ORIGINAL ARTICLE

Investigation of the geochemical evolution of groundwater resources in the Zanjan plain, NW Iran

Javad Hussainzadeh1 · Saeideh Samani2 · Ali Mahaqi3

Received: 11 June 2022 / Accepted: 31 January 2023 / Published online: 25 February 2023 © The Author(s), under exclusive licence to Springer-Verlag GmbH Germany, part of Springer Nature 2023

Abstract

There are many sources of pollution that afect quality of groundwater resources, which makes them unsuitable for human consumption. To achieve sustainable management of water resources, comprehensive geochemical studies of groundwater supply and monitoring its chemical evolution are required. In this study, 45 groundwater well samples were analyzed for physicochemical parameters and trace elements. Based on cluster analysis, groundwater samples in the study area were divided into two groups. Group 1 was classifed as recharge zone water. Group 2, impacted by industrial wastewater, was identifed near industrial areas and Zanjan City where the fow line showed this area as the discharge zone for zone 1. Group 2 sample areas are characterized by having medium to high transmissivity $(100-1000 \text{ m}^2/\text{day})$, which can significantly increase pollution absorption. An important characteristic of acid mine drainage is its acidic nature. Since the average pH of the samples was 7.8, there was no indication of acid mine drainage in the area. In the study area, silicates and carbonates minerals could immediately reduce the acidity of water. The primary reactions leading to salinity were as follows: (1) water–rock interactions; (2) input industrial wastewater; (3) over-exploitation of groundwater. As a frst step to mitigate water quality degradation, the exploitation of groundwater should be managed to prevent further degradation of groundwater. Local authorities and policy makers should pay more attention to the factors impact groundwater quality and consequently the local consumers' health.

Keywords Zanjan plain · Geochemical models · Water–rock interaction · Industrial wastewater

Introduction

In most of the world's arid and semi-arid regions, groundwater is the primary source of potable water for the agricultrial and industrial sectors. In these areas, groundwater is more accessible and resistant to contamination than surface water, making it a more reliable water source (Todd and Mays

 \boxtimes Javad Hussainzadeh javad.hussainzadeh@mail.um.ac.ir Saeideh Samani

s.samani@wri.ac.ir Ali Mahaqi mahaqia@unimelb.edu.au

- ¹ Department of Geology, Ferdowsi University of Mashhad, Mashhad, Iran
- ² Karst and Hard Rock National Research Center, Water Research Institute (WRI), Tehran, Iran
- Peter Cook Centre for CCS Research, School of Earth Sciences, The University of Melbourne, Parkville, VIC 3010, Australia

[2005;](#page-23-0) Wagh et al. [2016;](#page-23-1) Varade et al. [2018](#page-23-2); Kadam et al. [2019](#page-21-0)). Nowadays, groundwater plays an increasingly crucial role in daily life, especially in arid regions like Iran, providing more than 55% of the water needed in Iran (Sakizadeh et al. [2016](#page-23-3)). As a result of a combination of natural and anthropogenic factors, groundwater quality is in jeopardy worldwide, particularly in Iran. Furthermore, primarily in arid or semi-arid regions—such as Iran—booming population growth, unsustainable development of agricultural and industrial activities, and lack of sufficient surface water supplies exert substantial pressure on groundwater resources (Besser et al. [2018](#page-20-0); Adimalla [2020](#page-20-1)).

Both natural and anthropogenic parameters strongly change aquifer chemistry. The main natural factors are hydrogeology, geology, local precipitation, evaporation rate, water–rock interactions, weathering, and mineral dissolution (Dubey et al. [2021;](#page-21-1) Xiao et al [2022a,](#page-24-0) [b\)](#page-24-1). In addition, industrial effluent, urban and rural sewage, and the widespread use of agrochemicals are the most signifcant anthropogenic components (Alexakis [2011](#page-20-2); Singh et al. [2011;](#page-23-4) Ehya and Marbouti [2016;](#page-21-2) Adimalla 2020; Mahaqi et al. [2021\)](#page-22-0). From recharge to discharge areas, groundwater hydrochemistry is signifcantly changing due to several factors such as mineral weathering, presence of various ionic species in the medium, surface complexation, absorption/desorption processes, formation of secondary minerals, and fux of sewage or indus-trial effluents (Domenico and Schwartz [1990;](#page-21-3) Mahesha and Nagaraja [1996;](#page-22-1) Möller et al. [2006](#page-22-2)).

Metals and metalloids with an atomic mass greater than 20 and a specifc gravity greater than 5 are considered heavy metals. There are numerous metals and metalloids that can be classifed as heavy metals, including cadmium (Cd), mercury (Hg), copper (Cu), arsenic (As), lead (Pb), chromium (Cr), iron (Fe), nickel (Ni), and zinc (Zn) (Li et al. [2019](#page-22-3)). In the subsurface environment, heavy metals can enter via natural processes (dissolution of heavy metals from minerals) and anthropogenic processes (metallurgical, mining, nuclear energy, and chemical manufacturing) (Wu et al. [2019](#page-24-2)). Although Acid Mine Drainage (AMD) can form in the underground workings of deep mines (groundwater), its efects are typically limited when the groundwater table is artifcially lowered by pumping. Discharging contaminated groundwater is possible when mines are abandoned, and the pumps are turned off (Johnson and Hallberg [2005](#page-21-4)). Some mine waste products (tailings) are abandoned without treatment in Zanjan province. Insufficient information is available to determine whether these tailings are leaching or posing health risks. Mine tailings contain various sulfde minerals, including pyrite, sphalerite, chalcopyrite, and galena (Xiaolong et al. [2020\)](#page-24-3). Arsenic is primarily obtained as a secondary product from the treatment of copper, silver, gold, zinc, lead, and other metals (Morin and Calas [2006](#page-22-4)). Based on the redox conditions in the geological environment, arsenic (AS), AS (III), and AS (IV) concentrations difer signifcantly (Ying et al. [2011;](#page-24-4) Molinari et al. [2013](#page-22-5); Kanoua and Merkel [2017](#page-21-5); Islam et al. [2019\)](#page-21-6). The requirement for water for human health contributes to the economy's growth and the ecosystems' well-being (Basheer [2018](#page-20-3); Raju [2022](#page-23-5)). Heavy metal concentrations in groundwater, such as AS, Pb, Fe, Cu, and Zn, pose a signifcant threat to human health and ecosystems (Johnson and Hallberg [2005](#page-21-4); Kurwadkar et al. [2020](#page-22-6)). Several factors determine the form of AS and its transport, such as pH, redox potential (Eh), iron concentration, metal sulfde concentrations, sulfate ions concentrations, salinity, temperature, and microorganisms. Long-term consumption of AS in potable water and food can lead to various serious health problems, including melanosis, hyperkeratosis, skin cancer, restrictive lung disease, peripheral vascular disease, and gangrene (Buschmann et al. [2008](#page-20-4); Rahman et al. [2009;](#page-23-6) Rasool et al. [2016;](#page-23-7) Kanoua and Merkel [2017;](#page-21-5) Ahmad and Bhattacharya [2019\)](#page-20-5). In addition, excessive application of agrochemicals can contaminate groundwater through irrigation return fow due to retention in the unsaturated zone (Basheer and Ali [2018\)](#page-20-6). Moreover, heavy metals accumulated in crops and transported through the food chain pose a risk to human health (Nouri et al. [2008;](#page-22-7) Wongsasuluk et al. [2014;](#page-24-5) Lu et al. [2016](#page-22-8); Hembrom et al. [2020](#page-21-7)).

Research has been conducted using statistical methods, a Geographical Information System (GIS), and various diagrams to better understand Iran's hydrogeochemical evolution in arid and semi-arid regions (Parizi and Samani [2013;](#page-23-8) Barzegar et al. [2018;](#page-20-7) Joodavi et al. [2021](#page-21-8)). Hydrogeochemical studies and inversion geochemical modeling by pH-Redox-Equilibrium-Calculation (PHREEQC) have been used to determine the origins of salinity in the aquifer (Samani et al. [2015](#page-23-9)). To this end, the current study describes the hydrochemical characteristics of groundwater in Zanjan plain, northwestern Iran, using a series of approaches such as geological, hydrogeological, hydrochemical, statistical, and geochemical inverse modeling. Although some studies have been conducted in this area (Saatsaz et al. [2018](#page-23-10); Masoumi et al. [2019](#page-22-9); Mohammadi Arasteh and Shoaei [2020\)](#page-22-10), this is the first comprehensive investigation of groundwater chemistry in the study area, which correlates hydrochemical patterns with groundwater fow systems. The study was undertaken to fll this gap in scientifc knowledge. It also provides a suitable basis for future research. An important aspect of this study is the estimation of the contributions of both natural and anthropogenic (urban and industrial contaminations and mining activities) sources of salinity. This is achieved through assessing groundwater chemistry and using geochemical evolution models. Further, this study provides essential information to decision-makers about groundwater quality and management.

Location, geology and hydrogeology of the study area

Study area

The Zanjan plain is located in northwestern Iran and east of Ghazal Ozan River, between 48 to 49° east longitude and 36 to 37° north latitude (Fig. [1\)](#page-2-0). The Zanjanrood watershed is located in this area, known as the Zanjan-Soltaniyeh plain. The total area of this region is 4705 km^2 , of which 3038 km^2 are highlands and 1667 km^2 are plains. The aquifer occupies approximately 1200 km², or approximately 71.9% of the plain's total area, corresponding to approximately 25.5% of the total study area. This region is classifed as a semi-arid region due to its climatic conditions (Fig. [2\)](#page-2-1). The average annual temperature in the study area is 10 °C, and there are an average of 117 frosty days. The average annual evaporation and perspiration amount to 1025 mm. According to Fig. [3,](#page-3-0) Zanjan City and the industrial areas are located on agricultural lands with good to medium productivity

Fig. 1 Location of Zanjan plain

Fig. 2 Average precipitation in the Zanjan plain (Government of I.R. Iran [2020\)](#page-21-10)

and near vegetation. In these areas, household, urban, and industrial wastewater can absorb into the soil and enter the groundwater.

Geological setting

The Zanjan Soltaniyeh Plain is a wide and high valley formed by Quaternary sediments between the Tarom and Soltaniyeh mountains (Fig. [4](#page-4-0)). These heights (Horst), which include geological formations from the Precambrian period and the frst and second epochs, were raised during the third epoch (Stöcklin [1968;](#page-23-11) Abdi [2000](#page-20-8); Darvishzadeh [1991\)](#page-21-9). The area's oldest rocks date back to the Precambrian period and consist of metamorphic rocks, shales, and granite. These rocks have formed the area's bedrock (Table supplementary).

Dolomite, shale, and sandstone sedimentary rocks with a depth of 2000 m can be found in the Soltaniyeh Mountains, located at the plain's southernmost peaks. These rocks have formed Bayandor, Soltaniyeh, Barut, Lalun, and Zagun types of formations in the area. Another formation in the Soltaniyeh Mountains is the Mila Formation, consisting of thicklayer dolomites with chert nodules; quartzite, sandstone, and

Fig. 3 The Zanjan plain's land use

shale with calcareous dolomite sandstones being part of the Doroud Formation; and well-layer limestones with dark gray forming the Routeh Formation Black, which is located on sandstone and shale formations. The area's shale sandstone sediments with lower Jurassic trace vegetation and marine limestone formations known as the Delichai and Lar Formations are exposed to rocks of the second period.

The Lar Formation is exposed to a small area of light limestone in the Soltaniyeh Mountains and covers the same slope as the Shemshak Formation. In the study area, the formations of the third period are more widespread than those of the other periods. Most of these formations are volcanic rocks and thick tufs, usually located in the north and east of the basin (Stöcklin [1968](#page-23-11); Abdi [2000](#page-20-8); Darvishzadeh [2003\)](#page-21-11). In Eocene volcanoclastic rocks, these intrusive events are characterized by altered halos. Subvolcanic intrusions are associated with silicic, argillic, propylitic and sericitic hydrothermal alteration (Karimzadeh Somarin [2006](#page-22-11)). These hydrothermal alteration halos are associated with gold, copper, lead–zinc, iron, and kaolinite mineralization (Azizi et al. [2010](#page-20-9)). Fourth-period evaporitic sediments include marl and brown, yellow, and pink gypsum silty clay strata, with sand layers deposited southeast of Zanjan, related to the aging Pliocene period and having a 200-m thickness. Several of these sediments can be found in the impermeable bedrock of the plains or the hilly areas at the end of the plain. There are sequences of lime, shale, marl, and evaporated sediments within the Qom Formation. This formation is composed of layers of shale and sandstone of the Shemshak group (Stöcklin [1968;](#page-23-11) Abdi [2000](#page-20-8); Darvishzadeh [2003\)](#page-21-11).

In the present era, alluvial sediments of the plain and along the Zanjanrood River, along with the alluvial deposits at the mouth of the channels that enter the plain alluvial formations of the region, constitute alluvial deposits consisting of gravel, sand, and low-density clay (Aghanabati [2004\)](#page-20-10). As with the formations mentioned previously, the Zanjan aquifer is classifed as a phreatic aquifer (Stöcklin [1968;](#page-23-11) Abdi [2000](#page-20-8); Darvishzadeh [2003\)](#page-21-11).

Fig. 4 Geological map (Eftekhar Nezhad et al. [\(1996](#page-21-13))) and groundwater samples of Zanjan plain

Hydrogeology

The Zanjan plain consists of a series of alluvial sediments and river terraces, whose thickness generally decreases from the south to the north of the plain. According to long-term statistics, Zanjan's average annual rainfall is 310 mm, and its runoff volume is about 2 billion $m³$. The aquifer has been observed that the region's aquifer is typically replenished by snowmelt from mountains and rivers (Mohammadi Arasteh and Shoaei [2020\)](#page-22-10). In some instances, however, it has been observed that the aquifer itself replenishes the rivers.

