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## GROUNDWATER CHARACTERIZATION IN SOUTHWESTERN ROMANIA USING FUZZY HIERARCHICAL CROSS CLUSTERING

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### Abstract

A simultaneous hierarchical classification of groundwater in the Banat Plain-southwestern Romania and associated characteristics such as As(III), As(V), total As, trace metals (Al, Cd, Cr, Cu, Fe, Mn, Ni, Pb, Zn), pH and redox potential using Fuzzy Hierarchical Cross Clustering Algorithm was carried out. In samples containing more than  $10 \mu g/L$  total As ( $13.9 - 77.3 \mu g/L$ ), the As(V) species represented  $57\pm20\%$  and  $73\pm18\%$  in the others. Arsenic speciation pattern was in agreement with basic pH (8.31 - 8.49) and oxidizing conditions (369.0 - 409.1 mV) in aquifer. The contents of metals were below the threshold values excepting Mn. The Fuzzy Hierarchical Cross Clustering Algorithm emphasized pH and redox potential as main parameters responsible for water samples grouping. Part of water samples containing >  $10 \mu g/L$  As have as associated parameters the content of Pb, Cr, Zn and Fe, and pH plays a key role in natural occurrence of these elements by desorption from Fe minerals/oxyhydroxides. The other water samples with >  $10 \mu g/L$  As were grouped based on redox potential, As (III), As (V), total As, Cd, Ni, Cu, Al and Mn concentrations. The source of these elements was attributed to desorption processes from Al minerals/oxyhydroxides and Mn oxyhydroxides governed by the redox potential. The Fuzzy Hierarchical Cross Clustering emphasized the importance of trace metals quantification for classification of groundwater with naturally enriched As content.

Key words: arsenic speciation, Banat Plain, Fuzzy Hierarchical Cross Clustering, groundwater exploration, trace metal

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### 1. Introduction

Unlike surface resources, groundwater is less exposed to anthropogenic contamination and its quality is mainly dependent on the aquifer mineralogy and water-rock interactions. One of contaminants naturally occurring in groundwater is arsenic, which is the subject of several studies regarding processes governing its release as well as the associated health effects (Anawar et al., 2003; Biswas et al., 2014; Chakraborti et al., 2016; Chakraborti et al., 2017; Jang et al., 2017; Kuroda et al., 2017; Panagiotaras et al., 2012; Park et al., 2016; Rahman et al., 2016; Su et al., 2016; Verma et al., 2016). Besides arsenic, quantification of trace metals is useful for the evaluation of water-rock interaction, identification of processes governing the natural or anthropogenic enrichment and discriminating between them (Cuoco et al., 2015; Ghrefat et al., 2016; Kim et al., 2014; Nshimiyimana et al., 2016; Rahman et al., 2015; Sappa et al., 2014; Tirkey et al., 2016). In Europe, the Pannonian Basin including eastern Hungary, western Romania, northern Serbia, northeastern Croatia and southern Slovakia, is characterized by an elevated As

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content, which poses health risks to more than 1000000 inhabitants via drinking water (Dimkic et al., 2010; Gurzau E.S. and Gurzau A.E., 2001; Romanian National Institute of Statistics, 2012; Rowland et al., 2011). European Union member states have established threshold values (TVs) for groundwater bodies depending on hydrogeological conditions and natural background levels (NBLs) for contaminants referred to as risk factors from natural or anthropogenic sources (As, Cd, Pb, Hg, NH4<sup>+</sup>, Cl<sup>-</sup>, SO4<sup>2-</sup>,  $NO_3^{-}$ ) synthetic and substances (trichloroethylene, tetrachloroetylene) (EC Directive, 2006; Radu et al., 2010). In Romania, there were established TVs for all groundwater bodies according to NBLs (Order, 2014). Also, several studies were carried out in Romania concerning the quality of revealed groundwater resources, which the vulnerability to heavy metals, As, anions, pesticides, etc., due to anthropogenic activities such as mining, ore processing, non-compliant landfills, poor management of manure, climate change and natural conditions such as precipitation (Badila, 2017; Frentiu et al., 2007, 2008; Minea and Croitoru, 2017; Modoi et al., 2014; Muntean and Mihaiescu, 2016; Nistor et al., 2015; Rusu et al., 2017; Vasilache et al., 2012). Some technologies were proposed to decrease concentration of As species in groundwater below 10 µg/L (Janos et al., 2016; Kobya et al., 2018; Pop et al., 2017).

