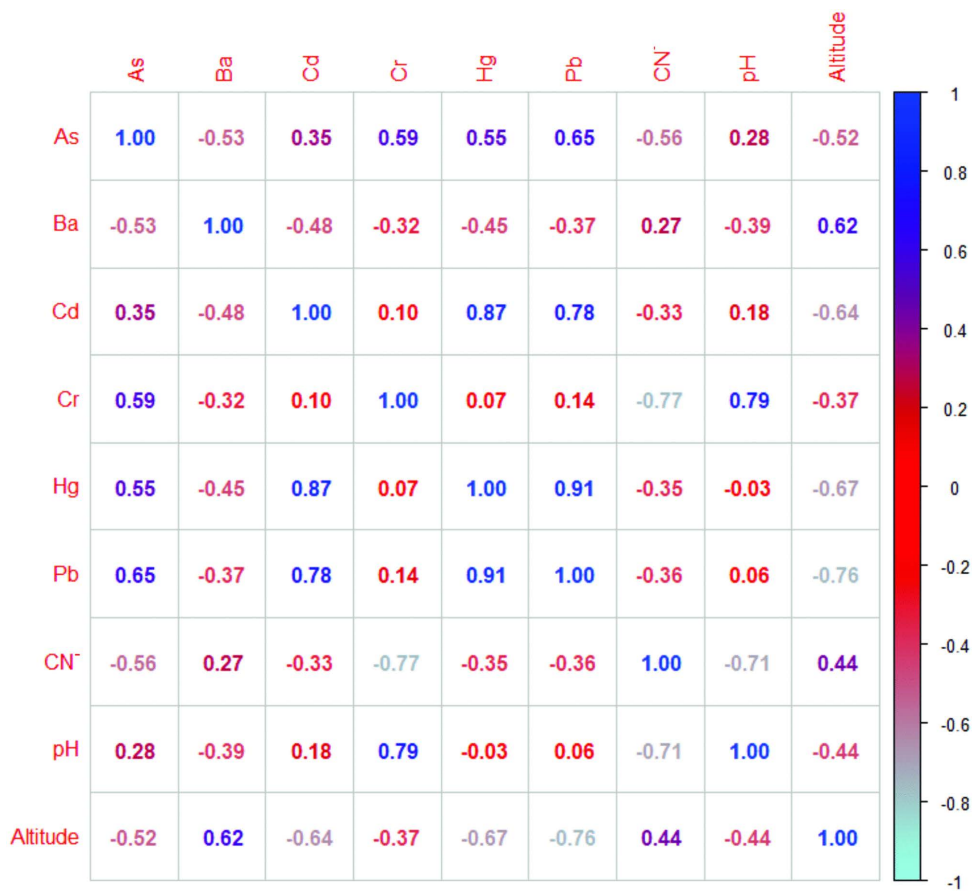


Fig 7. Spearman rank order correlation for selected parameters analyzed in soil samples from mining environmental liabilities.

<https://doi.org/10.1371/journal.pone.0311470.g007>

## Discussion

The mining environmental liabilities (MELs) evaluated in this study represent a critical threat due to the presence of potentially toxic elements (PTEs), primarily Pb, As, Cd, and CN<sup>-</sup>. The proximity of these sites to water bodies, rural communities, and agricultural and livestock activities increases the risk of contaminant dispersion into surrounding ecosystems [27,66,82]. This situation compromises ecological stability, affecting hydrological systems such as the Caplina, Callazas, Yungani, and Cano rivers, as well as vulnerable populations, including Turunturo and Palca [82,83]. These conditions create a scenario of high environmental vulnerability, especially in areas with limited access to drinking water and health-care services. Furthermore, surface runoff and infiltration facilitate the transport of contaminants, amplifying their impact on ecosystem functionality and public health [82,84]. The detection of extremely acidic pH levels (pH < 2.1) in sites such as Tutupaca, Yucamane, and Cano confirms the persistence of acid mine drainage processes [29,30], a condition that promotes the solubility, mobility, and bioavailability [26]. Although total chromium and Cr(VI) concentrations did not exceed regulatory thresholds, their coexistence with acidic conditions suggests a potential risk of toxicity and accumulation across ecosystem compartments.

Historically, the absence of environmental regulations and restoration programs has facilitated the accumulation of MELs in Peru [9,13,19]. This situation is exacerbated by the high concentrations of PTEs, their persistent toxicity, the lack of detailed studies in remote areas, and the limited implementation of remediation strategies [21,26,85].