The Zanjan River is the most important river in the study area. According to general divisions of Iranian basins, this river is a part of the Sefd-Rud catchment. Sefd-Rud is the largest catchment area and the most waterlogged region in Iran's northern and central regions. The Zanjan aquifer consists of alluvial sediment sequences and river terraces of varying thicknesses. Towards the north and center of the plain, they reach a height of more than 500 m and gradually decrease in the northern parts of the aquifer. On the southern side of the mountains, sediment granulation includes coarse-grained sediments such as pebble and gravel and fnegrained sediments along the Zanjan River. Moreover, silt and clay are predominant in the northern part of the aquifer (Mohammadi Arasteh and Shoaei [2020](#page-22-10)).

The margins of the Mountains are typically composed of limestone from the Mila, Lar, and Qom formations. These formations in this study area are considered to be potential karst resources. A large portion of the plain's bedrock is composed of clay-marl units (formations such as Kahar, Bayandor, Barut, and Shemshak) dating back to the Miocene and Pliocene epochs. These bedrocks have a synclinal structure, and the slope on the sides is approximately 30° to 40° towards the center. In general, the size of the sedimentary particles is larger in the eastern half of the plain than in the western half. In addition, the yield of the alluvial aquifer is signifcantly higher (Government of I.R. Iran [2020](#page-21-10)). An important hydrogeological characteristic of an aquifer is its transmissivity, which plays a signifcant role in determining the quality of groundwater resources and the spread of contaminants (Awasthi et al. [2005;](#page-20-11) Gholami et al. [2022\)](#page-21-12). Pumping tests have been performed to determine the transmissivity of the aquifer. The aquifer transmissivity values increase from the south of the plain to the center due to the increase in saturated thickness of the aquifer and the coarseness of its sedimentary particles (Fig. [5](#page-5-0)). In contrast, at the end (northern part of

Fig. 5 Transmissivity in the Zanjan plain

the aquifer), the aquifer transmissivity values decrease due to the fneness of its sedimentary particles (Government of I.R. Iran [2020\)](#page-21-10). The thickness of the alluvial sediments in the plain varies from 10 to 150 m, and the thickness increases from the mountains toward the center. Alluvial sediment thickness has increased in the eastern part of the study area (Fig. [6\)](#page-6-0) due to fault systems, mountain rise, and erosion (Government of I.R. Iran [2020](#page-21-10)). The alluvial sediments in the west and northwestern parts of the plain consist of clay, sand, and gravel, which are placed on the clay bedrock (Fig. [6](#page-6-0)).

A general estimate of the aquifer's storage factor is 5% (Government of I.R. Iran [2020\)](#page-21-10). In order to determine groundwater balance, the total inputs and outputs from/to the aquifer are compared over a specifed period (balance period), written as follows:

$$
\sum \text{InputStream} - \sum \text{OutputStream} = \text{Change in aquifer.} \tag{1}
$$

As a result of considering the inputs and outputs of the Zanjan aquifer, the following balance equation was derived:

$$
\pm \Delta V = (Q_{\rm in} + Q_{\rm is}) - (Q_{\rm W} + Q_{\rm Eg} + G_{\rm d} + Q_{\rm Out})
$$
 (2)

where Q_{in} denotes groundwater inflow through the aquifer boundary or the amount of water leaking from the bedrock, *Q*is represents surface infltration of water from various sources into the aquifer, Q_W is the extraction and discharge of water from the aquifer by wells, Qanats, and springs, Q_{Eg} denotes the evaporation of groundwater in areas where the groundwater level is close to the surface, G_d represents natural or artificial drainage of the aquifer, Q_{out} is discharging

Fig. 6 Hydrogeological profle A–B (Government of I.R. Iran [2020](#page-21-10))

groundwater from the aquifer, and Δ*V* denotes the volume change of the aquifer storage. Q_{is} is written as follows:

$$
Q_{\rm is} = Q_{\rm P} + Q_{\rm I} + Q_{\rm SW} + Q_{\rm R}.
$$
 (3)

*Q*P denotes recharging from precipitation on the aquifer's surface, Q_{I} represents recharge from agricultural irrigation consumptions, Q_{SW} denotes recharge from drinking water and industrial wastewater, and Q_R is recharge from rivers or surface fows. Each term is expressed as a volume of water during the balance period (million m^3 /year).

As shown in Table [1](#page-6-1), the aquifer's water output volume exceeds its input volume. As a result, Δ*V* becomes negative. Among the largest output volumes from the aquifer is the Q_w factor, which is transferred out of the aquifer through exploitation wells, springs, and Qanats. A large volume of water is extracted by exploitation wells, reducing the quality of the entire aquifer. The groundwater level map (Fig. [7\)](#page-7-0) reveals that the water fow originates in the eastern foothills and reaches the Zanjan River's base. In other words, the groundwater flow in the region is southeast–northwest, from the foothills to the east and fnally to the Zanjan River. Figure [8](#page-7-1) shows that groundwater levels in the Zanjan aquifer have decreased signifcantly over the past ten years (average reduction of approximately 40 cm per year). Several factors are responsible for the decline in groundwater levels, including a decrease in rainfall, uncontrolled water usage, and rapid development of agricultural lands. Over time, this decrease in groundwater level is likely to be accompanied by a reduction in the volume of aquifer water (discharge volume), an increase in the exchange of groundwater resources with aquifer materials, and ultimately the destruction of the groundwater quality (Mohammadi Arasteh and Shoaei [2020\)](#page-22-10).

Materials and methods

In September 2020, 45 well samples were collected to identify the water chemistry (Fig. [4\)](#page-4-0). In order to determine the physicochemical parameters of the samples, previous studies' procedures were followed (APHA [2012;](#page-20-12) Amiri et al. [2021](#page-20-13); Rezaei et al. [2021;](#page-23-12) Ganiyu et al. [2021](#page-21-14)). The used bottles (1 L) were dry, clean, and sterilized polyethylene. Before sampling, bottles were pre-washed with $1:1$ HNO₃ and rinsed three times. A portable measuring instrument (WTWCond 340i, Germany) was used to measure the samples' EC, TDS, and pH immediately after collection in the feld. Each electrode has been calibrated before and after each measurement. The water samples were stored at 4 °C until further analysis in the laboratory. Within 48 h after the sampling campaign, ions such as chloride, bicarbonate, carbonate, sulfate, sodium, potassium, calcium, magnesium, iron, zinc, and lead were analyzed. Some methods have been used in this study to measure ionic concentrations. For measuring Ca, Na, and K content flame photometry have

Table 1 Groundwater balance in the Zanjan plain (MCM/year) (Government of I.R. Iran [2020](#page-21-10))

Fig. 7 Direction of groundwater flow in Zanjan plain

Fig. 8 Groundwater level decline in Zanjan plain

applied. Titrimetry was used for determining $HCO₃$ and $CO₃$ content. Cl concentration measured by titration with $AgNO₃$. Nitrate was measured by spectrophotometry (HACH-RD2000). TDS was measured by evaporating a pre-fltered sample to dryness at 105–110 °C. Quality assurance and quality control (QA/ QC) of the analytical data included using standard operating procedures, checking reagent blanks and standards, and analyzing replicates of collected QC samples. Ionic balances calcu- $\text{lated as} \left(\frac{\text{cations} - \text{anions}}{\text{cations} + \text{anions}} \right)$ \times 100 were used to identify analytical precision for ions, typically within 10%. An ICP-MS device (HP Agilent 4500) was used to analyze the fltered and acidifed groundwater samples for Fe, Pb, and Zn elements at the university's Zanjan Laboratory. The main recharge sources of phreatic groundwater are precipitation, irrigation, and seepage of surface water (Gao et al. [2019\)](#page-21-15). The Zanjan aquifer is considered as phreatic aquifer (Stöcklin [1968](#page-23-11); Abdi [2000](#page-20-8); Darvishzadeh [2003](#page-21-11)). The phreatic aquifers are more susceptible to contamination than confned aquifers, particularly anthropogenic activities (Abdesselam et al. [2013;](#page-20-14) Gao et al. [2019\)](#page-21-15).

First, the status of the data in terms of normality was analyzed, and due to the non-normality, the following steps were performed on the samples before statistical analysis.

The following equations were used for standardization: (a) Logarithmic transformation was applied to the data, and (b) The following equations were used for standardization:

$$
Z = x - u/s,\tag{4}
$$

where *x* denotes the parameter's value, *u* represents the average value of the parameter, and *s* is the standard deviation. This data standardization process leads to equal weight in the diferent variables, especially since the Euclidean mean distance method is infuenced by higher-weight variables (Güler et al. [2002\)](#page-21-16).

Using correlation coefficients to demonstrate relationships between various variables—independent and dependent—is a common and valid method of demonstrating these relationships (Kumar et al. [2006](#page-22-12); Howladar et al. [2016\)](#page-21-17). The abnormal distribution of parameters led to using Spearmen rank correlation. This indicator shows the degree of correlation between two relative variables, and its value fuctuates between + 1 and -1 . The positive value means changes in the two parameters occur in the same direction, while the negative means two factors change in opposite directions. Zero indicates that there is no meaningful relationship between these two factors (Cohen [1988](#page-21-18)). Hydrochemical facies have been introduced to defne the hydrochemical properties of a groundwater system (Sing 2011; Wang et al. [2017;](#page-24-6) Adimalla and Li [2019\)](#page-20-15). These facies represent the distribution of diferent main dissolved ions in aquifers at a specifc site (Back and Hanshaw [1965](#page-20-16)). The Hierarchical Cluster Analysis (HCA) is a useful method for determining hydrochemical types and their origins (Cloutier et al. [2008](#page-20-17); Saberinasr et al. [2019\)](#page-23-13). FA efficiently reduces dimensions, classifes the obtained data into minimal practical components, and illustrates as much information as possible. FA was applied using the Principles Component Analysis (PCA) based on eigenvalues higher than one and varimax rotation to detect partial contributions and determine the optimal number of factors. In addition, Kaiser Normalization is essential to obtain the optimal number of active components. Sampling adequacy for the PCA method was also assessed by Kaiser–Meyer–Olkin measurement (KMO>0.5).

The geochemical reactions, occurring along flow pathways within groundwater systems, have been investigated with several geochemical models. For a geochemical model to be applied to aqueous media, it must assumed that the dissolved species are in chemical equilibrium with each other (Plummer [1992\)](#page-23-14). Inverse geochemical models can be developed to model the variation in the chemical composition of groundwater caused by hydrogeochemical processes such as dissolution, precipitation, ion exchange, sorption, and desorption occurring along the fow path (Apodaca et al. [2002](#page-20-18)). In order to apply such models, two mixtures of water at various points and a number of phases must exist along the flow path (Parkhurst et al. [1980](#page-23-15)). This model determines the phase transitions and reactants along the fow path and maintains the molecular equilibrium. The Geochemical processes and saturation indices were calculated with the PHREEQC inverse model program. Inverse geochemical models have a wide range of applications.

There are various software and methods that demonstrate the importance of the hydrogeochemical evolution of groundwater (Yu et al. [2018](#page-24-7); Guma et al. [2021](#page-21-19); Suvarna et al. [2022](#page-23-16)). This study utilized Arc GIS 10.3 software to create geological, DEM, and piezo-metric maps. Also, SPSS 22 software with correlation coefficients, HCA, PCA, and Factor Analysis (FA) has been applied to defne the link between measured parameters.

Saturation Index (SI) was calculated using PHREEQC version 2 for evaporates (gypsum, anhydrite, and halite), carbonates (calcite, dolomite, and aragonite), an iron sulfde mineral (pyrite), and iron oxide minerals (hematite and goethite) in order to determine chemical equilibrium between various host minerals and groundwater (Parkhurst and Appelo [1999\)](#page-23-17). Measured parameters such as SI and Total Hardness (TH) are depicted in Table [2](#page-8-0). SI values can be afected by factors such as Ion Activity Product (IAP) and Solubility Product Constant (*K*sp). By using the inverse geochemical model, it is possible to determine the reactions that afect the hydrochemistry of water along the fow path. Based on the model, the phase changes and reactions along the path are determined (Parkhurst et al. [1980](#page-23-15); Parkhurst and Appelo [1999\)](#page-23-17). In the Zanjan aquifer, inverse geochemical models were calculated with the PHREEQC software. The inverse geochemical model was used to identify reactions afecting the hydrochemistry of water along the fow path.