Several epidemiological studies on human risk of exposure by water consumption with As concentration below or above the maximum allowable value ( $10 \mu g/L$ ) reported major diseases such as anemia, vascular and heart diseases, neurological disorders and cancer. In the case of pregnant women the risk of spontaneous abortion can occur (Bloom et al., 2010, 2014; Chakraborti et. al, 2016; Neamtiu et al. 2015; Rahman et al., 2015; Sarkar and Paul, 2016; Surdu et al., 2015). Therefore speciation and monitoring of arsenic in drinking and groundwater water is necessary but represents a challenging analytical task (Rajakovic-Ognianovic et al., 2014).

A comparison of the experimental data with guideline values is too simplistic to clarify characteristics and behavior of contaminants in groundwater. Thus unsupervised chemometric methods such as Cluster Analysis (CA) and Principal Component Analysis (PCA) were widely used for the characterization of groundwater (Cuoco et al., 2015; Kelepertzis, 2014; Kim et al., 2014; Sappa et al., 2015; Kelepertzis, 2014; Kim et al., 2014; Sappa et al., 2014; Spanos et al., 2015). However, CA and PCA approaches have limited capability and do not provide a simultaneous classification of sites and related physico-chemical characteristics.

The aim of this study was to provide a rapid characterization of groundwater based on As speciation and trace metal content using Fuzzy Hierarchical Cross Clustering (FHCC). The FHCC algorithm was applied in the classification in terms of As(III), As(V) and total As content, trace metals (Al, Cd, Cr, Cu, Fe, Mn, Ni, Pb, Zn), pH and redox potential ( $E_h$ ) of samples collected from the shallow

groundwater body (GW-ROBA03) and depth groundwater body (GW-ROBA18) located in the Banat Plain-southwestern Romania. Characteristics of the groundwater were discussed in relation with natural feature of local aquifer, which made possible recognition of processes responsible for the occurrence of inorganic arsenic species and trace metals following water-rock interaction. Determinations for total arsenic and speciation analysis were carried out by hydride generation capacitively coupled plasma microtorch optical emission spectrometry (HG-µCCP-OES), while metals were quantified by graphite furnace atomic absorption spectrometry (GFAAS). Compared to previous examination, this approach is a significant step forward to describe natural enrichment of inorganic arsenic and co-occurring species in groundwater (Na<sup>+</sup>, K<sup>+</sup>, Ca<sup>2+</sup>, Mg<sup>2+</sup>, HCO<sub>3</sub><sup>-</sup>, Cl<sup>-</sup>, F<sup>-</sup>, SO<sub>4</sub><sup>2-</sup>, PO<sub>4</sub><sup>3-</sup>, NO<sub>3</sub><sup>-</sup>) (Butaciu et al., 2017).

### 2. Material and methods

### 2. 1. Reagents, standard solutions and CRMs

Ultrapure 30% HCl, NaBH<sub>4</sub> pro analysis, NaOH suprapur, L-cysteine for biochemistry, stock solution of As(V) 1000 µg/mL and ICP multielement standard solution IV 1000 µg/mL, Merck (Darmstadt, Germany) were used in this study. A solution containing 3% -cysteine in HCl 0.01 mol/L (pH = 2.00±0.01) was used for prereduction of As(V) to As(III), while the 0.6% NaBH<sub>4</sub> stabilized in 0.5% NaOH as derivatization agent. A solution containing 0.01 mol/L HCl (pH =  $2.00\pm0.01$ ) was used as carrier and a solution of 0.3% L-cysteine in 0.01 mol/L HCl as blank. Calibration for As determination by HGµCCP-OES was carried out using standards in the range 0 - 100 ng/mL in 0.01 mol/L HCl. Calibration in GFAAS was performed using standards prepared from multielement standard solution IV by serial dilution with 2% (v/v) HNO<sub>3</sub>.

The reference materials ERM CA011b Hard Drinking Water UK - Metals, ERM-CA615 Groundwater (Institute for Reference Materials and Measurements – IRMM, Geel, Belgium), SRM 1643e Trace Elements in Water (National Institute for Standards and Technology, Gaithersburg, USA), LGC 6010 Hard Drinking Water and LGC 6019 River Water-River Thames (LGC Promochem, Wesel, Germany) were used in Quality Control of laboratory procedures for As determination by HG- $\mu$ CCP-OES and metals by GFAAS.

### 2.2. Site description

The groundwater bodies GW-ROBA03 and GW-ROBA18 are developed until 15-30 m and of higher depth of 30-350 m in the Banat Plain, Bega and Timis Rivers Basin, southwestern Romania. The Banat Plain was formed during Quaternary from detrital sediment transported by the rivers generating deposits of tens to hundreds meters thickness. The

deposits are generally coarse-grained and exhibit discontinuous finer intercalations (Enciu et al., 2014; Mutihac, 1990). The overlaying strata consist of clays, sandy clays, silty clays, silts, argillaceous silts and sandy silts. The main lithological units were described earlier (Butaciu et al., 2017; Radu E. and Radu C., 2011). The main flow direction is from north-east to south-west with 0.1-2.0‰ hydraulic gradient and 6-68 m/d hydraulic conductivity. The effective porosity is 5-25%.