The average concentrations of PTEs in most evaluated sites exceeded TEL and PEL values, indicating severe multi-element contamination in degraded mining environments [26]. The heterogeneous distribution of contaminants such as As, Pb, Ba, Cd, Cr, Hg,  $\text{CN}^-$ , and Cr(VI), with significant differences between sites ( $p < 0.05$ ), suggests a combined influence of substrate mineralogy and the specific extractive practices employed during extraction, milling, and smelting [86]. Our findings are consistent with studies conducted in the Peruvian Andes, where markedly elevated concentrations of Pb, Zn, As, Cu, Ag, and Cd were reported in areas impacted by MELs [1]. Additionally, studies in abandoned mines have identified the presence of As, Cd, Cr, Co, Cu, Pb, Mn, Ni, and Zn, with distributions influenced by both geological factors and anthropogenic sources [56,87]. Acid drainage has also been documented in inactive mining sites, with the release of metals such as Al, Ca, Co, Cu, Fe, Mg, Mn, Ni, and Zn, mainly accumulating due to exposed waste that can act as geochemical barriers and alter migration pathways [29]. In particular, arsenic can cause severe health effects, including carcinogenic risks [25,32,88]. The presence of As is often associated with copper and gold-copper deposits. Elevated concentrations have been reported in abandoned mines and tailings areas [89]. For instance, in Salamanca (Spain), extreme levels of As ( $>1,000 \text{ mg/kg}$ ) have been attributed to altered granites or metamorphic rocks containing sulfides [67,90]. In ancient mining zones, concentrations reached up to  $29,000 \text{ mg/kg}$  [67]. In Cajamarca, Pb and As exceeded soil quality standards, while Cd remained within permissible limits [11]. In Tacna, our results showed concentrations up to  $650 \text{ mg/kg}$  for Cd,  $2,046 \text{ mg/kg}$  for As, and  $16,000 \text{ mg/kg}$  for Pb, with some samples reaching  $26,131 \text{ mg/kg}$  of Pb,  $650 \text{ mg/kg}$  of Cd, and  $92 \text{ mg/kg}$  of free cyanide, representing severe ecological risks. These findings reinforce the evidence that MELs are persistent contamination hotspots with critical implications for environmental management and ecosystem health [60].

The environmental indices applied in this study (I-geo, *Cf*, PLI, *Cdeg*, and *mCdeg*) provide a robust quantitative framework for assessing the magnitude, extent, and ecological implications of contamination associated with MELs. The combined analysis of I-geo and *Cf* revealed critical environmental effects for at least one PTE at all sites, particularly As, Cd, Hg, Pb, and  $\text{CN}^-$ , with the highest intensities at Cercana and Chulluncane, suggesting a strong anthropogenic influence. The PLI indicated progressive environmental degradation, identifying Cercana (PLI = 12.3) as a critical contamination hotspot. These elevated values reflect the persistence of unresolved contamination sources, reinforcing the role of MELs as major contributors to environmental pollution. The *Cdeg* and *mCdeg* indices confirmed widespread contamination, while the RI index classified all sites as having very high ecological risk [24]. Although no statistically significant differences were found between sites ( $p > 0.05$ ), the magnitude of the recorded values supports the urgent need for site-specific and prioritized remediation strategies.

Principal Component Analysis (PCA) identified distinct geochemical patterns, with Cercana and Yucamane associated with high concentrations of Cr, Pb, As, Hg, and Cd [60], while Cano showed a strong relationship with  $\text{CN}^-$ . These trends were consistent with the results of Spearman correlation analysis, which revealed positive associations among Cd, Hg, and Pb, as well as significant relationships between PTEs, pH, and altitude. The positive correlation between Cr and pH suggests lower mobility under neutral conditions, while the negative correlations with altitude indicate reduced concentrations of Pb and Hg at higher elevations, potentially due to topographic or climatic constraints [67,91].

Persistent contamination patterns associated with MELs were identified, posing a severe environmental risk exacerbated by local climatic conditions. Rainfall runoff and nearby water bodies may facilitate contaminant transport toward adjacent communities such as Turunturo and Palca, increasing exposure to mining residues [82,84]. The potential entry of PTEs into water bodies [13,26,92], agricultural soils, and crops [22], represents a serious threat to ecosystems [93], compromising biodiversity and posing health risks through ingestion, inhalation, and dermal contact [87,88,94]. Moreover, carcinogenic effects on lungs, liver, kidneys, bladder, and breast tissue have been documented, along with cardiopulmonary disorders and gene expression alterations [87,88,95,96]. Chronic exposure has also been linked to diseases such as Alzheimer's, osteoporosis, diarrhea, and vomiting [6], as well as social impacts on vulnerable communities [3,25,80].

These findings reaffirm the magnitude of the environmental problem associated with MELs in high Andean regions and highlight the consequences of the historical absence of environmental regulation and management. The methodological convergence of multiple indices and multivariate analyses provides a solid scientific basis for establishing intervention priorities. It is recommended to design and implement long-term environmental remediation, ecological restoration, and systematic monitoring strategies aimed at mitigating the impacts of PTEs on ecosystems and human health [26].

## Conclusions

Mining environmental liabilities (MEL) pose a critical problem due to the extremely high concentrations of arsenic, cadmium, lead, free cyanide, and mercury, which significantly exceed regulatory standards and create an extreme ecological risk to local biota and surrounding areas. Pollution and ecological risk indices (*I-geo*, *Cf*, *PLI*, *Cdeg*, *IR*, *Eri*) have highlighted severe environmental impacts, while multivariate analysis revealed multiple contamination sources and the coexistence of toxic elements influenced by similar environmental processes. These conditions, compounded by the proximity to flora, fauna, water bodies, and rural communities, underscore the urgent need for mitigation strategies.

It is imperative to establish continuous monitoring programs, implement sustainable remediation strategies, and develop policies that prioritize reducing the contaminant load and restoring degraded ecosystems. The lack of a situational diagnosis has delayed mitigation actions, leaving these liabilities unaddressed. Globally, MEL represents a significant environmental challenge, demanding the adoption of international management standards and sustainable technological strategies to balance mining activity with environmental conservation and sustainable development.