Results and discussion

Physico‑hydrochemical characteristics of groundwater

Statistical analysis

Statistical analysis of the main dissolved ions and physicochemical parameters in the basin of the Zanjan is illustrated in Table [3](#page-9-0). The data normality was assessed by a

Table 2 Equations used for calculating SI and TH

Parameter	References
$SI = \log(IAP/Ksp)$	Parkhurst and Appelo (1999)
$TH = 2.497Ca^{2+} + 4.115Mg^{2+}$	Todd (1980)

Table 3 Statistical description of the physical parameters of the main ions of Zanjan plain

*WHO [\(2017](#page-24-8))

one-sample Kolmogorov–Smirnov test, and the results indicate that most of the parameters are abnormally distributed (signifcant level of 0.05). In addition, the skewness and elongation values confrm the abnormal-ity (Table [3](#page-9-0)). Based on WHO [\(2017](#page-24-8)), ions such as Ca^{2+} , Mg^{2+} , Na⁺, K⁺, and Cl[−] are within the optimal range. However, some ions have values that exceed the standard values. The major sources of groundwater HCO_3^- are the dissolution of calcite and dolomite and anoxic biodegradation of organic matter. This may come from urban sewage, domestic sewage, septic tanks, and landflls (Nematollahi et al. [2016;](#page-22-13) Rezaei and Hassani [2018\)](#page-23-19). The concentration of HCO₃⁻ should not exceed 240 mg/l (WHO [2017\)](#page-24-8), even though it is safe and has no known adverse health effects. The bicarbonate content ranges from 75.6 to 325.7 mg/l. The average sulfate concentration is 164.3 mg/l, and the range is 34.5 to 444.4 mg/l. Sulfate in drinking water may produce signifcant taste problems and contribute to corrosion of distribution systems at concentrations above 250 mg/l. However, at concentrations above 500 mg/l, sulfate can have health-related effects such as gastrointes-tinal effects (WHO [2017](#page-24-8)). In groundwater, sulfate primarily originates from weathering of gypsum and anhydrite, and industrial wastes (Fianko et al. [2009](#page-21-20)). Nitrate levels in groundwater ranged from 16 to 66 mg/l, with an average of 38.8 mg/l. According to WHO guidelines, 50 mg/l of nitrate is the maximum amount of nitrate acceptable in drinking water (WHO [2017](#page-24-8)). Intake of high levels of nitrates can result in a variety of diseases, including thyroid dysfunction, breathing problems, fatigue, and

multiple sclerosis (WHO [2017](#page-24-8); Vanhatalo et al. [2018](#page-23-20)). In some parts of the Zanjan City and industrial areas were still wastewater is not fully collected, and it is disposed of in a traditional manner (Eslami and Ghadimi [2013](#page-21-21)). There are two main sources of nitrate in urban areas: (1) direct infux of nitrate from mineral fertilizer and sewage, and (2) infux of nitrate from nitrifcation of ammonium resulting from mineral fertilizers, soil organic nitrogen mineralization and sewage as well as the urea hydrolysis in human wastes (Mattern et al. [2009;](#page-22-14) Zendehbad et al. [2019\)](#page-24-9). The maximum TDS in drinking water is 1000 mg/l (WHO [2017\)](#page-24-8). Groundwater with a high TDS cannot be used for irrigation or drinking water (Nematollahi et al. [2016;](#page-22-13) Rawat et al. [2018](#page-23-21)). The TDS values in the groundwater samples ranged from 179 to 1264 mg/l, with an average of 526.7 mg/l. The EC measures the electric current capacity of water (Meride and Ayenew [2016](#page-22-15)). There is a wide range of conductivity values, ranging from 260.5 to 6023.7 μs/cm, with an average value of 1328.9 μs/cm. Groundwater samples with high EC values indicate salt enrichment. The maximum EC level in drinking water is 1500 μs/cm (WHO [2017](#page-24-8)). Pipes can corrode more readily when water contains a hardness lower than 100 mg/l. Aside from reducing soap's ability to lather, hardness also leads to scaling formation in plumbing fxtures and pipes. (Nematollahi et al. [2016](#page-22-13)). The calculated TH values in Table [2](#page-8-0) range from 117.2 to 757.9 mg/l, with an average of 242.2 mg/l. The maximum permissible concentration of TH in drinking water is 500 mg/l, while 100 mg/l is the most desirable concentration (WHO [2017\)](#page-24-8).

Cluster analysis

The primary role of cluster analysis is to identify groups of similar items in a data series using various analytical techniques. Hierarchical clustering methods provide a hierarchy of clusters, from small clusters of very similar cases to large clusters that include other dissimilar cases (Holland [2006](#page-21-22)). Fourteen hydrochemical parameters in the HCA, including Ca^{2+} , Mg²⁺, Na⁺, K⁺, Cl⁻, SO₄²⁻, HCO₃⁻, CO₃²⁻, NO₃⁻, $Fe²⁺, Zn²⁺, Pb²⁺, EC, and pH were measured in this study.$ In this study, two groups were identifed from a dendrogram, each representing specifc hydrogeochemical facies. In the dendrogram, distance 10 is taken into consideration for clas-sification (Fig. [9](#page-10-0)).

Group 1, the frst group of water samples, comprised 82% of the water samples. This group showed low salinity, and its cation and anion order was $Na^+ > Ca^{2+} > Mg^{2+} > K^+$ and $HCO_3^- > SO_4^{2-} > Cl^- > CO_3^{2-}$, respectively. The high sodium content indicates the weathering of feldspars minerals, including albite, in the study area. The origins of high bicarbonate and calcium contents are mainly related to Mila, Lar, and Qom formations—these are all carbonate formations located southwest and west of the study area. Group 2 accounted for 18% of total water samples. $Na⁺ > Ca²⁺ > Mg²⁺ > K⁺$ were the predominant constituents, while for anions, $SO_4^2 > HCO_3^- > Cl^- > CO_3^2$ were dominant for anions. This group is dominated by sulfate as the predominant anion and sodium as the dominant cation (Na–Ca–SO₄). The source of high Na⁺ in this group is evidence of weathering sodium plagioclase minerals such as albite and change in water type due to releasing pollutants via numerous industrial towns (Naidu et al. [1985\)](#page-22-16) in the study area.

Consequently, Group 1 includes water in the southwest and southeast, east, south, and northeastern parts of the area that are recharged by the highlands in the southeast, southwest, and northeastern parts. Group 2 includes groundwater near Zanjan City and Zanjan industrial towns in the central parts of the study area (Fig. [10\)](#page-11-0). According to the fow path (Fig. [7](#page-7-0)), group 2 can also be considered a discharge zone for zone 1. Previously, the Zanjan province reported heavy metal contamination near mining and smelting sites for lead, zinc, iron, and copper. In Zanjan, heavy metal contamination has also been reported at lead and zinc mining and smelting sites. Transporting concentrated ore by truck from mines to industrial sites, particularly the Zinc Industrial Complex, is another anthropogenic source of metal contamination (Parizanganeh et al. [2010;](#page-22-17) Zamani et al. [2012](#page-24-10); Nabatian et al. [2015;](#page-22-18) Khosravi et al. [2018](#page-22-19); Jamal et al. [2019](#page-21-23)). In the vicinity of the industrial complex, 2.5 million tons of tailings have been drained, causing contamination of soil, surface water, and groundwater. Tailings from the industrial complex are

Fig. 9 Clustering of groundwater samples in the Zanjan plain

Fig. 10 Group of groundwater samples in the Zanjan plain

dumped in the open at extremely high metal levels in the vicinity of the complex (Parizanganeha et al. [2010](#page-22-17)). Consequently, water salinity increased in these areas, and group 2 is formed according to the HCA classifcation.

Spearman correlation

It is possible to determine the origin of solutes and the processes infuencing observed water composition by investigating the compositional relations among dissolved species (Jalali [2007;](#page-21-24) Singh et al. [2008;](#page-23-22) Azaza et al. [2011](#page-20-19)). Due to the non-normal distribution of the data, Spearman rank correlation was utilized to determine the correlation between varia-bles (Table [4](#page-12-0)). There is a 0.6 correlation between Mg^{2+} , Na⁺, K^+ , HCO₃⁻, and TH, indicating a good correlation between these ions. $Na⁺$ and $K⁺$ are correlated due to the dissolution of evaporating minerals, while Mg^{2+} , HCO_3^- , and TH are associated due to carbonates weathering. In addition, the correlation between Na^+ and Mg^{2+} indicates weathering

of silicates. The correlation between Na^{+} , K^{+} , Cl^{-} , and SO_4^2 ⁻ is 0.8 due to evaporation dissolution. Na⁺ and K⁺ correlations can also be the result of industrial activities. These correlations indicate that the dissolution of carbonates and evaporite minerals are crucial factors that increase TH, TDS, and EC.

Factor analysis

Identifying a set of hydrogeological conditions and hydrochemical processes that afect groundwater quality is difficult. Groundwater quality is controlled by a variety of hydrogeological conditions and hydrochemical processes. Therefore, hydrogeochemists use FA (Jollife [2005](#page-21-25)). This is a statistical technique that simplifes complex relationships among observable variables. The results of the chemical analysis are considered observable variables in hydrogeochemical studies. Groundwater quality data can be interpreted using this method for hydrogeological

Table 4 Spearman correlation between ions

	Ca^{2+}	Mg^{2+}	$Na+$	K^+	$HCO_3^ CO_3^2^ SO_4^2^-$			Cl^-	Fe^{2+}	Pb^{2+}	Zn^{2+}	pH	TH	EC	TDS
Ca^{2+}															
Mg^{2+}	0.04	1													
$Na+$	0.29	$0.62**$	-1												
K^+	0.18	$0.63**$	$0.86**$												
HCO_3^- 0.32 [*]		$0.62**$	$0.48**$	$0.51**$	1										
CO ₃ ^{2–}	0.06	$\overline{0}$	0.13	0.08	-0.05	1									
SO_4^2 ⁻	$0.43***$	$0.61**$	$0.8**$	$0.59**$	0.19	0.09	$\overline{1}$								
Cl^-	$0.4***$	$0.5**$	$0.8**$	$0.83**$	$0.44**$	0.09	$0.56**$	$\overline{1}$							
Fe^{2+}	$0.38*$	-0.09	$0.38**$	0.27	-0.05	-0.16 0.34*		$0.43**$	$\mathbf{1}$						
Pb^{2+}	$-0.38***$	-0.03	θ	0.09	-0.02	0.08	-0.16	0.02	0.05	$\overline{1}$					
Zn^{2+}	-0.21	$-0.33*$	$-0.39**$	$-0.44**$	$-0.33*$	$\overline{0}$	$-0.32*$	$-0.31*$	-0.16 0/27		$\overline{1}$				
pH	-0.3^*	0.08	-0.05	0.09	$-0.34*$	0.26	0.11	-0.06		$-0.23 -0.03$ 0.03					
TH	$0.55***$	$0.82**$	$0.67**$	$0.62**$	$0.71**$	0.05	$0.71**$	$0.63**$	0.16		-0.18 $-0.39**$	-0.08 1			
EC	$0.47***$	$0.78**$	$0.9**$	$0.78**$	$0.63**$	0.09	$0.83**$	$0.77**$	$0.3*$		-0.06 $-0.41**$		-0.08 0.91** 1		
TDS	$0.47***$	$0.73**$	$0.91**$	$0.78**$	$0.48**$	0.13	$0.89**$	$0.78**$	$0.33*$		-0.09 $-0.37*$		-0.02 0.85** 0.97** 1		

N=45

*Correlation is significant at $p = 0.05$ (two-tailed)

**Correlation is significant at $p = 0.01$ (two-tailed)

processes. These analyses have the primary objective of identifying the factors or factors that can explain the dispersion of hydrochemical data (Smith [2002](#page-23-23)). Factor loads, hydrogeological conditions, and geological and hydrochemical processes are used to interpret and determine the origin of diferent factors. It is essential to standardize data to perform this analysis. The number of factors was determined using the Kaiser Method (Kaiser [1960](#page-21-26)) and varimax rotation. Three factors and sixteen variables are included in the factor model. According to FA, these factors account for approximately 71% of the total variance in hydrogeochemistry. Approximately 46.5% of the total is determined by factor one, 15% by factor two, and 10% by factor three.

Coefficients above 0.6 are represented in bold in Table 5 , indicating each factor's efective parameters. The following FA variables are considered: Ca^{2+} , Mg^{2+} , Na^{+} , K^{+} , HCO_3^- , Cl⁻, SO₄²⁻, CO₃²⁻, pH, Fe²⁺, Pb²⁺, Zn²⁺, NO₃⁻, TH, TDS and EC. There is a high positive factor loading factor 1 for Ca^{2+} , Mg²⁺, Na⁺, K⁺, HCO₃⁻, SO₄²⁻, Cl⁻, TH, TDS, and EC, which accounts for 46.49% of variances. In groundwater, Na⁺, K⁺, Cl[−], and SO₄^{2−} ions have a high factor loading, indicating a common source (evaporite minerals), and Ca^{2+} , Mg^{2+} , HCO_3^- , and TH come from carbonates sources. Furthermore, the dissolution of minerals in igneous rocks such as plagioclase (albite and anorthite) causes increased $Ca²⁺$ and Na⁺ ions in groundwater. These minerals increase the EC and TDS of water, particularly the dissolution of evaporite minerals. Approximately 15 percent of the total

Table 5 Factor analysis between ions

Parameter	Component						
	$\mathbf{1}$	2	3				
Ca^{2+}	0.69	-0.12	0.41				
Mg^{2+}	0.86	0.05	-0.09				
$Na+$	0.83	-0.13	-0.07				
K^+	0.84	0.00	0.14				
HCO ₃	0.61	0.34	0.29				
CO_3^{-2}	0.09	0.03	-0.66				
$\mathrm{SO_4}^{-2}$	0.85	-0.25	-0.11				
Cl^-	0.86	-0.13	0.19				
Fe^{+2}	0.20	0.65	0.49				
Pb^{+2}	-0.05	0.83	0.02				
Zn^{+2}	-0.02	0.86	0.02				
NO_3^-	-0.07	0.22	-0.06				
pH	-0.06	-0.04	-0.86				
TH	0.90	-0.05	0.20				
EC	0.99	-0.10	0.09				
TDS	0.97	-0.14	0.01				
% of Variance	46.49	14.80	9.70				
Cumulative %	46.49	61.29	70.99				

Extraction method: principal component analysis

Rotation method: varimax with Kaiser normalization

variance is accounted for by factor 2, which indicates a high factor load in Pb, Zn, and Fe ions due to the dissolution of igneous minerals and municipal wastewater.