Due to the elevated permeability of sediments, GW-ROBA03 is recharged through precipitations and hydraulic connection with the rivers. The deep aquifer GWROBA18 (Upper Pleistocene-Lower Quaternary) is also porous-permeable consisting of sands, rarely gravels and alternate layers of clay, sandy clay and marls (Pascu, 1983). The aquifer represents the main source of drinking water in the zone and has been considered as a risk factor for population because of exposure to arsenic of geogenic source, a common problem all over in the Pannonian Depression (Bloom et al., 2014; Neamtiu et al., 2015; Romanian National Institute of Statistics, 2012; Rowland et al., 2011; Surdu et al., 2015). GW-ROBA03 was previously chosen as Pilot Study Groundwater to establish the Threshold Values for 10 contaminants for

Groundwater in Romania (EC Directive, 2006; Order, 2014; Radu et al., 2010).

The zone has temperate climate with average annual temperature of 10-11 °C and average annual precipitation amount around 600 mm. The main land use relates to maize and wheat production.

# 2.3. Sample collection, preparation and analytical methods

Water samples were collected from 18 locations (Fig. 1), namely 4 samples from GW-ROBA03 (sites 1; 2; 5 and 17) and 14 samples from GW-ROBA18. A volume of 1 L water was collected from each site, filtered ( $< 0.45 \,\mu m$ ) and the pH and E<sub>h</sub> were measured on-site. Samples were transferred in polyethylene flasks, flash-frozen on field and transported to laboratory. Speciation as As(III) and As(V) was carried by HG-µCCP-OES in the original samples. Metal content was determined by GFAAS after acidification of water samples to 2% (v/v) HNO<sub>3</sub>. A number of 10 clay and 20 sand samples were collected and analyzed by X-ray diffraction (XRD) and X-Ray Fluorescence Spectrometry (XRF) to achieve the mineralogical composition and trace metal determination.



Fig. 1. Location of groundwater sampling points in the Banat Plain-southwestern Romania

Parameter	Setting
Hydride generator HGX-200	
Final concentration of L-CYSTEINE in sample	0.3%
HCl concentration /pH in the final sample	0.01 mol/L/pH=2.00±0.01 adjusted before derivatization
HCl concentration /pH in carrier	0.01 mol/L HCl/pH=2.00±0.01
Derivatization reagent (arsine generation)	0.6% NaBH <sub>4</sub> stabilized in 0.5% NaOH
Sample flow rate	7 mL/min
Carrier flow rate	1 mL/min
Derivatization reagent flow rate	1 mL/min
µCCP-OES prototype equipment	
Data acquisition and As emission signal processing	Spectra suite software, As 228.812 nm, peak height
	measurement, background correction using 0.3% L-CYSTEINE in
D	10  W
Power plasma	10 W
Argon flow rate	150 mL/min
Plasma viewing	Radial, signal collection through 10 mm focal length lens
Calibration range	0-100 ng/mL As

Table 1. Operating conditions for As determination by HG-µCCP-OES

### 2.4. Chemical and mineralogical analysis

Details about the hydride generation procedure for speciation and determination of As by HG- $\mu$ CCP-OES using a prototype equipment (Babes-Bolyai University, Cluj-Napoca, Romania) were already presented (Frentiu et al., 2014). The speciation method involves the selective derivatization of As(III) species in HCl medium and determination of total As after prereduction with 3% L-cysteine in 0.01 mol/L HCl (pH 2.00±0.01) (Cordos et al., 2006, Frentiu et al., 2007). The concentration of the As(V) species is determined by difference. The pH measurements in the water samples, blanks and 0.01 mol/L HCl was performed with 540 GLP pH-meter WTW GmbH (Weilheim, Germany).

Arsenic(III) determination. The pH value in water samples was adjusted to  $2.00\pm0.01$  with HCl and arsine was generated immediately after the addition of 0.3% L-cysteine.

Total arsenic determination. Prereduction of As(V) to As(III) with 0.3% L-cysteine in 0.01 mol/L HCl was achieved on water bath at  $90\pm5$  °C for 10 min. Derivatization was performed after pH adjustment to  $2.00\pm0.01$ .