## Supporting information

**S1 Table. Concentrations of Heavy Metals in Soils from Mining Environmental Liabilities and Native Soils.** (XLSX)

## Acknowledgments

The authors express their heartfelt gratitude to Remediation Laboratory at the National University Jorge Basadre Grohmann for the invaluable technical and logistical support provided, which was crucial to the successful completion of this study. Special thanks are extended to María Angélica Pacoticona Ccoa and Niccol Milagros Paredes Jahaira for their exceptional editorial assistance.

## Author contributions

**Conceptualization:** César Julio Cáceda Quiroz, Milena Carpio Mamani.

**Data curation:** César Julio Cáceda Quiroz, Gisela July Maraza Choque, Gabriela De Lourdes Fora Quispe, Milena Carpio Mamani.

**Formal analysis:** César Julio Cáceda Quiroz, Milena Carpio Mamani.

**Funding acquisition:** César Julio Cáceda Quiroz.

**Investigation:** César Julio Cáceda Quiroz, Milena Carpio Mamani.

**Methodology:** César Julio Cáceda Quiroz, Gisela July Maraza Choque, Gabriela De Lourdes Fora Quispe, Diana Galeska Farfan Pajuelo, Edwin Denis Obando Velarde, Milena Carpio Mamani.

**Project administration:** César Julio Cáceda Quiroz, Milena Carpio Mamani.

**Software:** Milena Carpio Mamani.

**Supervision:** César Julio Cáceda Quiroz, Milena Carpio Mamani.

**Validation:** César Julio Cáceda Quiroz, Milena Carpio Mamani.

**Writing – original draft:** César Julio Cáceda Quiroz, Gisela July Maraza Choque, Gabriela De Lourdes Fora Quispe, Diana Galeska Farfan Pajuelo, Edwin Denis Obando Velarde, Milena Carpio Mamani.