The water–rock interaction is a crucial factor in hydrogeochemistry, as shown by factor 1. In addition, in group two samples (near industrial areas), factor 2 indicates that industrial wastewater is a source of pollution. Industrial wastewater contributes to increased ions in groundwater concentrations of Fe²⁺, Zn^{2+} , and Pb²⁺ ions. A high factor loading of EC and TDS in factor 1 with main ions indicates that groundwater salinization can be affected by increased ion concentration due to interactions between groundwater and geological formations. Factor 3 consists of two main components, CO_3^2 ⁻ and pH, contributing 9.7% to the total variance. There is a significant correlation between CO_3^2 ⁻ and pH in factor 3, indicating that alkaline groundwater has a higher CO_3^2 content. Carbonic acid promotes the incomplete dissolution of siliceous minerals, resulting in bicarbonate ions and cations forming. After a long time, carbonate minerals are precipitated.

Consequently, the re-dissolution of these carbonate minerals can efectively impact this factor. A high factor load in this factor is also due to the weathering of carbonate minerals leading to an increase in pH (Table [5\)](#page-12-1). Spearman correlations are consistent with FA results.

Investigation of the chemical evolution of groundwater using hydrogeochemical techniques

Hydrogeochemical facies

Chemical processes operating within the lithologic framework, as well as patterns of water flow, are reflected by facies. Groundwater fow through the aquifer system infuences the distribution of facies within one formation or a group of uniform mineralogy formations (Back [1966](#page-20-20)). The Piper diagram (Piper [1944](#page-23-24)) has been used to characterize the type of groundwater. Figure [11](#page-13-0) illustrates the two water groups on a Piper diagram. Based on cluster analysis and the Piper diagram, the frst group contains approximately 82% of the samples in this group.

As mentioned before, the water type in group 1 is $Na-Ca-HCO₃$. Weathering of feldspars, evaporites minerals and carbonates minerals increase Na^+ , Ca^{2+} , and HCO_3^- , respectively. Group 1 water consists of CaHCO₃ (46.67%), CaMgCl (33.33%) and NaCl (2.22%), respectively. Due to the dissolution of dolomite, shale, and evaporite formations in the south and southwest of the plain (Qom and Shemshak formation), the water type has changed to the CaMgCl and

Fig. 12 Gibbs diagram of water samples in the study area

NaCl. According to Spearman's table (Table [4\)](#page-12-0), carbonate, silicate, and evaporite minerals are dissolved. The type of water in group 2 is Na–Ca–SO₄, which contains approximately 18% of the samples. In group 2, the water type is NaCl (11.12%), CaMgCl (4.44%) and CaHCO₃ (2.22%), respectively. High salinity in this group results from the evaporite minerals (halite, gypsum) and the release of pollutants from nearby industrial towns. According to Table [5,](#page-12-1) the salinity of the water has increased near industrial cities.

Controlling mechanisms of groundwater chemistry

The geochemical composition of groundwater is mostly infuenced by water–rock interactions (Appelo and Willemsen [1987\)](#page-20-21). Rock weathering and dissolution of host rock minerals and ion exchange are the main processes responsible for ion formation in groundwater (Liu et al. [2017](#page-22-20)). Gibbs diagrams (Gibbs [1970\)](#page-21-27) provide a more comprehensive understanding of hydrochemical processes such as precipitation, rock weathering, and evaporation, which have been used in the groundwater of the Zanjan aquifer (Fig. [12](#page-14-0)). In Gibbs diagrams, the ratio of dominant cations $(Na^+/Na^+ + Ca^{2+})$ and anions $(Cl^-/Cl^- + HCO_3^-)$ is plotted against the total dissolved solids (TDS). Figure [12](#page-14-0) illustrates that approximately 87% of groundwater samples are in a rock weathering zone. In the study area, the groundwater chemistry of the Zanjan plain is primarily controlled by the chemical weathering of rock-forming minerals or water–rock interactions. The semi-arid climate leads to increased evapotranspiration in the study area. Therefore, evaporation should also be regarded as an efective concentration indicator for further enrichment of ions dissolved in groundwater. In semi-arid regions, the Na⁺/Cl[−] to EC ratio is a useful indicator of salinity mechanisms. The Na/Cl ratio in groundwater will not change due to evaporation; however, TDS will increase, which is a helpful indicator of evaporation. The

Na/Cl ratio should remain constant with increasing EC as long as evaporation is the dominant process (Jankowski and Acworth [1997](#page-21-28)). Most samples in Fig. [13](#page-14-1) are above equilibrium, and the average of this ratio is approximately 2.5. This

Fig. 13 Relationship between Na/Cl and EC in the study area

indicates that weathering of silicate minerals has resulted in an increase in $Na⁺$ in the groundwater. Water rock interactions and dissolution of sodium-containing minerals, such as granite, granodiorite, and andesite rocks, increase Na⁺ concentration in groundwater. The ion exchange reactions are more predominant than evaporation. Furthermore, Gibbs diagrams indicate that evaporation is not a dominant process in this study area; however, it should be considered, especially in group 2.

Oxidation pyrite and neutralization reactions

Several host rock alterations are associated with ore bodies, including silicifcation (quartz and chert), sericitization (quartz, sericite, and pyrite), and carbonate alteration (calcitic to ankeritic minerals). Argillaceous alteration

assemblages are also associated with ore, including kaolinite, sericite, quartz, and pyrite (Karimzadeh Somarin [2006](#page-22-11); Nabatian et al. [2014](#page-22-21), [2015](#page-22-18); Ghazban et al. [2015\)](#page-21-29). Sulfde minerals and their oxidation products are the leading causes of AMD. Among the minerals that have the potential to produce AMD, pyrite is the most important. AMD production capacity is afected by the concentration, grain size, and distribution of pyrite minerals. Pyrite is considered as a complex chemical compound that is oxidized both abiotically and microbially under oxic conditions (Nordstrom and Alpers [1999](#page-22-22)). The pyrite oxidation reaction is primarily carried out in two ways (Eqs. $5, 6$ $5, 6$).

$$
\text{FeS}_{2(s)} + \frac{7}{2}\text{O}_{2(g)} + \text{H}_2\text{O}_{(1)} \rightarrow \text{Fe}^{+2}_{(aq)} + 2\text{H}^+_{(aq)} + 2\text{SO}^{-2}_{4(aq)}, (5)
$$

$$
\text{FeS}_{2(S)} + 14\text{Fe}^{+3}_{\text{(aq)}} + 8\text{H}_2\text{O}_{\text{(l)}} \rightarrow 25\text{Fe}^{+2}_{\text{(aq)}} + 16\text{H}^+_{\text{(aq)}} + 2\text{SO}^{-2}_{4\text{(aq)}}.
$$
\n
$$
(6)
$$

Pyrite's oxidation reaction is highly dependent on pH conditions. Three major components are required for these reactions: pyrite, oxygen, and water. This reaction is carried out $(pH<4.5)$ under suitable acidic conditions (Eqs. [5](#page-15-0), [6\)](#page-15-1). The following reactions occur above pH 4.5, which may result in the production of goethite (Eqs. [7](#page-15-2)[–9\)](#page-15-3) and oxidation of galena (Eq. [10](#page-15-4)) (Stumm and Morgan [1981\)](#page-23-25). The pH of the samples in the study area varies between 7.2 and 8. Thus, hematite and goethite minerals are produced, and galena is oxidized.

$$
\text{FeS}_{2(S)} + \frac{15}{4}O_{2(g)} + \frac{5}{2}H_{2}O_{(1)} \rightarrow \text{FeOH}_{(S)} + 2SO_{4(aq)}^{-2} + 4H_{(aq)}^{+},
$$
\n(7)

$$
S_{(aq)}^{-2} + \frac{7}{2}O_{2(g)} + H_2O_{2(l)} \rightarrow 2SO_{4(aq)}^{-2} + 2H_{(aq)}^{+},
$$
 (8)

$$
\text{Fe}_{\text{(aq)}}^{+2} + \frac{1}{4}\text{O}_{2\text{(g)}} + \frac{3}{2}\text{H}_2\text{O}_{\text{(l)}} \rightarrow \text{FeOOH}_{\text{(s)}} + 2\text{H}^+_{\text{(aq)}},\tag{9}
$$

$$
PbS_{(S)} + O_{2(g)} \rightarrow Pb_{(aq)}^{+2} + SO_{4(aq)}^{-2} + 2H_2O_{(l)}.
$$
 (10)

During sulfde oxidation, neutralization reactions are vital to determining the composition of AMD. Weathering silicate minerals such as plagioclase (albite Eq. [11,](#page-15-5) anorthite Eq. [12\)](#page-15-6) and orthoclase (Eq. [13](#page-15-7)) may contribute to the neutralization of AMD acid (Blowes et al. [2003;](#page-20-22) Jambor [2003](#page-21-30); BCAMDTF 1989; Lottermoser [2007;](#page-22-23) Ghazban et al. [2015](#page-21-29)).

$$
CaAl_2Si_2O_{8(S)}(anorthite) + 2H^+_{(aq)} + H_2O_{(l)}
$$

\n
$$
\rightarrow Ca_{(aq)}^{+2} + Al_2Si_2O_5(OH)_{4(S)}(kaolinite),
$$
\n(11)

$$
NaAlSi3O8(S)(albite) + H+(aq) + 9/2H2O(l)
$$

\n
$$
\rightarrow Na+(aq) + 2H4SiO4(aq) + Al2Si2O5(OH)4(S)(kaolinite),
$$
\n(12)

$$
KAlSi3O8(S)(orthocalse) + H+(aq) + 9/2H2O(l)
$$

\n
$$
\rightarrow K+(aq) + 2H4SiO4(aq) + 1/2Al2Si2O5(OH)4(S)(kaolinite).
$$
\n(13)

Acid neutralization reactions are carried out by carbonates (calcite $pH = 6.5-7.5$, siderite $pH = 4.8-6.3$), aluminum hydroxides ($pH = 4-4.3$), and iron hydroxides $(pH = 2.5 - 3.5)$. Carbonates, aluminum hydroxides, and iron hydroxides, respectively, have the power to neutralize acids from high to low. Also, the order of neutralizing power of acid from highest to lowest includes carbonates, aluminum hydroxides, and iron hydroxides (Blowes et al. [2003;](#page-20-22) Jambor [2003](#page-21-30); BCAMDTF [1989;](#page-20-23) Lottermoser [2007](#page-22-23); Ghazban et al. [2015](#page-21-29)). In general, acid consumption due to carbonate dissolution is expressed as follows (Eq. [14\)](#page-15-8):

$$
XCO_{3(s)} + H_{(aq)}^{+} \rightarrow X_{(aq)}^{+2} + HCO_{3(aq)}^{-}.
$$
 (14)

X is a divalent cation, such as calcium or magnesium, but not iron or manganese, since these elements produce acid during hydrolysis. This indicates that carbonate minerals have a greater neutralizing capacity than silicate minerals, leading to a higher pH level in the resulting solution.

Combination diagrams

A combination diagram is an efective tool for identifying and controlling groundwater hydrogeochemical trends from diferent sources. The hydrogeochemical evolution of groundwater is controlled by several factors, including recharge water chemistry, aquifer materials, ion exchange, and an aquifer's retention time. Three major factors signifcantly afect groundwater quality, including dissolution of evaporite minerals, dissolution of carbonates, and weathering of silicates (Jalali et al. [2019;](#page-21-31) Adimalla et al. [2020](#page-20-1)).

 $Na⁺$ concentrations in groundwater can be affected by ion exchange efects, which can alter the concentrations of Ca^{2+} and Na⁺ in groundwater (Li et al. [2013\)](#page-22-24). Using chloro-alkaline indices, it is possible to understand how ions are exchanged between groundwater and its host environment during residence or transition (Cai et al. [2011](#page-20-24); Wang et al. 2017). The relationship between (Na⁺–Cl[−]) and $[(Ca^{2+} + Mg^{2+}) - (HCO_3^- + SO_4^{2-})]$ should be linear when cation exchange is the primary process afecting groundwater salinity, with slopes close to -1 (Li et al [2014\)](#page-22-25). These indices (CAI 1 and CAI 2) are both negative when Ca^{2+} and Mg^{2+} in the groundwater exchange with

 $Na⁺$ and $K⁺$ in the aquifer material. Reverse ion exchange will result if both of these indices are positive (Schoeller [1965,](#page-23-26) [1967](#page-23-27); Wang et al. [2017](#page-24-6)). The values are expressed in meq/l (Eqs. [15,](#page-16-0) [16](#page-16-1)).

$$
CAI1 = \frac{CI^- - (Na^+ + K^+)}{CI^-},
$$
\n(15)

$$
CAI2 = \frac{Cl^{+} - (Na^{+} + K^{+})}{HCO_{3}^{-} + SO_{4}^{2-} + CO_{3}^{2-} + NO_{3}^{-}}.
$$
\n(16)

Most of the groundwater samples that were CAI negative showed a baseline exchange reaction (Fig. [14\)](#page-16-2). Therefore, the normal ion exchange process contributes to the high concentrations of alkali (Na^+, K^+) in groundwater, declining the concentrations of Ca^{2+} and Mg^{2+} in the groundwater.

The composite diagram $(Na^+ + K^+)$ versus Total Cations (TC) has been prepared to evaluate the impact of weathering of silicate rocks on groundwater quality and cation ratios (Stallard and Edmond [1983](#page-23-28); Sarin et al. [1989](#page-23-29); Awad and Hussein [2006\)](#page-20-25). Figure [15](#page-17-0)-a shows that most samples are located above $\text{Na}^+ + \text{K}^+$ (0.5TC) line. According to this diagram, in most groundwater samples, cations are derived from cation exchange between Na⁺ and K⁺ with Ca^{2+} and Mg^{2+} . Additionally, the dissolution of evaporite minerals and weathering of silicate minerals lead to an increase in $Na⁺$ and $K⁺$.