The derivatization reagent for quantification of total As and As (III) was 0.6% NaBH<sub>4</sub> stabilized in 0.5% NaOH. The low power and low Ar consumption plasma microtorch of the HG-µCCP-OES analytical system was interfaced with CETAC HGX-200 hydride generator. The emission signal of arsenic was measured at 228.812 nm using the QE65 Pro microspectrometer of low resolution, Ocean Optics (Dunedin, USA). Memory effect was overcome by washing the sample channel of the HGX-200 generator between samples run with blank solution for 40 s. The operating conditions in HG-µCCP-OES are presented in Table 1. The concentrations of Al, Cd, Cr, Cu, Fe, Mn, Pb, Ni and Zn were determined by GFAAS using the Perkin Elmer model PinAAcle 900T spectrometer (Norwalk, USA) under the experimental conditions recommended by the producer.

The  $E_h$  was measured according to the protocol described by Eaton et al. (2005). Analysis of sand and clay samples by XRD using the Bruker D8 Advance Diffractometer Bruker and XRF using the Tracer 5i handheld instrument (Massachusetts, USA) were carried out on powder (< 100  $\mu$ m). Major (>20%), minor (5-20%) and trace minerals (<5%) were considered.

# 2.5. Quality assurance/Quality control of laboratory procedures

The HG-µCCP-OES method was validated for As determination with recovery of 100±9% for 95% confidence level, and precision in the range 1.2 - 7.1%for As(III), 3.1 – 9.5% for As(V) and 2.9 – 8.5% for total As (n=3 parallel measurements). Recovery of the arsenic species using the selective derivatization procedure was already assessed with values ranging within 98 - 105% for As(III) and As(V), and 98 -104% for total As (Cordos et al., 2006). The detection limit in the HG-µCCP-OES method was 0.2 µg/L As (Frentiu et al., 2014). The detection limits in GFAAS were (µg/L): 0.76 Al, 0.05 Cd, 0.40 Cr, 0.36 Cu, 0.65 Fe, 0.34 Mn, 0.33 Ni, 0.70 Pb and 0.35 Zn. The GFAAS method was validated for the determination of Al, Cd, Cr, Cu, Fe, Mn, Ni, Pb and Zn with recovery of 92 - 106% and precision of 3.0 - 9.2%. The results obtained for the determination of As by HG-µCCP-OES and metals by GFAAS in CRMs and the mean recovery are presented in Table 2.

The redox potential of water samples and ZoBell's solution (1.4080 g K<sub>4</sub>Fe(CN)<sub>6</sub>·  $3H_2O$ , 1.0975 g K<sub>3</sub>Fe(CN)<sub>6</sub> and 7.4555 g KCl to 1000 mL solution) were measured. The redox potential of water sample was corrected for the difference between the potential of the calomel reference electrode and the standard hydrogen electrode (+183 mV). The  $E_h$  of water sample was calculated with (Eq. 1):

$$E_{h} = E_{observed} + E_{hZoBell/refence} - E_{hZoBell/observed}$$
(1)

Element	ERM-CA011b		SRM 1643e		LGC 6019		LGC 6010		ERM-CA615		Recovery (%) <sup>c</sup>
	<i>Certified</i> <sup>d</sup>	Found <sup>e</sup>									
As <sup>a</sup>	10.15± 0.34	10.30± 1.78	60.45± 0.72	59.85± 0.87	-	-	55±5	56±3	9.9±0.7	9.8±0.3	100±9
Al <sup>b</sup>	209±11	218± 16	141.8± 8.6	146.3± 8.0	73±13	77±10	208±19	202± 20	-	-	103±9
Cd <sup>b</sup>	4.88± 0.19	4.74± 0.29	6.568± 0.073	6.743± 0.290	0.11± 0.02	0.12± 0.01	-	-	0.106± 0.011	0.11± 0.02	103±11
Cr <sup>b</sup>	48.2±1.6	50.1± 2.0	20.40± 0.24	20.10± 1.97	0.78± 0.20	0.82± 0.14	48±3	46±4	-	-	101±11
Cu <sup>b</sup>	1936±75	1935± 17	22.76± 0.31	23.10± 0.50	15.4± 1.5	16.0± 0.8	-	-	-	-	102±3
Fe <sup>b</sup>	186±11	180± 12	98.1±1.4	97.7± 5.2	287±7	283± 24	236±6	240±8	5.11± 0.26	5.13± 0.27	99±6
Mn <sup>b</sup>	48.3±1.6	47.3± 1.0	38.97± 0.45	38.37± 1.23	-	-	48±2	50±3	107±5	110±6	101±5
Ni <sup>b</sup>	19.27± 0.68	18.73± 0.61	62.41± 0.69	61.18± 1.64	2.6± 0.6	2.5± 0.2	48±4	50±5	25.3±1.1	25.6± 1.6	99±7
Pb <sup>b</sup>	24.51± 0.52	24.03± 0.76	19.63± 0.21	19.43± 0.87	5.2± 0.3	5.1± 0.3	95±3	93±4	7.1±0.6	7.3± 0.7	99±6
Zn <sup>b</sup>	597±19	605± 10	78.5±2.2	76.6± 1.2	59.7± 2.5	57.5± 4.8	542±16	550± 20	-	-	99±5