**Writing – review & editing:** César Julio Cáceda Quiroz, Fulvia Chiampo, Milena Carpio Mamani.

## References

1. Cruzado-Tafur E, Torró L, Bierla K, Szpunar J, Tauler E. Heavy metal contents in soils and native flora inventory at mining environmental liabilities in the Peruvian Andes. *J South American Earth Sciences*. 2021;106:103107. <https://doi.org/10.1016/j.jsames.2020.103107>
2. Krishna AK, Mohan KR, Murthy NN, Periasamy V, Bipinkumar G, Manohar K, et al. Assessment of heavy metal contamination in soils around chromite mining areas, Nuggihalli, Karnataka, India. *Environ Earth Sci*. 2013;70(2):699–708. <https://doi.org/10.1007/s12665-012-2153-6>
3. Alengebawy A, Abdelkhalik ST, Qureshi SR, Wang M-Q. Heavy Metals and Pesticides Toxicity in Agricultural Soil and Plants: Ecological Risks and Human Health Implications. *Toxics*. 2021;9(3):42. <https://doi.org/10.3390/toxics9030042> PMID: 33668829
4. Ojuederie OB, Babalola OO. Microbial and Plant-Assisted Bioremediation of Heavy Metal Polluted Environments: A Review. *Int J Environ Res Public Health*. 2017;14(12):1504. <https://doi.org/10.3390/ijerph14121504> PMID: 29207531
5. Briffa J, Sinagra E, Blundell R. Heavy metal pollution in the environment and their toxicological effects on humans. *Heliyon*. 2020;6(9):e04691. <https://doi.org/10.1016/j.heliyon.2020.e04691> PMID: 32964150
6. Mitra S, Chakraborty AJ, Tareq AM, Emran TB, Nainu F, Khuroo A, et al. Impact of heavy metals on the environment and human health: Novel therapeutic insights to counter the toxicity. *J King Saud University - Science*. 2022;34(3):101865. <https://doi.org/10.1016/j.jksus.2022.101865>
7. Wuana RA, Okieimen FE. Heavy Metals in Contaminated Soils: A Review of Sources, Chemistry, Risks and Best Available Strategies for Remediation. *ISRN Ecology*. 2011;2011:1–20. <https://doi.org/10.5402/2011/402647>
8. Candeias C, Ávila P, Coelho P, Teixeira JP. Mining Activities: Health Impacts. *Encyclopedia of Environmental Health*. Elsevier. 2019. p. 415–35. <https://doi.org/10.1016/b978-0-12-409548-9.11056-5>
9. Oblasser A. Estudio sobre lineamientos, incentivos y regulación para el manejo de los pasivos ambientales mineros (PAM), incluyendo cierre de faenas mineras. Naciones Unidas, CEPAL, Div. de Recursos Naturales e Infraestructura. 2016. <https://repositorio.cepal.org/server/api/core/bitstreams/6898ae47-8d37-47b3-872b-026cbaeb41fe/content>
10. M I N A M. Aprueban estándares de calidad ambiental (ECA) para suelo. *El Peruano*. 2017.
11. Cruzado-Tafur E, Bierla K, Torró L, Szpunar J. Accumulation of As, Ag, Cd, Cu, Pb, and Zn by Native Plants Growing in Soils Contaminated by Mining Environmental Liabilities in the Peruvian Andes. *Plants (Basel)*. 2021;10(2):241. <https://doi.org/10.3390/plants10020241> PMID: 33513684
12. Guzmán F, Arranz JC, Smoll LF, Collahuazo L, Calderón E, Otero O. Pasivos Ambientales Mineros, manual para el inventario de minas abandonadas o paralizadas. 2020. <https://app.ingemmet.gob.pe/biblioteca/pdf/ASGMI-52.pdf>
13. Bini C, Maleci L, Wahsha M. Mine Waste: Assessment of Environmental Contamination and Restoration. *Assessment, Restoration and Reclamation of Mining Influenced Soils*. Elsevier. 2017. p. 89–134. <https://doi.org/10.1016/b978-0-12-809588-1.00004-9>
14. Aguilar-Pesantes A, Peña Carpio E, Vítvar T, Koepke R, Menéndez-Aguado JM. A Comparative Study of Mining Control in Latin America. *Mining*. 2021;1(1):6–18. <https://doi.org/10.3390/mining1010002>
15. Tamayo-Ortiz M, Riojas-Rodríguez H, Téllez-Rojo MM, Boischio A, Mañay N, Menezes-Filho JA, et al. A Call for Biomonitoring Systems in Latin America and the Caribbean: Considerations for Potentially Toxic Metals/Metalloids. *Ann Glob Health*. 2022;88(1):80. <https://doi.org/10.5334/aogh.3637> PMID: 36185997
16. Castillo L, Satalaya C, Paredes Ú, Encalada M, Zamora J, Cuadros M. Pasivos ambientales mineros en el Perú: resultados de la auditoría de desempeño sobre gobernanza para el manejo integral de los PAM. 2021. <https://cdn.www.gob.pe/uploads/document/file/2135978/Pasivos%20ambientales%20mineros%20en%20el%20Per%C3%BA.pdf.pdf?v=1629917547https://repositorio.contraloria.gob.pe/items/69417547-4404-4929-8d9b-64cfc600f079>
17. MINEM RM. Ley N° 28271. MINEM. 2025. 1–3. <https://www.gob.pe/institucion/minem/normas-legales/6496380-056-2025-minem-dm>
18. MINEM. Mapa de principales unidades mineras en producción 2024. gob.pe. <https://www.gob.pe/institucion/minem/informes-publicaciones/5724261-mapa-de-principales-unidades-mineras-en-produccion-2024>. 2024. Accessed 2025 June 19.
19. Oblasser A, Chaparro AE. Estudio comparativo de la gestión de los pasivos ambientales mineros en Bolivia, Chile, Perú y Estados Unidos. Santiago de Chile: Naciones Unidas, CEPAL, Div. de Recursos Naturales e Infraestructura. 2008.
20. Unger CJ, Lechner AM, Kenway J, Glenn V, Walton A. A jurisdictional maturity model for risk management, accountability and continual improvement of abandoned mine remediation programs. *Resources Policy*. 2015;43:1–10. <https://doi.org/10.1016/j.resourpol.2014.10.008>
21. Favas PJC, Martino LE, Prasad MNV. Abandoned Mine Land Reclamation—Challenges and Opportunities (Holistic Approach). *Biogeotechnologies for Mine Site Rehabilitation*. Elsevier. 2018. p. 3–31. <https://doi.org/10.1016/b978-0-12-812986-9.00001-4>
22. Mayes WM, Jarvis AP. Remediation of Aquatic Post-Industrial Inorganic Pollutants. *Encyclopedia of Environmental Health*. Elsevier. 2011. p. 789–800. <https://doi.org/10.1016/b978-0-444-52272-6.00047-7>