Due to this area's abundance of igneous rocks, silicate-weathering may occur due to these reactions (Eqs. [17](#page-16-3)–19):

$$
2NaAlSi3O8(S)(Albite) + 9H2O(I) + 2H2CO3(aq)\n→ Al2Si2O5(OH)4(S)(Kaolinite) + 2Na+(aq) + 2HCO3(aq) + 4H4SiO4(aq)
$$
\n(17)

$$
CaAl2Si2O8(S)(Anortite) + 2CO2(g) + 3H2O(l)\n→ Al2Si2O5(OH)4(S)(Kaolinite) + Ca+2(aq) + 2HCO-3(aq)\n(18)
$$
\n2KMg₂AlSi₂O₁₀(OH)_{10(S)}(Biotite) + 14CO_{2(c)} + 15H₂O₀

$$
\rightarrow \text{Al}_2\text{Si}_2\text{O}_5(\text{OH})_{4(S)}(\text{Kaolinite}) + 2\text{K}^+_{(aq)} + 6\text{Mg}^{+2}_{(aq)}
$$

+ 14HCO_{3(aq)} + 4H₄SiO_{4(aq)} (19)

Figure [15](#page-17-0)b illustrates $Ca^{2+} + Mg^{2+}$ versus SO_4^2 ⁻ + HCO₃⁻ as a composite diagram, and the points located close to the 1:1 line indicate ions resulting from weathering and carbonate dissolution in these samples. If the samples tend to SO_4^2 ⁻ + HCO₃⁻, the weathering of silicates will have a more significant effect on water quality. Carbonate dissolution affects water quality more if samples are high in $Ca^{2+} + Mg^{2+}$ (Datta and Tyagi [1996\)](#page-21-32). The diagram indicates that most groundwater samples begin near line one. Generally, points tend to reach $SO_4^{2+} + HCO_3^-$, which indicates both weathering of silicate minerals and dissolution of carbonate, followed by most weathering of silicate minerals. Most of the samples included in group 2 result from the weathering of silicate minerals and contain signifcant sulfate levels due to industrial wastewater (Torres-Martínez et al. [2020\)](#page-23-30). To determine the source of salinity in ground-water, the Na⁺ versus Cl[−] diagram was used (Fig. [15](#page-17-0)c). If the Na+/Cl− ratio in this diagram is more than one, it indicates that the sodium ion in groundwater samples is due to silicate weathering (Stallard and Edmond [1983;](#page-23-28) Meybeck [1987\)](#page-22-26). Na+/Cl− is therefore associated with weathering of silicates, including sodium-containing feldspars minerals like albeit. Processes such as cations exchange, agriculture, and industrial activities have led to an increased concentration of dissolved ions, particularly Na^+ and K^+ (Naidu et al.

Fig. 15 Relationships between major ions: **a** Na⁺ + K⁺ vs. TC, **b** Ca²⁺ + Mg²⁺ vs. HCO₃[−] + SO₄^{2−}, **c** Na⁺ vs. Cl[−], **d** SO₄^{2−} vs. Cl[−], **e** SO₄^{2−} vs. NO_3^- , **f** $Ca^{2+} + Mg^{2+}$ vs. HCO_3^-

[1985](#page-22-16)). Salinity and $Na⁺$ concentrations in group 2 samples are higher than in group 1.

Based on the diagram, some points are close to the 1:1 line of Na+ and Cl− in some samples, which indicates the dissolution of evaporite minerals such as halite. The ion exchange reactions or human contaminants may produce a high chloride to sodium ratio (Jones et al. [1999\)](#page-21-33). The composition diagram of Cl[−] versus SO_4^{2-} (Fig. [15d](#page-17-0)) illustrates that the origin of sulfate in group 2 difers from that in group 1. This diagram has a weak correlation between NO_3^- and SO_4^2 ⁻. Figure [15e](#page-17-0) illustrates the NO_3^- versus SO_4^2 ⁻ diagram used to determine the origin of sulfate (Escolero [2005\)](#page-21-34) in group 2 samples. Torres-Martínez et al. ([2020](#page-23-30)) indicated that sulfates are increased in groundwater by a source other than lithology. Sources of this

pollution include municipal sewage and industrial areas. Consequently, it can be concluded that wastewater and industrial areas are the sources of sulfates in the samples from group 2.

There is also possible that pyrite oxidation reactions cause this total sulfate increase (Eqs. [5](#page-15-0), [6\)](#page-15-1). In order to determine the source of Ca^{2+} and Mg^{2+} in groundwater, the molar ratio $(Ca^{2+} + Mg^{2+})/HCO_3^-$ is commonly used. If it is only due to Mg^{2+} and Ca^{2+} dissolution from carbonate, the above ratio will be approximately 0.5 (Sami [1992\)](#page-23-31). Low $Ca^{2+} + Mg^{2+}$ ratios (<0.5) result from cation exchange and/ or HCO_3^- enrichment. High ratios are not associated with $HCO₃⁻$ decrease since $HCO₃⁻$ does not form carbonic acid (H_2CO_3) under alkaline conditions (Spears [1986\)](#page-23-32). 93.33% of the data above the 0.5:1 line indicates the carbonate

source of Ca^{2+} and Mg^{2+} (Fig. [15-](#page-17-0)f). The high molar ratios $(Ca^{2+} + Mg^{2+})/HCO_3^-$ indicate that high alkalinities are balanced by alkalis such as $Na⁺$ and $K⁺$. Additionally, during ion exchange processes, Ca^{2+} and Mg^{2+} are absorbed, decreasing Ca^{2+} and Mg^{2+} and increasing Na⁺ and K⁺ in groundwater.

Saturation index

In groundwater, mineral equilibrium calculations can be used to estimate mineral reactivity and predict the presence of reactive minerals. SI is used as one of the essential geochemical parameters to identify common minerals in groundwater systems in hydrogeology and geochemistry (Deutsch [1997\)](#page-21-35). According to SI values, saturation modes can be classified as saturation (equilibrium $-1 < SI < 0$), unsaturated (dissolution; $SI < -1$), and supersaturated (precipitation; $SI > 0$). According to Fig. [16,](#page-18-0) the SI of the two water groups concerning the minerals was calculated

Fig. 16 SI of each group's water samples

by using PHREEQC software. Aragonite, calcite, dolomite, goethite, and hematite minerals are supersaturated in the groundwater samples. Anhydrite, gypsum, and halite are unsaturated.

Geochemical modeling

Through inverse geochemical modeling, it is possible to determine the geochemical reactions that affect groundwater hydrochemistry along the fow path. The groundwater flow path was determined based on hydrogeological factors (groundwater level and fow direction). The data for each group has been used to indicate the initial and fnal composition of the fow path. Based on the calculated model, the average of group 1 data was used as an initial composition, and the average of group 2 data as a fnal composition. Mineral phases were determined by using saturation indices in the model.

For the model, these phases were defned as the dissolution of albite, anorthite, gypsum, kaolinite, pyrite, galena, and $CO₂$, and the precipitation of calcite, aragonite, dolomite, hematite, and goethite. In order to obtain an inverse model for the evolution of groundwater composition, four possible models were identifed. Based on the water quality change occurring in the fow path, these models represent diferent possible combinations of reactants and products within the PHREEQC software. The results are presented in Table [6.](#page-18-1) Positive values indicate dissolution, while negative values indicate precipitation (Parkhurst and Appelo [1999](#page-23-17)).

The inverse geochemical model for hydrogeochemical evolution between groups 1 and 2 can be expressed as follows:

 $Na - Ca - HCO₃water(G1) + anortite + albite + anhydrite$ + gypsum + Pyrite + CO_2 gas \rightarrow Na – Ca – SO₄water(G2) + dolomiote + calcite + hematite + goethite + kaolinite

Table 6 Results of mass transfer inverse geochemical models (mol/kg)

The results of geochemical modeling depend on the conceptual model, the basic concepts and principles' accuracy, the input data's accuracy, and the level of understanding of geochemistry processes (Güler and Thyne [2004](#page-21-16)). According to the mass equilibrium model, defning some phases are required to obtain the observed changes in water chemistry and calculate the hydrochemical evolution of the Zanjan plain. Mineral phases have been identifed based on geological descriptions and analyses of rocks and sediments in the area. Silicate minerals (albite and anorthite), evaporite minerals (anhydrite and gypsum), pyrite, and $CO₂$ (g) dissolve in group 1 water, which results in the precipitation of carbonate minerals (calcite and dolomite), iron oxides (hematite and goethite), and kaolinite in group 2 water.

The predominant geochemical process in the recharge zone (group 1) is the dissolution of carbonate and igneous minerals, including adding Ca^{2+} , Na^{+} , Mg^{2+} , and HCO_3^- ions to groundwater. Ca^{2+} and SO_4^{2-} are added to the groundwater by dissolving evaporite minerals (gypsum, anhydrite). However, oxidation of pyrite increases the sulfate ion concentration in all samples. During the groundwater flow direction of group 1 water toward the central part of the plain, the concentration of main ions increases, leading to the formation of group 2 water. Also, Sewage discharges from Zanjan's industrial towns cause salinity to increase, thus producing group 2. According to Figs. [4](#page-4-0), [5](#page-5-0), and Gheorghe's (1978) classifcation, the vicinity areas of group 2 have moderate to high transmissivity. These areas, including group 2, have a transmissivity ranging from 100 to 1000 m²/day. Thus, pollution from urban and industrial areas can rapidly reach the aquifer. Also, the negative value of Δ*V* indicates excessive water extraction from the aquifer, which leads to poor groundwater quality.

Other researchers also did this; for example, Samani et al. [\(2015\)](#page-23-9) investigated the hydrogeochemical evolution of the Ajabshir Plain aquifer. This study assessed three diferent hydrogeochemical facies, including sodium, calcium, and bicarbonate facies. Using the HCA method, the samples of the study area were divided into three groups. The samples of group 3 were found to have been obtained due to weathering of anorthite, a rise of salt water, and mixing of salt water and fresh water. Geogenic factors that afect groundwater quality are discussed in this study. In the Zanjan aquifer study, samples were divided into two groups. Along with this, geogenic and anthropogenic factors were considered.

In addition, Ledesma-Ruiz et al. ([2015\)](#page-22-27) assessed the hydrogeochemical evolution of the Zona Citrícola in northeastern Mexico. Four samples were identifed in the study area based on the HCA method. Group 1 is located in the recharge zone, groups 2 and 3 are located in the transition zone, and group 4 is located in the discharge zone. Their analysis revealed that there had been three factors contributing to the change in groundwater quality from group 1 to

group 4, including the dissolution of evaporite minerals and dedolomitization, the dissolution of $CO₂(g)$ in the soil, and the release of nitrates from human and animal wastewater and chemical fertilizers. The study investigated geogenic and anthropogenic factors by nitrates from chemical fertilizers and human and animal wastewater. In contrast, the Zanjan aquifer has investigated geogenic and anthropogenic factors, including nitrate pollution, industrial wastewater, and mining activities.

Conclusion

The measured hydrogeochemical signatures indicate that groundwater quality can be afected by some factors, mainly including the geological formations of the aquifer and anthropogenic factors. In order to identify the quality status of the Zanjan aquifer, groundwater samples were divided into two groups using the HCA method. The Piper diagram indicates that $CaHCO₃$ and NaCl were the predominant water types in Group 1 and Group 2, respectively. Based on the results, the concentrations of HCO_3^- , $SO_4^2^-$, Fe, Pb, Zn, and NO_3^- ions exceeded drinking water guideline values. Due to the increase in transmissivity, pollution from urban and industrial sources and mining activities has entered the aquifer. This may explain the high levels of Zn, Pb, and Fe ions observed in group 2. Sulfate concentration was high in all samples due to AMD, urban and industrial pollution entry into the aquifer. Since carbonates and silicate minerals can quickly bufer acid production, no acid rock drainage has been found in the study area. If mining activities are continued, pyrite oxidation will not be neutralized, and in the near future, it can endanger the ecosystem and human health. Based on CAI-1 and CAI-2 values, magnesium and calcium ions are often adsorbed from the aquifer materials, whereas sodium and potassium are released in the groundwater. Groundwater quality declined due to the negative water balance (-25.27 MCM/year) of this aquifer caused by overexploitation of groundwater. The continued exploitation of groundwater in this manner will lead to irreparable problems, including the degradation of groundwater quality. In order to understand the extent of the situation and make decisions regarding the sustainable management of groundwater resources in the study area, the study will provide valuable information to authorities.

Supplementary Information The online version contains supplementary material available at<https://doi.org/10.1007/s12665-023-10790-w>.

Acknowledgements The authors are grateful to the Regional Water Company of Zanjan for supplying the data for this study.

Author contributions Hussainzadeh wrote the main manuscript text and prepared all fgures. Samani has made many excellent suggestions throughout the article to enhance its quality and has also been involved in proofreading it. Mahaqi has provided some suggestions regarding improvements to the article and has also been involved in proofreading it. All authors reviewed the manuscript.

Funding The authors of this study did not receive any funding for the study.

Availability of data and materials The data that support the fndings of this study are available from the corresponding author upon reasonable request.

Declarations

Conflict of interest The authors declare that they have no confict of interest.