Table 2. Results ( $\mu$ g/L) for the determination of As by HG- $\mu$ CCP-OES and metals by GFAAS in water CRMs

*Note:* <sup>*a*</sup> *HG*- $\mu$ *CCP-OES method;* <sup>*b*</sup> *GFAAS method;* <sup>*c*</sup> *Pooled recovery for 95% confidence level;* <sup>*d*</sup> *mean*±*U for 95% confidence level;* <sup>*e*</sup> *mean*±*CI (confidence interval) for n = 3 parallel measurements and 95% confidence level* 

The observed potential of ZoBell's solution was +189 mV, which meant a departure of +6 mV from the theoretical  $E_h$ , lower than the permissible error of the method (±10 mV). The relative error for n=3 successive measurements of  $E_h$  was in the range 0.1 – 1.1%.

### 2.6. Statistics

In this study, an advanced chemometric method, namely FHCC (Sârbu et al., 1996, 2001), which offers an excellent possibility to associate each fuzzy partition of samples to a fuzzy set of characteristics (specific markers) was successfully applied for characterization and classification of groundwater based on trace metal content and arsenic species. FHCC, an unsupervised multidimensional algorithm more advanced than PCA and CA, was developed for the first time by Pop and Sârbu (1997). The algorithm was further used for modeling of contaminants around an abandoned uranium mine (Pourjabbar et al., 2014) and within a study on the fate of Hg and other contaminants in soil around a former chlor-alkali plant (Frentiu et al., 2015).

In classical cluster analysis each object must be assigned to exactly one cluster. This is a source of ambiguity and error in cases of outliers or overlapping clusters and affords a loss of information. This kind of vagueness and uncertainty can, however, be taken into account by using the theory of fuzzy sets introduced by Zadeh (1965). A central concept of fuzzy set theory is that it is permissible for an element to belong partly to a partition (class). Most fuzzy clustering algorithms are objective function based: they determine an optimal classification by minimizing an objective function. In objective function based clustering usually each cluster is represented by a cluster prototype. This prototype consists of a cluster centre whose name already indicates its meaning, and gives some additional information about the size and the shape of the cluster. The degrees of membership to which a given data point belongs to the different clusters are computed from the distances of the data point to the cluster centers. The closer a data point lies to the centre of a cluster, the higher is its degree of membership to this cluster. Hence the problem to divide a dataset into (c) clusters can be stated as the task to minimize the distances of the data points to the cluster centres, since, it is desirable to maximize the degrees of membership (Pop et al., 1996; Ross, 2004).

### 3. Results and discussion

# 3.1. Groundwater characteristics and mineralogical composition

Table 3 presents the concentrations of As species and metals in groundwater samples and the corresponding Threshold Values for total arsenic, Cd, Cr, Cu, Ni, Pb, Zn in GW-ROBA03 and GW-ROBA18 according to Order, (2014). In the case of Al, Fe, Mn and pH for which TVs are not yet available, the values were compared to maximum admitted concentration (MAC) in drinking water in Romania set in Law, (2002). The TV value for total As (Order, 2014) was established only for GW-ROBA03 considered much more vulnerable to anthropogenic contamination via agricultural practices. The results of the analysis provided in Table 3 suggest that the two groundwater bodies are under the oxidative influence of aquifer (*E<sub>h</sub>* between 369.0 – 409.1 mV, mean 384.0 mV) and alkaline pH (8.31 - 8.49, mean 8.40). These conditions explain the low concentrations of metals in groundwater compared to TVs or MAC. MAC for Mn, which could be present as oxyanion species, with high water mobility, was exceeded in 5 out of 18 water samples. Total As was in the range  $3.6 - 77.3 \ \mu g/L$  (mean 29.8  $\mu g/L$ ) and TV/MAC (10  $\mu g/L$ ) was exceeded in 15 out of 18 cases. Related to speciation analysis, the concentrations of As(III) and As(V) were within 0.5-18.8  $\mu g/L$  and 2.5-63.2  $\mu g/L$ , and TV/MAC was exceeded in 12 and 9 samples respectively. Obviously As(V) was the dominant species representing 57±20% of total in samples with more than 10  $\mu g/L$  As and 73±18% in those with concentration below TV/MAC.