23. Shahid M, Khalid S, Abbas G, Shahid N, Nadeem M, Sabir M, et al. Heavy Metal Stress and Crop Productivity. *Crop Production and Global Environmental Issues*. Cham:Springer International Publishing. 2015. p. 1–25. [https://doi.org/10.1007/978-3-319-23162-4\\_1](https://doi.org/10.1007/978-3-319-23162-4_1)
24. Salgado-Almeida B, Falquez-Torres DA, Romero-Crespo PL, Valverde-Armas PE, Guzmán-Martínez F, Jiménez-Oyola S. Risk Assessment of Mining Environmental Liabilities for Their Categorization and Prioritization in Gold-Mining Areas of Ecuador. *Sustainability*. 2022;14(10):6089. <https://doi.org/10.3390/su14106089>
25. Adeloju SB, Khan S, Patti AF. Arsenic Contamination of Groundwater and Its Implications for Drinking Water Quality and Human Health in Under-Developed Countries and Remote Communities—A Review. *Applied Sciences*. 2021;11(4):1926. <https://doi.org/10.3390/app11041926>
26. Chen M-H, Yu X-Z, Feng Y-X. Tracing the pollution and human risks of potentially toxic elements in agricultural area nearby the cyanide baths from an active private gold mine in Hainan Province, China. *Environ Geochem Health*. 2022;44(10):3279–96. <https://doi.org/10.1007/s10653-021-01038-2> PMID: 34529245
27. Lidman J, Olid C, Bigler C, Berglund ÅMM. Effect of past century mining activities on sediment properties and toxicity to freshwater organisms in northern Sweden. *Sci Total Environ*. 2023;872:162097. <https://doi.org/10.1016/j.scitotenv.2023.162097> PMID: 36764540
28. Kim HS, Kim YJ, Seo YR. An Overview of Carcinogenic Heavy Metal: Molecular Toxicity Mechanism and Prevention. *J Cancer Prev*. 2015;20(4):232–40. <https://doi.org/10.15430/JCP.2015.20.4.232> PMID: 26734585
29. Semenkov I, Sharapova A, Lednev S, Yudina N, Karpachevskiy A, Klink G, et al. Geochemical Partitioning of Heavy Metals and Metalloids in the Ecosystems of Abandoned Mine Sites: A Case Study within the Moscow Brown Coal Basin. *Water*. 2022;14(1):113. <https://doi.org/10.3390/w14010113>
30. Sidkina ES, Soldatova EA, Cherkasova EV, Konyshv AA, Vorobey SS, Mironenko MV. Fate of Heavy Metals in the Surface Water-Dump Rock System of the Mine Lupikko I (Karelia): Field Observations and Geochemical Modeling. *Water*. 2022;14(21):3382. <https://doi.org/10.3390/w14213382>
31. García-Giménez R, Jiménez-Ballesta R. Mine tailings influencing soil contamination by potentially toxic elements. *Environ Earth Sci*. 2017;76(1). <https://doi.org/10.1007/s12665-016-6376-9>
32. Liu H, Xie J, Cheng Z, Wu X. Characteristics, Chemical Speciation and Health Risk Assessment of Heavy Metals in Paddy Soil and Rice around an Abandoned High-Arsenic Coal Mine Area, Southwest China. *Minerals*. 2023;13(5):629. <https://doi.org/10.3390/min13050629>
33. Ballesta RJ. *Introducción a la contaminación de suelos*. España: Mundi Prensa Libros. 2017.
34. Ramappa HE, Muniswamy D. Spatial Distribution of Heavy Metals around the Gold Mine Ore Tailings of Hatti, Karnataka State, India. *Landsc environ*. 2017;11(1):35–44. <https://doi.org/10.21120/le/11/1/4>
35. Gunjyal N, Rani S, Asgari Lajayer B, Senapathi V, Astatkie T. A review of the effects of environmental hazards on humans, their remediation for sustainable development, and risk assessment. *Environ Monit Assess*. 2023;195(6):795. <https://doi.org/10.1007/s10661-023-11353-z> PMID: 37264257
36. Zhou Z, Peng C, Liu X, Jiang Z, Guo Z, Xiao X. Pollution and Risk Assessments of Heavy Metal(loid)s in the Soil around Lead-Zinc Smelteries via Data Integration Analysis. *Int J Environ Res Public Health*. 2022;19(15):9698. <https://doi.org/10.3390/ijerph19159698> PMID: 35955055
37. Adnan M, Xiao B, Xiao P, Zhao P, Li R, Bibi S. Research Progress on Heavy Metals Pollution in the Soil of Smelting Sites in China. *Toxics*. 2022;10(5):231. <https://doi.org/10.3390/toxics10050231> PMID: 35622644
38. Hakanson L. An ecological risk index for aquatic pollution control: a sedimentological approach. *Water Res*. 1980;14(8):975–1001. [https://doi.org/10.1016/0043-1354\(80\)90143-8](https://doi.org/10.1016/0043-1354(80)90143-8)
39. HUANG S. Fractional distribution and risk assessment of heavy metal contaminated soil in vicinity of a lead/zinc mine. *Transactions of Nonferrous Metals Society of China*. 2014;24(10):3324–31. [https://doi.org/10.1016/s1003-6326\(14\)63473-7](https://doi.org/10.1016/s1003-6326(14)63473-7)
40. MINEM. *Anuario minero 2024*. 1ra ed. ed. Lima: Ministerio de Energía y Minas. 2025.
41. Dong J, Ma R, Cai P, Liu P, Yue H, Zhang X, et al. Effect of sample number and location on accuracy of land use regression model in NO2 prediction. *Atmospheric Environment*. 2021;246:118057. <https://doi.org/10.1016/j.atmosenv.2020.118057>
42. Ahmed SK. How to choose a sampling technique and determine sample size for research: A simplified guide for researchers. *Oral Oncology Reports*. 2024;12:100662. <https://doi.org/10.1016/j.oor.2024.100662>
43. Akenga T, Sudoi V, Opande W, Kerich E. Status of agricultural soil contamination by heavy metals in Uasin Gishu County. *J Environ Earth Sci*. 2016;6:168–75.
44. Wanjala FO, Hashim NO, Otwoma D, Nyambura C, Kebwaro J, Ndege M, et al. Environmental assessment of heavy metal pollutants in soils and water from Ortum, Kenya. *Environ Monit Assess*. 2020;192(2):118. <https://doi.org/10.1007/s10661-020-8070-3> PMID: 31950287
45. Al-Anbari R, Al Obaidy AHMJ, Abd Ali FH. Pollution loads and ecological risk assessment of heavy metals in the urban soil affected by various anthropogenic activities. *Int J Adv Res*. 2015;3:104–10.
46. Wang Q, Wang J, Cheng J, Zhu Y, Geng J, Wang X, et al. A New Method for Ecological Risk Assessment of Combined Contaminated Soil. *Toxics*. 2023;11(5):411. <https://doi.org/10.3390/toxics11050411> PMID: 37235226
47. MINAM. *Guía para el muestreo de suelos*. Lima: Biblioteca Nacional del Perú. 2014. <https://www.minam.gob.pe/calidadambiental/wp-content/uploads/sites/22/2013/10/GUIA-PARA-EL-MUESTREO-DE-SUELOS-final.pdf>