References

- Abdesselam S, Halitim A, Jan A, Trolard F, Bourrie G (2013) Anthropogenic contamination of groundwater with nitratein arid region: case study of southern Hodna (Algeria). Environ Earth Sci 70:2129–2141.<https://doi.org/10.1007/s12665-012-1834-5>
- Abdi P (2000) Geological characteristics of Quaternary deposits in Zanjan plain in order to determine suitable locations for artifcial recharging of groundwater aquifers. Master Thesis, University of Tehran, 185
- Adimalla N, Li P (2019) Occurrence, health risks, and geochemical mechanisms of fuoride and nitrate in groundwater of the rockdominant semi-arid region, Telangana State, India. Human Ecol Risk Assess 25(1–2):81–103. [https://doi.org/10.1080/10807039.](https://doi.org/10.1080/10807039.2018.1480353) [2018.1480353](https://doi.org/10.1080/10807039.2018.1480353)
- Adimalla N, Li P, Venkatayogi S (2018) Hydrogeochemical evaluation of groundwater quality for drinking and irrigation purposes and integrated interpretation with water quality index studies. Environ Process 5:363–383. [https://doi.org/10.1007/](https://doi.org/10.1007/s40710-018-0297-4) [s40710-018-0297-4](https://doi.org/10.1007/s40710-018-0297-4)
- Adimalla N, Dhakate R, Kasarla A et al (2020) Appraisal of groundwater quality for drinking and irrigation purposes in Central Telangana, India. Groundw Sustain Dev 10:100334. [https://doi.org/](https://doi.org/10.1016/j.gsd.2020.100334) [10.1016/j.gsd.2020.100334](https://doi.org/10.1016/j.gsd.2020.100334)
- Aghanabati A (2004) Geology of Iran. Geological and Mine exploration Survey of Iran, Tehran (**In Persian**)
- Ahmad A, Bhattacharya P (2019) Arsenic in Drinking Water: Is 10 μg/L a Safe Limit? Curr Pollution Rep 5:1–3. [https://doi.org/10.](https://doi.org/10.1007/s40726-019-0102-7) [1007/s40726-019-0102-7](https://doi.org/10.1007/s40726-019-0102-7)
- Alexakis D (2011) Assessment of water quality in the Messolonghi— Etoliko and Neochorio region (West Greece) using hydrochemical. Environ Monit Assess 182:397–413. [https://doi.org/10.1007/](https://doi.org/10.1007/s10661-011-1884-2) [s10661-011-1884-2](https://doi.org/10.1007/s10661-011-1884-2)
- Amiri V, Bhattacharya P, Nakhaei M (2021) The hydrogeochemical evaluation of groundwater resources and their suitability for agricultural and industrial uses in an arid area of Iran. Groundw Sustain Dev 12:100527. <https://doi.org/10.1016/j.gsd.2020.100527>
- APHA (2012) Standard Methods for the Examination of Water and Wastewater, 22nd edn. American Public Health Association, Washington, DC
- Apodaca LE, Jefrey BB (1997) Michelle CS (2002) Water quality in shallow alluvial aquifers, Upper Colorado River Basin, Colorado. J Am Water Res Assoc 38(1):133–143
- Appelo CAJ, Willemsen A (1987) Geochemical calculations and observations on salt water intrusions, I. A combined geochemical/ minxing cell model. J Hydrol 94(3):313–330. [https://doi.org/10.](https://doi.org/10.1016/0022-1694(87)90058-8) [1016/0022-1694\(87\)90058-8](https://doi.org/10.1016/0022-1694(87)90058-8)
- Awad HS, Hussein MT (2006) Hydrochemical appraisal of groundwater in the Khartoum region, Sudan. J Environ Hydrol 14:1–8
- Awasthi AK, Dubey OP, Awasthi A, Sharma S (2005) A Fuzzy Logic model for estimation of groundwater recharge. In: Annual meeting of the North American fuzzy information processing society, Detroit, MI, June 26–28, 809–813
- Azaza FH, Ketata M, Bouhlila R, Gueddari M, Riberio L (2011) Hydrogeochemical characteristics and assessment of drinking water quality in Zeuss-Koutine aquifer, southeastern Tunisia. Environ Monit Assess 174:283–298. [https://doi.org/10.1007/](https://doi.org/10.1007/s10661-010-1457-9) [s10661-010-1457-9](https://doi.org/10.1007/s10661-010-1457-9)
- Azizi H, Tarverdi MA, Akbarpour A (2010) Extraction of hydrothermal alterations from ASTER SWIR data from east Zanjan, northern Iran. Adv Space Res 46:99–109. [https://doi.org/10.](https://doi.org/10.1016/j.asr.2010.03.014) [1016/j.asr.2010.03.014](https://doi.org/10.1016/j.asr.2010.03.014)
- Back W, Hanshaw BB (1965) Chemical geohydrology. In: Chow VT (ed) Advances in hydrosciences. Academic Press, New York, pp 49–109
- Back W (1966) Hydrochemical facies and groundwater fow patterns in northern part of Atlantic Coastal Plain. U.S. Government Printing Office, United States
- Barzegar R, Asghari Moghaddam A, Nazemi AH (2018) Evidence for the occurrence of hydrogeochemical processes in the groundwater of Khoy plain, northwestern Iran, using ionic ratios and geochemical modeling. Environ Earth Sci 77:597– 613.<https://doi.org/10.1007/s12665-018-7782-y>
- Basheer AA (2018) Chemical chiral pollution: impact on the society and science and need of the regulations in the 21st century. Chirality 30:402–406.<https://doi.org/10.1002/chir.22808>
- Basheer AA, Ali I (2018) Stereoselective uptake and degradation of (\pm) –o, p–DDD pesticide stereomers in water–sediment system. Chirality 30:1088–1095. <https://doi.org/10.1002/chir.22989>
- Besser H, Mokadem N, Redhaounia B et al (2018) Groundwater mixing and geochemical assessment of low-enthalpy resources in the geothermal feld of southwestern Tunisia. Euro-Mediterr J Environ Integr 3:16. [https://doi.org/10.1007/](https://doi.org/10.1007/s41207-018-0055-z) [s41207-018-0055-z](https://doi.org/10.1007/s41207-018-0055-z)
- Blowes DW, Ptacek CJ, Jurjovec J (2003) Mill tailings: hydrogeology and geochemistry. In: Jambor JL, Blowes DW, Ritchie AIM (ed) Environmental aspects of mine wastes. Mineralogical Association of Canada, Short course series 31, 95–116
- British Columbia Acid Mine Drainage Task Force (1989) Acid Rock Drainage Draft Technical Guide, vol I and II. Report 66002/3. Prepared for the British Columbia AMD Task Force by SRK, Inc. pp 150
- Buschmann J, Berg M, Stengel C, Winkel L, Sampson ML, Trang PTK, Viet PH (2008) Contamination of drinking water resources in the Mekong Delta foodplains: arsenic and other trace metals pose serious health risks to population. Environ Int 34:756–764.<https://doi.org/10.1016/j.envint.2007.12.025>
- Cai J, Cao Y, Tan H, Wang Y, Luo J (2011) Fractionation and ecological risk of metals in urban river sediments in Zhongshan City, Pearl River Delta. J Environ Monit 13:2450–2456. [https://doi.](https://doi.org/10.1039/C1EM10062A) [org/10.1039/C1EM10062A](https://doi.org/10.1039/C1EM10062A)
- Chung SY, Rajendran R, Senapathi V (2020) Processes and characteristics of hydrogeochemical variations between unconfned and confned aquifer systems: a case study of the Nakdong River Basin in Busan City, Korea. Environ Sci Pollut Res 27:10087–10102. <https://doi.org/10.1007/s11356-019-07451-6>
- Cloutier V, Lefebvre R, Therrien R et al (2008) Multivariate statistical analysis of geochemical data as indicative of the hydrogeochemical evolution of groundwater in a sedimentary rock

aquifer system. J Hydrol 353(3):294–313. [https://doi.org/10.](https://doi.org/10.1016/j.jhydrol.2008.02.015) [1016/j.jhydrol.2008.02.015](https://doi.org/10.1016/j.jhydrol.2008.02.015)

- Cohen J (1988) Statistical power analysis for the behavioral sciences, 2nd edn. Erlbaum, Hillsdale
- Darvishzadeh A (1991) Geology of Iran, 5th edn. Amirkabir publication, Tehran
- Darvishzadeh A (2003) Geology of Iran, Amirkabir Publication, Tehran (**In Persian**)
- Datta PS, Tyagi SK (1996) Major ion chemistry of groundwater in Delhi area: chemical weathering processes and groundwater fow regime. J Geol Soc India 47:179–188
- Deutsch WJ (1997) Groundwater geochemistry: fundamentals and applications to contamination. CRC Press, Florida
- Domenico PA, Schwartz FW (1990) Physical and chemical hydrogeology. Wiley, New York
- Dubey M, Deshpande S, Gaikwad S et al (2021) Lithological controls on the groundwater fuoride enrichment in central India. Arab J Geosci 14:2173.<https://doi.org/10.1007/s12517-021-08581-3>
- Eftekhar Nezhad J, Hajian J, Stöcklin J, Nabavi MH, Samimi M, Hirayama KM, Alavi M, Zahedi Amini B (1996) Geological quadrangle map of Zanjan, Scale 1:100 000. Geological Survey of Iran
- Ehya F, Marbouti Z (2016) Hydrochemistry and contamination of groundwater resources in the Behbahan plain, SW Iran. Environ Earth Sci 75:455. <https://doi.org/10.1007/s12665-016-5320-3>
- Embile RF, Walder IF, Mahoney JJ (2018) Forsterite and pyrrhotite dissolution rates in a tailings deposit obtained from column leaching experiments and inverse modeling: a novel method for a mine tailings sample. Appl Geochem 98:65–74. [https://doi.org/10.](https://doi.org/10.1016/j.apgeochem.2018.09.002) [1016/j.apgeochem.2018.09.002](https://doi.org/10.1016/j.apgeochem.2018.09.002)
- Escolero O, Marín LE, Steinch B et al (2005) Geochemistry of the hydrogeological reserve of Mérida, Yucatan, Mexico. Geof Intern 44(3):301–314
- Eslami A, Ghadimi M (2013) Study of fve years nitrite and nitrate content trends of Zanjan groundwater resources using GIS from 2006 to 2010. J Health Field 1:30–36 (**in Persian**)
- Fianko J, Osae S, Adomako D, Achel D (2009) Relationship between land use and groundwater quality in six districts in the eastern region of Ghana. Environ Monit Assess 153(1–4):139–146. <https://doi.org/10.1007/s10661-008-0344-0>
- Ganiyu SA, Olurin OT, Azeez MA et al (2022) Evaluation of major anions, halide ions, nitrogen, and phosphorus contents in groundwater from shallow hand-dug wells near Ona River, Ibadan, Nigeria. Int J Environ Sci Technol 19:4997–5014. [https://doi.](https://doi.org/10.1007/s13762-021-03475-z) [org/10.1007/s13762-021-03475-z](https://doi.org/10.1007/s13762-021-03475-z)
- Gao Y, Qian H, Wang H, Chen J, Ren W, Yang F (2019) Assessment of background levels and pollution sources for arsenic and fuoride in the phreatic and confned groundwater of Xi'an city, Shaanxi, China. Environ Sci Pollut Res Int. [https://doi.org/10.](https://doi.org/10.1007/s11356-019-06791-7) [1007/s11356-019-06791-7](https://doi.org/10.1007/s11356-019-06791-7)
- Ghazban F, Parizanganeh A, Zamani A, Taghilou B (2015) Assessment of heavy metal pollution in water and sediments from the Ghalechay River, Baychebaghcopper mine area, Iran. Soil Sediment Contam 24:172–190. [https://doi.org/10.1080/15320383.](https://doi.org/10.1080/15320383.2014.937391) [2014.937391](https://doi.org/10.1080/15320383.2014.937391)
- Gholami V, Khaleghi MR, Pirasteh S et al (2022) Comparison of Self-Organizing Map, Artificial Neural Network, and Co-Active Neuro-Fuzzy Inference System Methods in Simulating Groundwater Quality: Geospatial Artifcial Intelligence. Water Resour Manage 36:451–469. [https://doi.org/10.1007/](https://doi.org/10.1007/s11269-021-02969-2) [s11269-021-02969-2](https://doi.org/10.1007/s11269-021-02969-2)
- Gibbs RJ (1970) Mechanisms controlling world water chemistry. Science 170(3962):1088–1090
- Government of I.R. Iran (2020) Annual water resources and consumption of the Zanjan Aquifer. Report to Ministry of Energy, Tehran
- Güler C, Thyne GD, McCray JE et al (2002) Evaluation of graphical and multivariate statistical methods for classifcation of water

chemistry data. Hydrogeol J 10:455–474. [https://doi.org/10.](https://doi.org/10.1007/s10040-002-0196-6) [1007/s10040-002-0196-6](https://doi.org/10.1007/s10040-002-0196-6)