Consequently, this could represent a risk exposure for population when using groundwater as drinking water supply. The dominance of As(V) is in agreement with oxidative conditions in aquifer and it is presumed that pH and  $E_h$  influence processes responsible for the occurrence of As species and trace metals. The low metal concentrations in groundwater were in agreement with the relatively low values found in sand and clay samples (Table 4).

Table 3. Hydrogeochemical characteristics (µg/L), electrochemical parameters and summary statistics for the groundwater
samples (n = 3 parallel measurements)

Sample	As(III)	As(V)	As	Al	Cd	Cr	Cu	Fe	Mn	Ni	Pb	Zn	$E_h$ (mV)	pН
GW-ROBA03														
1	9.8	8.2	18.0	38	0.41	0.83	11.6	57	5.3	9.48	0.57	38.0	402.2	8.39
2	16.5	4.4	20.9	12	0.22	0.28	1.25	41	2.1	4.09	0.22	15.2	409.1	8.45
5	13.7	38.3	52.0	56	0.22	0.21	1.19	23	2.7	5.36	0.30	15.4	395.1	8.45
17	0.5	3.4	3.9	6.8	0.18	0.16	0.91	18	1.8	3.66	0.23	31.8	374.2	8.42
					GV	V-ROBA	418							
3	13.5	37.1	50.6	6.1	0.30	0.91	3.54	48	22	9.75	0.12	40.1	374.5	8.35
4	12.9	11.6	24.5	1.7	0.21	0.11	0.78	22	2.1	4.61	0.21	11.3	380.1	8.41
6	14.1	32.6	46.7	3.1	0.23	0.14	1.51	19	370	5.14	0.33	11.8	388.8	8.44
7	13.8	30.4	44.2	7.9	0.36	0.11	0.71	20	274	7.7	0.11	6.51	385.4	8.49
8	14.7	51.6	66.3	1.2	0.43	1.61	7.09	19	23	6.74	0.19	37.9	382.1	8.38
9	11.4	6.1	17.5	5.8	0.23	0.10	0.65	33	2.5	4.02	0.24	47.9	378.9	8.46
10	11.4	28.6	40.0	5.5	0.21	0.11	0.91	25	69	2.03	0.12	46.1	379.6	8.41
11	18.8	20.4	39.2	74	0.25	8.97	1.65	132	5.8	8.03	0.11	20.2	406.6	8.33
12	9.0	4.9	13.9	12	0.17	0.24	1.26	16	2.1	2.26	0.17	11.5	380.4	8.31
13	14.1	63.2	77.3	1.4	0.23	0.12	1.08	21	700	3.5	0.54	39.7	381.1	8.48
14	1.2	7.5	8.7	1.2	0.20	0.12	0.76	18	32	2.57	0.38	37.8	369.0	8.37
15	3.7	2.5	6.2	1.6	0.21	9.84	0.47	24	5.1	6.18	0.23	9.95	378.9	8.46
16	0.6	3.0	3.6	1.4	0.24	0.18	1.04	18	1.1	3.07	0.35	20.2	372.1	8.40
18	0.7	2.9	3.6	11	0.19	1.09	1.12	79	35	5.94	0.29	28.7	374.3	8.43
Min	0.5	2.5	3.6	1.2	0.17	0.1	0.47	16	1.1	2.03	0.11	6.51	369.0	8.31
Max	18.8	63.2	77.3	74	0.43	9.84	11.6	132	700	9.75	0.57	47.9	409.1	8.49
Mean	10.0	19.8	29.8	13.7	0.2	1.4	2.1	35.2	86.4	5.2	0.3	26.1	384.0	8.40
Median	12.2	9.9	22.7	6.0	0.2	0.2	1.1	22.5	5.6	4.9	0.2	24.5	380.3	8.40
Std	6.1	19.9	23.8	23.0	0.1	3.2	3.3	34.1	213	2.5	0.1	14.1	12.4	0.10
TV Order 621/2014 <sup>a</sup>			10 <sup>b</sup>		5	50	100			20	10	5000		
MAC Law 458/2002 <sup>c</sup>			10	200				200	50					6.5- 8.5

<sup>a</sup> Threshold values for groundwater in Banat area, Romania; <sup>b</sup> Value refers only to GW-ROBA03; for GW-ROBA18 no TV has been set so that MAC for drinking water was taken into account; <sup>c</sup> Maximum admitted concentration in drinking water in Romania