48. EPA. Method 6020A (SW-846). Inductively Coupled Plasma - Mass Spectrometry. United States Environment Protection Agency. 1998. [https://19january2017snapshot.epa.gov/homeland-security-research/epa-method-6020a-sw-846-inductively-coupled-plasma-mass-spectrometry\\_.html](https://19january2017snapshot.epa.gov/homeland-security-research/epa-method-6020a-sw-846-inductively-coupled-plasma-mass-spectrometry_.html)
49. USEPA. SW-846 Test Method 9013A. Cyanide Extraction Procedure for Solids and Oils. United States Environment Protection Agency. 2014. <https://www.epa.gov/hw-sw846/sw-846-test-method-9013a-cyanide-extraction-procedure-solids-and-oils>
50. USEPA. Determination of hexavalent chromium in drinking water, groundwater and industrial wastewater effluents by ion chromatography. Summit Environmental Technologies. 1996. <https://settek.com/EPA-Method-7199/>
51. USEPA. Method 9045D. Soil and waste pH. Summit Environmental Technologies. 2004. <https://settek.com/EPA-Method-9045D/>
52. Alam MS, Akter S, Shemul S, Chowdhury TR, Ara S. Assessing the quality and heavy metal contamination of soil in tea gardens around Magurchara gas blowout in Bangladesh using multivariate and soil quality index methods. *J Hazardous Materials Advances*. 2022;7:100127. <https://doi.org/10.1016/j.hazadv.2022.100127>
53. Getaneh W, Alemayehu T. Metal contamination of the environment by placer and primary gold mining in the Adola region of southern Ethiopia. *Environ Geol*. 2006;50(3):339–52. <https://doi.org/10.1007/s00254-006-0213-5>
54. Hadzi GY, Ayoko GA, Essumang DK, Osae SKD. Contamination impact and human health risk assessment of heavy metals in surface soils from selected major mining areas in Ghana. *Environ Geochem Health*. 2019;41(6):2821–43. <https://doi.org/10.1007/s10653-019-00332-4> PMID: [31190126](https://pubmed.ncbi.nlm.nih.gov/31190126/)
55. Mavakala BK, Sivalingam P, Laffite A, Mulaji CK, Giuliani G, Mpiana PT, et al. Evaluation of heavy metal content and potential ecological risks in soil samples from wild solid waste dumpsites in developing country under tropical conditions. *Environmental Challenges*. 2022;7:100461. <https://doi.org/10.1016/j.envc.2022.100461>
56. Adimalla N, Qian H, Wang H. Assessment of heavy metal (HM) contamination in agricultural soil lands in northern Telangana, India: an approach of spatial distribution and multivariate statistical analysis. *Environ Monit Assess*. 2019;191(4):246. <https://doi.org/10.1007/s10661-019-7408-1> PMID: [30915588](https://pubmed.ncbi.nlm.nih.gov/30915588/)
57. Heidari A, Kumar V, Keshavarzi A. Appraisal of metallic pollution and ecological risks in agricultural soils of Alborz province, Iran, employing contamination indices and multivariate statistical analyses. *Int J Environ Health Res*. 2021;31(6):607–25. <https://doi.org/10.1080/09603123.2019.1677864> PMID: [31612727](https://pubmed.ncbi.nlm.nih.gov/31612727/)
58. Li P, Wu J, Qian H, Zhou W. Distribution, enrichment and sources of trace metals in the topsoil in the vicinity of a steel wire plant along the Silk Road economic belt, northwest China. *Environ Earth Sci*. 2016;75(10). <https://doi.org/10.1007/s12665-016-5719-x>
59. Müller G. Schadstoffe in Sedimenten - Sedimente als Schadstoffe. *Mitteilungen Österr Geol Ges*. 1986;79:107–26.