- Guma BE, Muwanga A, Owor M (2021) Hydrogeochemical evolution and contamination of groundwater in the Albertine Graben, Uganda. Environ Earth Sci 80:303. [https://doi.org/10.1007/](https://doi.org/10.1007/s12665-021-09587-6) [s12665-021-09587-6](https://doi.org/10.1007/s12665-021-09587-6)
- Hembrom S, Singh B, Gupta SK, Nema AK (2020) Contemporary environmental issues and challenges in era of climate change. Springer, New York, pp 33–64
- Holland SM (2006) Cluster analysis. Department of Geology, University of Georgia, Athens
- Howladar MF, Mustafzur Rahman M (2016) Characterization of underground tunnel water hydrochemical system and uses through multivariate statistical methods: a case study from Maddhapara Granite Mine, Dinajpur, Bangladesh. Environ Earth Sci 75:1501.<https://doi.org/10.1007/s12665-016-6309-7>
- Islam ME, Reza AHS, Sattar GS et al (2019) Distribution of arsenic in core sediments and groundwater in the Chapai Nawabganj district, Bangladesh. Arab J Geosci 12:99. [https://doi.org/10.1007/](https://doi.org/10.1007/s12517-019-4272-9) [s12517-019-4272-9](https://doi.org/10.1007/s12517-019-4272-9)
- Jalali M (2007) Hydrochemical identifcation of groundwater resources and their changes under the impacts of human activity in the Chah basin in western Iran. Environ Monit Assess 130(1–3):347– 364. <https://doi.org/10.1007/s10661-006-9402-7>
- Jalali M, Karami S, Fatehi Marj A (2019) On the problem of the spatial distribution delineation of the groundwater quality indicators via multivariate statistical and geostatistical approaches. Environ Monit Assess 191:323. [https://doi.org/10.1007/](https://doi.org/10.1007/s10661-019-7432-1) [s10661-019-7432-1](https://doi.org/10.1007/s10661-019-7432-1)
- Jamal A, Delavar MA, Naderi A, Nourieh N, Medi B, Mahvi AH (2019) Distribution and health risk assessment of heavy metals in soil surrounding a lead and zinc smelting plant in Zanjan, Iran. Human Ecol Risk Assess Int J 25(4):1018–1033. [https://doi.org/](https://doi.org/10.1080/10807039.2018.1460191) [10.1080/10807039.2018.1460191](https://doi.org/10.1080/10807039.2018.1460191)
- Jambor JL (2003) Mine-waste mineralogy and mineralogical perspectives of acid–base accounting. In: Jambor JL, Blowes DW, Ritchie AIM (eds), Environmental aspects of mine wastes, vol 31. Mineralogical Association of Canada, Short Course, pp 117–146
- Jankowski J, Acworth RI (1997) Impact of debris-fow deposits on hydrogeochemical processes and the development of dryland salinity in the Yass River Catchment, New South Wales, Australia. Hydrog J 5(4):71–88. [https://doi.org/10.1007/s100400050](https://doi.org/10.1007/s100400050119) [119](https://doi.org/10.1007/s100400050119)
- Johnson DB, Hallberg KB (2005) Acid mine drainage remediation options: a review. Sci Total Environ 338:3–14. [https://doi.org/](https://doi.org/10.1016/j.scitotenv.2004.09.002) [10.1016/j.scitotenv.2004.09.002](https://doi.org/10.1016/j.scitotenv.2004.09.002)
- Jollife I (2005) Principal component analysis. Wiley, New York
- Jones BF, Vengosh A, Rosenthal E et al (1999) Geochemical investigations. In: Sps S (ed) Seawater intrusion in coastal aquifers—concepts, methods and practices. Springer, Netherlands, pp 51–71. https://doi.org/10.1007/978-94-017-2969-7_3
- Joodavi A, Aghlmand R, Podgorski J (2021) Characterization, geostatistical modeling and health risk assessment of potentially toxic elements in groundwater resources of northeastern Iran. J Hydrol Region Stud. 37(2):100885. [https://doi.org/10.1016/j.](https://doi.org/10.1016/j.ejrh.2021.100885) eirh.2021.100885
- Kadam A, Wagh V, Umrikar B, Sankhua R (2019) An implication of boron and fuoride contamination and its exposure risk in groundwater resources in semi-arid region. Environ Dev Sustain Western India.<https://doi.org/10.1007/s10668-019-00527-w>
- Kaiser HF (1960) The application of electronic computers to factor analysis. Educ Psychol Measur 20:141–151
- Kanoua W, Merkel B (2017) Hydrochemical evolution and arsenic release in shallow aquifer in the Titas Upazila, Eastern

Bangladesh. Arab J Geosci 10:290. [https://doi.org/10.1007/](https://doi.org/10.1007/s12517-017-3063-4) [s12517-017-3063-4](https://doi.org/10.1007/s12517-017-3063-4)

- KarimzadehSomarin A (2006) Geology and geochemistry of the Mendejin plutonic rocks, Mianeh, Iran. J Asian Earth Sci 27:819–834. <https://doi.org/10.1016/j.jseaes.2005.08.004>
- Khosravi Y, Zamani AA, Parizanganeh AH, Yaftian MR (2018) Assessment of spatial distribution pattern of heavy metals surrounding a lead and zinc production plant in Zanjan Province, Iran. Geoderma Reg 12:10–17. [https://doi.org/10.1016/j.geodrs.](https://doi.org/10.1016/j.geodrs.2017.12.002) [2017.12.002](https://doi.org/10.1016/j.geodrs.2017.12.002)
- Kumar M, Ramanathan A, Rao MS et al (2006) Identifcation and evaluation of hydrogeochemical processes in the groundwater environment of Delhi, India. Environ Geol 50:1025–1039. <https://doi.org/10.1007/s00254-006-0275-4>
- Kurwadkar S, Kanel SR, Nakarmi A (2020) Groundwater pollution: occurrence, detection, and remediation of organic and inorganic pollutants. Water Environ Res 92:1659–1668. [https://doi.org/10.](https://doi.org/10.1002/wer.1415) [1002/wer.1415](https://doi.org/10.1002/wer.1415)
- Lecomte K, Maza S, Collo G et al (2017) Geochemical behavior of an acid drainage system: the case of the Amarillo River, Famatina (La Rioja, Argentina). Environ Sci Pollut Res 24:1630–1647. <https://doi.org/10.1007/s11356-016-7940-2>
- Ledesma-Ruiz R, Pastén-Zapata E, Parra R, Harter T, Mahlknecht J (2015) Investigation of the geochemical evolution of groundwater under agricultural land: a case study in northeastern Mexico. J Hydrol 521:410–423. [https://doi.org/10.1016/j.jhydrol.2014.](https://doi.org/10.1016/j.jhydrol.2014.12.026) [12.026](https://doi.org/10.1016/j.jhydrol.2014.12.026)
- Li P, Qian H, Wu J et al (2013) Occurrence and hydrogeochemistry of fuoride in alluvial aquifer of Weihe River, China. Environ Earth Sci 71:3133–3145.<https://doi.org/10.1007/s12665-013-2691-6>
- Li P, Wu J, Qian H (2014) Hydrogeochemistry and quality assessment of shallow groundwater in the southern part of the Yellow River alluvial plain (Zhongwei Section), China. Earth Sci Res J 18(1):27–38.<https://doi.org/10.15446/esrj.v18n1.34048>
- Li C, Zhou K, Qin W, Tian C, Qi M, Yan X, Han W (2019) A review on heavy metals contamination in soil: Effects, sources, and remediation techniques. Soil Sediment Contamin Int J 28:380–394. <https://doi.org/10.1080/15320383.2019.1592108>
- Liu P, Hoth N, Drebenstedt C et al (2017) Hydrogeochemical paths of multilayer groundwater system in coal mining regions using multivariate statistics and geochemical modeling approaches. Sci Total Environ 601–602:1–14. [https://doi.org/10.1016/j.scitotenv.](https://doi.org/10.1016/j.scitotenv.2017.05.146) [2017.05.146](https://doi.org/10.1016/j.scitotenv.2017.05.146)
- Liu F, Zhao Z, Yang L et al (2020) Geochemical characterization of shallow groundwater using multivariate statistical analysis and geochemical modeling in an irrigated region along the upper Yellow River, Northwestern China. J Geochem Explor 215:106–122. <https://doi.org/10.1016/j.gexplo.2020.106565>
- Lottermoser B (2007) Mine wastes characterization, treatment, environmental impacts. Springer Publisher, New York
- Lu Y, Tang C, Chen J, Yao H (2016) Assessment of major ions and heavy metals in groundwater: a case study from Guangzhou and Zhuhai of the Pearl River Delta, China. Front Earth Sci 10:340– 351. <https://doi.org/10.1007/s11707-015-0513-8>
- Mahaqi A, Mehiqi M, Rahimzadeh M et al (2021) Dominant geochemical reactions and hazardous metal contamination status in the Kabul's aquifers, Afghanistan. Int J Environ Sci Technol 18:4043–4052.<https://doi.org/10.1007/s13762-020-03098-w>
- Mahesha A (1996) Transient efect of battery of injection wells on seawater intrusion. J Hydraul Eng 122(5):266-271. [https://doi.](https://doi.org/10.1061/(ASCE)0733-9429(1996)122:5(266)) [org/10.1061/\(ASCE\)0733-9429\(1996\)122:5\(266\)](https://doi.org/10.1061/(ASCE)0733-9429(1996)122:5(266))
- Masoumi Z, Rezaei A, Maleki J (2019) Improvement of water table interpolation and groundwater storage volume using fuzzy computations. Environ Monit Assess 191:401. [https://doi.org/10.](https://doi.org/10.1007/s10661-019-7513-1) [1007/s10661-019-7513-1](https://doi.org/10.1007/s10661-019-7513-1)
- Mattern S, Fasbender D, Vanclooster M (2009) Discriminating sources of nitrate pollution in an unconfned sandy aquifer. J Hydrol 376(1–2):275–284.<https://doi.org/10.1016/j.jhydrol.2009.07.039>
- Meride Y, Ayenew B (2016) Drinking water quality assessment and its efects on residents health in Wondo genet campus, Ethiopia. Environ Syst Res 5:1.<https://doi.org/10.1186/s40068-016-0053-6>
- Meybeck M (1987) Global chemical weathering of surficial rocks estimated from river dissolved loads. Am J Sci 287(5):401–428. <https://doi.org/10.2475/ajs.287.5.401>
- Mohammadi Arasteh S, Shoaei SM (2020) An assessment of the effects of excessive groundwater abstraction on the quality of groundwater resources of the Zanjan Plain, Iran. Environ Earth Sci 79:523. <https://doi.org/10.1007/s12665-020-09268-w>
- Molinari A, Guadagnini L, Marcaccio M, Straface S, Sanchez-Vila X, Guadagnini A (2013) Arsenic release from deep natural solid matrices under experimental controlled redox conditions. Sci Total Environ 444:231–240. [https://doi.org/10.1016/j.scitotenv.](https://doi.org/10.1016/j.scitotenv.2012.11.093) [2012.11.093](https://doi.org/10.1016/j.scitotenv.2012.11.093)
- Möller P, Dulski P, Salameh E et al (2006) Characterization of the sources of thermal spring- and well water in Jordan by rare earth element and yttrium distribution and stable isotopes. Acta Hydrochim Hydrobiol 34:101–116
- Morin G, Calas G (2006) Arsenic in soils, mine tailings, and former industrial sites. Elements 2:97–101. [https://doi.org/10.2113/](https://doi.org/10.2113/gselements.2.2.97) [gselements.2.2.97](https://doi.org/10.2113/gselements.2.2.97)
- Murray J, Kirk Nordstrom D, Dold B, Kirschbaum A (2021) Seasonal fuctuations and geochemical modeling of acid mine drainage in the semi-arid Puna region: the Pan de Azúcar Pb– Ag–Zn mine, Argentina. Earth Sci 109:103–117. [https://doi.](https://doi.org/10.1016/j.jsames.2021.103197) [org/10.1016/j.jsames.2021.103197](https://doi.org/10.1016/j.jsames.2021.103197)
- Nabatian G, Ghaderi M, Corfu F et al (2014) Geology, alteration, age, and origin of iron oxide–apatite deposits in Upper Eocene quartz monzonite, Zanjan district, NW Iran. Miner Deposita 49:217–234.<https://doi.org/10.1007/s00126-013-0484-1>
- Nabatian G, Rastad E, Neubauer F et al (2015) Iron and Fe–Mn mineralisation in Iran: implications for Tethyan metallogeny. Aust J Earth Sci 62:211–241. [https://doi.org/10.1080/08120](https://doi.org/10.1080/08120099.2015.1002001) [099.2015.1002001](https://doi.org/10.1080/08120099.2015.1002001)
- Naidu AS, Mowati TC, Somayajulu BL, Rao KS (1985) Characteristics of clay minerals in the bed loads of major river of India. Mitteilungen aus dem Geologische-Palaontologischen Instituts der Universitat Hamburg 58:559–568
- Nematollahi MJ, Ebrahimi P, Razmara M et al (2016) Hydrogeochemical investigations and groundwater quality assessment of Torbat-Zaveh plain, Khorasan Razavi, Iran. Environ Monit Assess 188:2. <https://doi.org/10.1007/s10661-015-4968-6>
- Newman CP, Poulson SR, McCrea KW (2020) Contaminant generation and transport from mine pit lake to perennial stream system: multidisciplinary investigations at the Big Ledge Mine, Nevada, USA. Geochemistry 12:52–65. [https://doi.org/10.](https://doi.org/10.1016/j.chemer.2019.125552) [1016/j.chemer.2019.125552](https://doi.org/10.1016/j.chemer.2019.125552)
- Nordstrom DK, Alpers CN (1999) Geochemistry of acid mine waters. In The Environmental Geochemistry of Mineral Deposits, Part A. Processes, Techniques, and Health Issues: Society of Economic Geologists (eds. G.S. Plumlee and M.J. Logsdon). Rev Econ Geol 6A:133–156
- Nouri J, Mahvi AH, Jahed GR, Babaei A (2008) Regional distribution pattern of groundwater heavy metals resulting from agricultural activities. Environ Geol 55:1337–1343. [https://doi.org/](https://doi.org/10.1007/s00254-007-1081-3) [10.1007/s00254-007-1081-3](https://doi.org/10.1007/s00254-007-1081-3)
- Parizanganeha A, Hajisoltanib P, Zamani A (2010) Concentration, distribution and comparison of total and bioavailable metals in top soils and plants accumulation in Zanjan zinc industrial town-Iran. Procedia Environ Sci 2:167–174. [https://doi.org/10.](https://doi.org/10.1016/j.proenv.2010.10.020) [1016/j.proenv.2010.10.020](https://doi.org/10.1016/j.proenv.2010.10.020)
- Parizi HS, Samani N (2013) Geochemical evolution and quality assessment of water resources in the Sarcheshmeh copper mine area (Iran) using multivariate statistical techniques. Environ Earth Sci 69:1699–1718. [https://doi.org/10.1007/](https://doi.org/10.1007/s12665-012-2005-4) [s12665-012-2005-4](https://doi.org/10.1007/s12665-012-2005-4)
- Parkhurst DL, Appelo C (1999) User's guide to PHREEQC (version 2): a computer program for speciation, batch-reaction, one-dimensional transport, and inverse geochemical calculations. Denver, Colorado: U.S. Geological Survey
- Parkhurst DL, Thorstenson DC Plummer LN (1980) PHREEQE—a computer program for geochemical calculations. U.S. Geol. Survey Water Res. Invest, pp 80–96
- Piper AM (1944) A graphic procedure in the geochemical interpretation of water-analyses. Trans Am Geophys Union 25(6):914–928
- Plummer LN (1992) Geochemical modeling of water-rock interaction: past, present, future. In: Kharaka YK, Maest AS (eds) Water– rock interaction. In: Proc 7th Int. Conf. Balkema, Rotterdam, pp 23–33
- Rahman MM, Naidu R, Bhattacharya P (2009) Arsenic contamination in groundwater in the Southeast Asia region. Environ Geochem Health 31:9–21.<https://doi.org/10.1007/s10653-008-9233-2>
- Raju NJ (2022) Arsenic in the geo-environment: a review of sources, geochemical processes, toxicity and removal technologies. Environ Res 203:111782. [https://doi.org/10.1016/j.envres.](https://doi.org/10.1016/j.envres.2021.111782) [2021.111782](https://doi.org/10.1016/j.envres.2021.111782)
- Rasool A, Xiao T, Farooqi A, Shafeeque M, Masood S, Ali S, Fahad S, Nasim W (2016) Arsenic and heavy metal contaminations in the tube well water of Punjab, Pakistan and risk assessment: a case study. Ecol Eng 95:90–100. [https://doi.org/10.1016/j.](https://doi.org/10.1016/j.ecoleng.2016.06.034) [ecoleng.2016.06.034](https://doi.org/10.1016/j.ecoleng.2016.06.034)
- Rawat KS, Singh SK, Gautam SK (2018) Assessment of groundwater quality for irrigation use: a peninsular case study. Appl Water Sci 8:233. <https://doi.org/10.1007/s13201-018-0866-8>
- Rezaei A, Hassani H (2018) Hydrogeochemistry study and groundwater quality assessment in the north of Isfahan, Iran. Environ Geochem Health 40:583–608. [https://doi.org/10.1007/](https://doi.org/10.1007/s10653-017-0003-x) [s10653-017-0003-x](https://doi.org/10.1007/s10653-017-0003-x)
- Rezaei A, Sayadi MH, Zadeh RJ, Mousazadeh H (2021) Assessing the hydrogeochemical processes through classical integration of groundwater parameters in the Birjand plain in eastern Iran. Groundw Sustain Dev 15:100684. [https://doi.org/10.1016/j.](https://doi.org/10.1016/j.gsd.2021.100684) [gsd.2021.100684](https://doi.org/10.1016/j.gsd.2021.100684)
- Rybnikova LS, Rybnikov PA (2017) Hydrogeochemistry of the abandoned sulfde mines of the Middle Urals (Russia). Proc Earth Planet Sci 17:849–852
- Saatsaz M, Monsef I, Rahmani M et al (2018) Site suitability evaluation of an old operating landfll using AHP and GIS techniques and integrated hydrogeological and geophysical surveys. Environ Monit Assess 190:144. [https://doi.org/10.1007/](https://doi.org/10.1007/s10661-018-6505-x) [s10661-018-6505-x](https://doi.org/10.1007/s10661-018-6505-x)
- Saberinasr A, Morsali M, Hashemnejad A, Hassanpour J (2019) Determining the origin of groundwater elements using hydrochemical data (case study: Kerman water conveyance tunnel). Environ Earth Sci 78:198. [https://doi.org/10.1007/](https://doi.org/10.1007/s12665-019-8182-7) [s12665-019-8182-7](https://doi.org/10.1007/s12665-019-8182-7)
- Sakizadeh M, Mirzaei R (2016) Health risk assessment of Fe, Mn, Cu, Cr in drinking water in some wells and springs of Shush and Andimeshk, Khuzestan Province, Southern Iran. Iranian Journal of Toxicology 10:29–35
- Samani S, Asghari Moghaddam A (2015) Hydrogeochemical characteristics and origin of salinity in Ajabshir aquifer, East Azerbaijan, Iran. Q J Eng Geol Hydrogeol 48:175–189. [https://doi.org/](https://doi.org/10.1144/qjegh2014-070) [10.1144/qjegh2014-070](https://doi.org/10.1144/qjegh2014-070)
- Sami K (1992) Recharge mechanisms and geochemical processes in a semi-arid sedimentary basin, Eastern Cape, South Africa. J