Table 4. Content of arsenic and metals obtained by XRF in sand and clay samples

	<i>M.U.</i>		Sand	( <i>n</i> =20)		<i>Clay (n=10)</i>					
		Min	Max	Mean	Sd	Min	Max	Mean	Sd		
As	mg/kg	3.50	40.0	11.1	10.5	5.30	86.0	21.8	25.7		
Cd	mg/kg	0.09	0.50	0.28	0.22	0.08	0.31	0.20	0.13		
Cr	mg/kg	20.0	91.0	47.1	22.1	32.5	50.2	40.9	6.2		
Со	mg/kg	18.0	133.0	80.2	30.2	34.0	86.0	56.7	16.5		
Cu	mg/kg	32.0	181	96.7	53.6	33.0	151	53.2	35.6		
Ni	mg/kg	11.0	56.0	27.8	14.8	1.20	1.70	1.43	0.22		
Mn	mg/kg	149	1254	668	356	341	791	560	148		
Pb	mg/kg	18.0	126	65.0	28.2	18.2	97.0	32.3	23.6		
Zn	mg/kg	70.0	503	254	120	48.0	188	80.5	41.4		
Fe <sub>2</sub> O <sub>3</sub>	%	3.10	4.93	4.25	0.59	1.45	7.37	5.49	1.19		
Al <sub>2</sub> O <sub>3</sub>	%	0.95	4.52	2.49	1.33	0.62	4.63	2.85	0.60		

The mineralogical analysis indicated the presence of quartz (SiO<sub>2</sub>), Zeolite Beta, Sodium Aluminium Silicate - Na2O-Al2O3-SiO2, Muscovite chromian - K(Al,Cr)<sub>2</sub>(Si<sub>3</sub>,Al)O<sub>10</sub>(OH,F)<sub>2</sub> as major Chlorite-serpentine minerals, (Mg,Al)<sub>6</sub>(Si,Al)<sub>4</sub>O<sub>10</sub>(OH)<sub>8</sub>, Muscovite calcian -(K,Ca,Na)(Al,Mg,Fe)<sub>2</sub>(Si,Al)<sub>4</sub>O<sub>10</sub>(OH)<sub>2</sub>, Montmorillonite - Ca,Na)<sub>0.3</sub>Al<sub>2</sub>(Si,Al)<sub>4</sub>O<sub>10</sub>(OH)<sub>2</sub> × H<sub>2</sub>O, Nontronite -  $(Na,Ca)_{0.3}Fe_2(Si,Al)_4O_{10}(OH)_2 \times$ H<sub>2</sub>O, Kaolinite - Al<sub>2</sub>Si<sub>2</sub>O<sub>5</sub>(OH)<sub>4</sub> as minor minerals, NaAlSi<sub>3</sub>O<sub>8</sub>, Albite Muscovite  $(KF)_2(Al_2O_3)_3(SiO_2)_6(H_2O)$ , feldspar - KAlSi<sub>3</sub>O<sub>8</sub>, Chlorite-clinochlore - (Mg,Fe)<sub>5</sub>(Al,Si)<sub>5</sub>O<sub>10</sub>(OH)<sub>8</sub>, Anorthite CaAl<sub>2</sub>  $Si_2O_8$ , illite  $(K,H_{30})Al_2(Si_3,Al)O_{10}(OH)_2 \times H_2O$  as traces.

# 3.2. Groundwater classification and characterization using FHCC

Table 5 provides the hierarchical classification of groundwater samples and the characteristic parameters associated to each level.

The membership degree values and hierarchical classification reveal pH and redox potential as decisive factors for grouping samples and related characteristics. Thus the first hierarchical level  $A_1$  encompasses samples with features sensitive to pH, namely Pb, Cr, Zn and Fe content. The second level  $A_2$  contains samples with characteristics sensitive to redox potential, namely Cd, As(III), Ni, As(V), total As, Cu, Al and Mn content. Both groups contain samples with high As concentration. Thus 6 out of 9 samples belonging to the first group  $A_1$  exhibited (µg/L) 9.8 – 16.5 (mean 13.6) As(III), 4.4 – 51.6 (mean 26.3) As(V) and 18.0 – 66.3 (mean 39.9) total As. Grouping of samples in  $A_1$  is due to trace metals rather than As concentration. Desorption of Pb, Cr, Zn and As species from the surface of Fe minerals/oxides is governed by groundwater pH.

The concentration of Fe is controlled through the oxidative precipitation occurring in aquifer ( $E_h > + 2 \text{ mV}$ ) (Sappa et al., 2014) according to (Eq. 2):

$$4Fe^{2+} + O_2 + 6H_2O \rightarrow 4FeOOH + 8H^+$$
(2)

Reaction 2 occurs when the electron activity (*pe*) calculated according to the (Eq. 3) (Sappa et al., 2014) fall in the range 5-7:

$$pe = 96.490 \times E_{\rm h} / 2.303 \times RT \tag{3}$$

where:  $E_h$  is the redox potential (mV) and T is the water temperature (K).