60. Sun Z, Xie X, Wang P, Hu Y, Cheng H. Heavy metal pollution caused by small-scale metal ore mining activities: A case study from a polymetallic mine in South China. *Sci Total Environ*. 2018;639:217–27. <https://doi.org/10.1016/j.scitotenv.2018.05.176> PMID: [29787905](https://pubmed.ncbi.nlm.nih.gov/29787905/)
61. Martin J-M, Meybeck M. Elemental mass-balance of material carried by major world rivers. *Marine Chemistry*. 1979;7(3):173–206. [https://doi.org/10.1016/0304-4203\(79\)90039-2](https://doi.org/10.1016/0304-4203(79)90039-2)
62. Buat-Menard P, Chesselet R. Variable influence of the atmospheric flux on the trace metal chemistry of oceanic suspended matter. *Earth and Planetary Sci Lett*. 1979;42(3):399–411. [https://doi.org/10.1016/0012-821x\(79\)90049-9](https://doi.org/10.1016/0012-821x(79)90049-9)
63. Abraham GMS, Parker RJ. Assessment of heavy metal enrichment factors and the degree of contamination in marine sediments from Tamaki Estuary, Auckland, New Zealand. *Environ Monit Assess*. 2008;136(1–3):227–38. <https://doi.org/10.1007/s10661-007-9678-2> PMID: [17370131](https://pubmed.ncbi.nlm.nih.gov/17370131/)
64. Krishnakumar A, Aditya SK, Seenipandi K, Anoop Krishnan K, Jose J. Evaluation of suspended sediment concentration and heavy metal distribution in Ashtamudi Lake, a Ramsar site in the southwest coast of India using remote sensing and GIS techniques. *Remote Sensing of Ocean and Coastal Environments*. Elsevier. 2021. p. 251–75. <https://doi.org/10.1016/b978-0-12-819604-5.00015-9>
65. Tomlinson DL, Wilson JG, Harris CR, Jeffrey DW. Problems in the assessment of heavy-metal levels in estuaries and the formation of a pollution index. *Helgolander Meeresunters*. 1980;33(1–4):566–75. <https://doi.org/10.1007/bf02414780>
66. Cai L-M, Wang Q-S, Wen H-H, Luo J, Wang S. Heavy metals in agricultural soils from a typical township in Guangdong Province, China: Occurrences and spatial distribution. *Ecotoxicol Environ Saf*. 2019;168:184–91. <https://doi.org/10.1016/j.ecoenv.2018.10.092> PMID: [30388535](https://pubmed.ncbi.nlm.nih.gov/30388535/)
67. Razo I, Carrizales L, Castro J, Díaz-Barriga F, Monroy M. Arsenic and Heavy Metal Pollution of Soil, Water and Sediments in a Semi-Arid Climate Mining Area in Mexico. *Water, Air, & Soil Pollution*. 2004;152(1–4):129–52. <https://doi.org/10.1023/b:wate.0000015350.14520.c1>
68. LIAO G, LIAO D, LI Q. Heavy metals contamination characteristics in soil of different mining activity zones. *Transactions of Nonferrous Metals Society of China*. 2008;18(1):207–11. [https://doi.org/10.1016/s1003-6326\(08\)60037-0](https://doi.org/10.1016/s1003-6326(08)60037-0)
69. Yildirim D, Sasmaz A. Phytoremediation of As, Ag, and Pb in contaminated soils using terrestrial plants grown on Gumuskoy mining area (Kutahya Turkey). *J Geochemical Exploration*. 2017;182:228–34. <https://doi.org/10.1016/j.gexplo.2016.11.005>
70. Rojas De Astudillo L, Prin JL, Noriega J, Alborno LA, Hidalgo-Prada B, Ramírez A. Determinación de mercurio en suelos del sector minero las claritas, estado bolívar, mediante procesos analíticos de especiación y microscopía electrónica de barrido (MED). *Saber Univ Oriente Venezuela*. 2008;20:1–10.
71. Stafilov T, Aliu M, Sajin R. Arsenic in surface soils affected by mining and metallurgical processing in K. Mitrovica region, Kosovo. *Int J Environ Res Public Health*. 2010;7(11):4050–61. <https://doi.org/10.3390/ijerph7114050> PMID: [21139876](https://pubmed.ncbi.nlm.nih.gov/21139876/)

72. Durante-Yáñez EV, Martínez-Macea MA, Enamorado-Montes G, Combatt Caballero E, Marrugo-Negrete J. Phytoremediation of Soils Contaminated with Heavy Metals from Gold Mining Activities Using *Clidemia sericea* D. Don. *Plants (Basel)*. 2022;11(5):597. <https://doi.org/10.3390/plants11050597> PMID: 35270068
73. Demková L, Jezný T, Bobuřská L. Assessment of soil heavy metal pollution in a former mining area - before and after the end of mining activities. *Soil Water Res*. 2017;12(4):229–36. <https://doi.org/10.17221/107/2016-sw>
74. YUAN Y, CHAI L, YANG Z, WU R, LIU H, LIANG L, et al. Immobilization of Cd and Pb in soils by polymeric hydroxyl ferric phosphate. *Transactions of Nonferrous Metals Society of China*. 2017;27(5):1165–71. [https://doi.org/10.1016/s1003-6326\(17\)60136-5](https://doi.org/10.1016/s1003-6326(17)60136-5)
75. Karczewska A, Krysiak A, Mokrzycka D, Jezierski P, Szopka K. Arsenic Distribution in Soils of a Former As Mining Area and Processing. *Pol J Environ Stud*. 2012;22:175–81.
76. van Geen A, Bravo C, Gil V, Sherpa S, Jack D. Lead exposure from soil in Peruvian mining towns: a national assessment supported by two contrasting examples. *Bull World Health Organ*. 2012;90(12):878–86. <https://doi.org/10.2471/BLT.12.106419> PMID: 23284193
77. Kwak J, Kim K-W, Park M, Kim J, Park K. Determination of lead in soil at a historical mining and smelting site using laser-induced breakdown spectroscopy. *Environ Technol*. 2012;33(16–18):2177–84. <https://doi.org/10.1080/09593330.2012.665485> PMID: 23240213
78. Reyes Guzmán M, Avendaño Prieto G. Estudio ambiental sobre el riesgo ecológico que representa el plomo presente en el suelo / Environmental study on ecological lead risks in soils. *Rev.esc.adm.neg*. 2012;(72):66–75. <https://doi.org/10.21158/01208160.n72.2012.568>
79. Gücel S, Öztürk M, Yücel E, Kadis C, Güvensen A. Studies on trace metals in soils and plants growing in the vicinity of copper mining area - Lefke, Cyprus. *Fresenius Environmental Bulletin*. 2009;18:360–8.
80. Puga S, Sosa M, Lebgue T, Quintana C, Campos A. Contaminación por metales pesados en suelo provocada por la industria minera: Heavy metals pollution in soils damaged by mining industry. *Ecol Apl*. 2006;5:149–55.
81. Likus-Ciešlik J, Pietrzykowski M, Chodak M. Chemistry of Sulfur-Contaminated Soil Substrate from a Former Frasch Extraction Method Sulfur Mine Leachate with Various Forms of Litter in a Controlled Experiment. *Water Air Soil Pollut*. 2018;229(3):71. <https://doi.org/10.1007/s11270-018-3716-2> PMID: 29497216
82. González-Valoys AC, Arrocha J, Monteza-Destro T, Vargas-Lombardo M, Esbrí JM, Garcia-Ordiales E, et al. Environmental challenges related to cyanidation in Central American gold mining; the Remanca mine (Panama). *J Environ Manage*. 2022;302(Pt A):113979. <https://doi.org/10.1016/j.jenvman.2021.113979> PMID: 34715613
83. Hossain MM, Jahan I, Dar MA, Dhanavade MJ, Mamtaz AFB, Maxwell SJ, et al. A Review of Potentially Toxic Elements in Sediment, Water, and Aquatic Species from the River Ecosystems. *Toxics*. 2024;13(1):26. <https://doi.org/10.3390/toxics13010026> PMID: 39853025
84. Oyarzun R, Higuera P, Lillo J. Minería ambiental: una introducción a los impactos y su remediación. España: Ediciones GEMM-Aula2punto.net. 2011.
85. Sarker A, Kim J-E, Islam ARMT, Bilal M, Rakib MRJ, Nandi R, et al. Heavy metals contamination and associated health risks in food webs—a review focuses on food safety and environmental sustainability in Bangladesh. *Environ Sci Pollut Res Int*. 2022;29(3):3230–45. <https://doi.org/10.1007/s11356-021-17153-7> PMID: 34739668
86. Zare F, Vaezi A, Tavakoli V, Lak R. Assessing pollution and ecological risks of potentially toxic elements in surface sediments of the north-central Persian Gulf. *Regional Stud Marine Science*. 2025;85:104159. <https://doi.org/10.1016/j.rsma.2025.104159>
87. Ngole-Jeme VM, Fantke P. Ecological and human health risks associated with abandoned gold mine tailings contaminated soil. *PLoS One*. 2017;12(2):e0172517. <https://doi.org/10.1371/journal.pone.0172517> PMID: 28222184
88. Monteiro De Oliveira EC, Caixeta ES, Santos VSV, Pereira BB. Arsenic exposure from groundwater: environmental contamination, human health effects, and sustainable solutions. *J Toxicol Environ Health B Crit Rev*. 2021;24(3):119–35. <https://doi.org/10.1080/10937404.2021.1898504> PMID: 33709865
89. Valenzuela A, Fytas K, Sánchez M. Manejo de arsénico en la industria metalúrgica del cobre en Chile. Rio de Janeiro/Brazil: Dep Metal. 2000.
90. Garcia-Sanchez A, Alvarez-Ayuso E. Arsenic in soils and waters and its relation to geology and mining activities (Salamanca Province, Spain). *Journal of Geochemical Exploration*. 2003;80(1):69–79. [https://doi.org/10.1016/s0375-6742\(03\)00183-3](https://doi.org/10.1016/s0375-6742(03)00183-3)
91. Sumary DP, Raymond J, Chacha M, Banzi FP, Gomezulu E. Assessment of heavy metals in soil and water from Bahi district, Tanzania. *PLoS One*. 2025;20(6):e0325487. <https://doi.org/10.1371/journal.pone.0325487> PMID: 40498800
92. Shao Y, Yan T, Wang K, Huang S, Yuan W, Qin FGF. Soil heavy metal lead pollution and its stabilization remediation technology. *Energy Reports*. 2020;6:122–7. <https://doi.org/10.1016/j.egy.2020.11.074>
93. Majumder AK, Al Nayeem A, Islam M, Akter MM, Carter WS. Critical review of lead pollution in Bangladesh. *J Health Pollut*. 2021;11(31):210902. <https://doi.org/10.5696/2156-9614-11.31.210902> PMID: 34434594
94. Reyes Y, Vergara I, Torres O, Díaz-Lagos M, González-Jimenez EE. Heavy metals contamination: implications for health and food safety. Repositorio Institucional UPTC.
95. Cuomo D, Foster MJ, Threadgill D. Systemic review of genetic and epigenetic factors underlying differential toxicity to environmental lead (Pb) exposure. *Environ Sci Pollut Res Int*. 2022;29(24):35583–98. <https://doi.org/10.1007/s11356-022-19333-5> PMID: 35244845
96. Pebe G, Villa H, Escat L, Cervantes G. Niveles de plomo sanguíneo en recién nacidos de La Oroya, 2004–2005. *Rev Peru Med Exp Salud Publica*. 2008;25:355–60.