In the case of our groundwater samples the *pe* values were in the range 6.33–6.91 satisfying the conditions for (Eq. 2). The phenomenon was also reported by (Sappa et al., 2014) who found similar values for pH and  $E_h$  in the groundwater system in Central Italy. The next levels of hierarchy (2 and 3) group groundwater samples with the highest concentration of As species. In some of them the feature relates to Cr, Zn and Fe concentration, in others to Pb.

**Table 5.** The hard fuzzy partition of groundwater samples and their characteristics ranked in descending order of their membership degree

Partition	Fuzzy	Sam	ples	Associated characteristics				
level	divisive partition	Location	Membership degree range	Characteristics	Membership degree range			
0	А	1,, 18		Cu, Zn, NI, Cd, Cr, Pb, Mn, Fe, Al, As(III), As(V), As <sub>total</sub> , E <sub>h</sub> , pH				
1	A1	3, 6, 15, 17, 5, 1, 8, 4, 2	0.974 - 0.512	Pb, Cr, pH, Zn, Fe	0.999 – 0.849			
	A <sub>2</sub>	18, 11, 10, 12, 16, 7, 14, 13, 9	0.907 – 0.811	Cd, As(III), E <sub>h</sub> , Ni, As(V), As <sub>total</sub> , Cu	0.996 - 0.586			
2	A <sub>11</sub>	17, 15, 6	0.872 - 0.715	Cr, Zn, Fe	0.999 - 0.831			
	A <sub>12</sub>	3, 5, 4, 8, 1, 2	0.954 - 0.458	pH, Pb	0.975 - 0.972			
3	A111	15	0.814	Cr, Fe	0.996 - 0.825			
	A <sub>112</sub>	17, 6	0.871 - 0.712	Zn	0.932			
4	A <sub>121</sub>	3, 5, 4, 2	0.942 - 0.447	pH	0.975			
	A <sub>122</sub>	8, 1	0.658 - 0.456	Pb	0.971			
5	A <sub>21</sub>	7, 13, 16, 9	0.897 – 0.806	Cd, Ni, As(V), E <sub>h</sub> , Cu, Al, As <sub>total</sub> , Mn	0.985 - 0.544			
	A <sub>22</sub>	18, 11, 10, 12, 14	0.955 - 0.575	As(III)	0.983			
6	A <sub>211</sub>	13	0.856	Ni	0.978			
	A <sub>212</sub>	7, 16, 9	0.892 - 0.764	As(V), Cd, Cu, Al, E <sub>h</sub> , As <sub>total</sub> , Mn	0.864 - 0.528			
7	A <sub>2121</sub>	7,9	0.865 - 0.724	Cd, Cu, Al, E <sub>h</sub> , Mn	0.759 - 0.494			
	A <sub>2122</sub>	16	0.842	As(V), As <sub>total</sub>	0.851 - 0.331			
8	A <sub>21211</sub>	9	0.724	E <sub>h</sub> , Mn	0.583 - 0.397			
	A <sub>21212</sub>	7	0.865	Cd, Cu, Al	0.748 - 0.536			

The second class A<sub>2</sub> (9 samples) contains 6 samples with total As above the limit of 10  $\mu$ g/L. In these samples concentrations  $(\mu g/L)$  of As species were 9.0 - 18.8 (mean 12.5) As(III), 4.9 - 63.2 (mean 22.4) As(V) and 13.9 – 77.3 (mean 35.2) total As. Associated characteristics for these samples were found to be As species as well as Cd, Ni and Cu content. The natural origin of arsenic and trace metals relates to desorption from Al minerals and Mn hydroxides, which is controlled  $E_h$ . The A<sub>2</sub> group is further divided over the partition levels (5-8). It is noteworthy the segregation of a subgroup of samples (A<sub>22</sub>) based only on As(III) concentration and of a hierarchically lower group  $(A_{212})$  recognized through As(V) and total As, as well as Cd, Ni, Cu, Al, Mn and  $E_h$ .

### 4. Conclusions

It was highlighted the helpfulness of the FHCC approach for a fast modeling of arsenic chemistry and trace metals of natural origin in groundwater in the Banat Plain-southwestern Romania.

The methodology made possible the recognition of natural occurring sources of arsenic species in groundwater as well as trace metals associated to a particular group. In the same time, single sample with distinct characteristics could be segregated.

The redox potential and pH value in aquifer were found to be responsible for the natural release of inorganic arsenic species and trace metals by desorption from Fe and Al minerals and Mn oxyhydroxides. Although the contents of trace metals do not exceed TVs or MAC, the FHCC approach highlighted them as distinguished characteristics associated to variability and grouping of groundwater samples.

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