Hydrol 139(1):27–48. [https://doi.org/10.1016/0022-1694\(92\)](https://doi.org/10.1016/0022-1694(92)90193-Y) [90193-Y](https://doi.org/10.1016/0022-1694(92)90193-Y)

- Sarin MM, Krishnaswami S, Dilli K et al (1989) Major ion chemistry of the Ganga Brahmaputra river system: weathering processes and fuxes to the Bay of Bengal. Geochim Cosmochim Acta 53(5):997–1009. [https://doi.org/10.1016/0016-7037\(89\)90205-6](https://doi.org/10.1016/0016-7037(89)90205-6)
- Schoeller H (1965) Qualitative evaluation of groundwater resources. In Methods and techniques of groundwater investigations and development (pp. 54–83). UNESCO
- Schoeller H (1967) Geochemistry of groundwater—an international guide for research and practice (Chap. 15, 1–18). UNESCO
- Singh AK, Mondal G, Kumar S et al (2008) Major ion chemistry, weathering processes and water quality assessment in upper catchment of Damodar River basin, India. Environ Geol 54(4):745–758.<https://doi.org/10.1007/s00254-007-0860-1>
- Singh CK, Shashtri S, Mukherjee S et al (2011) Application of GWQI to assess efect of land use change on groundwater quality in lower Shiwaliks of Punjab: remote sensing and GIS based approach. Water Resour Manag 25:1881–1898. [https://doi.org/](https://doi.org/10.1007/s11269-011-9779-0) [10.1007/s11269-011-9779-0](https://doi.org/10.1007/s11269-011-9779-0)
- Smith LI (2002) A tutorial on principal components analysis. Cornell University, Ithana
- Spears DA (1986) Mineralogical control of the chemical evolution of groundwater. In: Trudgill ST (ed) Solute processes. Wiley, Chichester, p 512
- Srour E, Hussien RA, Moustafa WM (2022) Geochemical modeling and isotopic approach for delineating water resources evolution in El Fayoum depression, Egypt. Environ Earth Sci 81:105–122. <https://doi.org/10.1007/s12665-022-10192-4>
- Stallard RF, Edmond JM (1983) The influence of geology and weathering environment on the dissolved load. J Geophys Res 88(14):9671–9688
- Stöcklin J (1968) Structural history and tectonics of Iran: a review. Am Assoc Pet Geol Bull 52:1229–1258
- Stumm W, Morgan JJ (1981) Aquatic chemistry, 1st edn. Wiley, New York
- Suvarna B, Sunitha V, Sudharshan Reddy Y et al (2022) Groundwater quality assessment using multivariate statistical approach and geospatial modelling around cement industrial corridor, South India. Int J Environ Sci Technol. [https://doi.org/10.1007/](https://doi.org/10.1007/s13762-022-04210-y) [s13762-022-04210-y](https://doi.org/10.1007/s13762-022-04210-y)
- Todd DK (1980) Groundwater hydrology, 2nd edn. Wiley, New York, p 535
- Todd DK, Mays LW (2005) Groundwater hydrology. Wiley, New York
- Torres-Martínez JA, Mora A, Knappett PSK, Ornelas-Soto N, Mahlknecht J (2020) Tracking nitrate and sulfate sources in groundwater of an urbanized valley using a multi-tracer approach combined with a Bayesian isotope mixing model. Water Res. 182:115962. <https://doi.org/10.1016/j.watres.2020.115962>
- Vanhatalo A, Blackwell JR, L'Heureux JE, Williams DW, Smith A, van der Giezen M, Winyard PG, Kelly J, Jones AM (2018) Nitrate responsive oral microbiome modulates nitric oxide homeostasis and blood pressure in humans. Free Radic Biol Med 124:21–30. <https://doi.org/10.1016/j.freeradbiomed.2018.05.078>
- Varade AM, Yenkie RO, Shende RR, Golekar RB, Wagh VM, Khandare HW (2018) Assessment of water quality for the groundwater resources of urbanized part of the Nagpur District Maharashtra (India). Am J Water Resour. 6:89–111. [https://doi.](https://doi.org/10.12691/ajwr-6-3-1) [org/10.12691/ajwr-6-3-1](https://doi.org/10.12691/ajwr-6-3-1)
- Wagh VM, Panaskar DB, Muley AA et al (2016) Prediction of groundwater suitability for irrigation using artifcial neural network model: a case study of Nanded tehsil, Maharashtra, India. Model Earth Syst Environ 2:1–10. [https://doi.org/10.1007/](https://doi.org/10.1007/s40808-016-0250-3) [s40808-016-0250-3](https://doi.org/10.1007/s40808-016-0250-3)
- Walton Day K, Mills TJ (2015) Hydrogeochemical effects of a bulkhead in the Dinero mine tunnel, Sugar Loaf mining district, near

Leadville, Colorado. Appl Geochem 62:61–74. [https://doi.org/](https://doi.org/10.1016/j.apgeochem.2015.03.002) [10.1016/j.apgeochem.2015.03.002](https://doi.org/10.1016/j.apgeochem.2015.03.002)

Wang L, Dong Y, Xu Z et al (2017) Hydrochemical and isotopic characteristics of groundwater in the northeastern Tennger Desert, northern China. Hydrogeol J 25(8):2363–2375. [https://doi.org/](https://doi.org/10.1007/s10040-017-1620-2) [10.1007/s10040-017-1620-2](https://doi.org/10.1007/s10040-017-1620-2)

Wongsasuluk P, Chotpantarat S, Siriwong W, Robson M (2014) Heavy metal contamination and human health risk assessment in drinking water from shallow groundwater wells in an agricultural area in Ubon Ratchathani province, Thailand. Environ Geochem Health 36:169–182.<https://doi.org/10.1007/s10653-013-9537-8>

- World Health Organization (2017) Guidelines for drinking-water quality, 4th edn. World Health Organization, Geneva
- Wu Y, Pang H, Liu Y, Wang X, Yu S, Fu D, Wang X (2019) Environmental remediation of heavy metal ions by novel-nanomaterials: a review. Environ Pollut 246:608–620. [https://doi.org/10.1016/j.](https://doi.org/10.1016/j.envpol.2018.12.076) [envpol.2018.12.076](https://doi.org/10.1016/j.envpol.2018.12.076)
- Xiao Y, Liu K, Hao Q, Xiao D, Zhu Y, Yin S, Zhang Y (2022a) Hydrogeochemical insights into the signatures, genesis and sustainable perspective of nitrate enriched groundwater in the piedmont of Hutuo watershed, China. CATENA 212:106020. [https://doi.org/](https://doi.org/10.1016/j.catena.2022.106020) [10.1016/j.catena.2022.106020](https://doi.org/10.1016/j.catena.2022.106020)
- Xiao Y, Hao QC, Zhang YH, Zhu YC, Yin SY, Qin LM, Li XH (2022b) Investigating sources, driving forces and potential health risks of nitrate and fuoride in groundwater of a typical alluvial fan plain. Sci Total Environ 802:149909. [https://doi.org/10.1016/j.](https://doi.org/10.1016/j.scitotenv.2021.149909) [scitotenv.2021.149909](https://doi.org/10.1016/j.scitotenv.2021.149909)
- Xiaolong Z, Shiyu Z, Hui L, Yingliang Z (2020) Disposal of mine tailings via geopolymerization. J Clean Prod xxxx:124756. [https://](https://doi.org/10.1016/j.jclepro.2020.124756) doi.org/10.1016/j.jclepro.2020.124756
- Xu P, Zhang Q, Qian H et al (2021) Exploring the geochemical mechanism for the saturated permeability change of remolded loess. Eng Geol 284:105–118. <https://doi.org/10.1016/j.enggeo.2020.105927>
- Ying SC, Kocar BD, Griffis SD, Fendorf S (2011) Competitive microbially and Mn oxide mediated redox processes controlling arsenic speciation and partitioning. Environ Sci Technol 45:5572–5579. <https://doi.org/10.1021/es200351m>
- Yu ZQ, Amano H, Nakagawa K et al (2018) Hydrogeochemical evolution of groundwater in a Quaternary sediment and Cretaceous sandstone unconfned aquifer in Northwestern China. Environ Earth Sci 77:629. <https://doi.org/10.1007/s12665-018-7816-5>
- Zamani AA, Yaftian MR, Parizanganeh A (2012) Multivariate statistical assessment of heavy metal pollution sources of groundwater around a lead and zinc plant. J Environ Health Sci Engineer 9:29. <https://doi.org/10.1186/1735-2746-9-29>
- Zendehbad M, Cepuder P, Loiskandl W, Stumpp C (2019) Source identifcation of nitrate contamination in the urban aquifer of Mashhad, Iran. J Hydrol Reg Stud 25:100618. [https://doi.org/](https://doi.org/10.1016/j.ejrh.2019.100618) [10.1016/j.ejrh.2019.100618](https://doi.org/10.1016/j.ejrh.2019.100618)

Publisher's Note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

Springer Nature or its licensor (e.g. a society or other partner) holds exclusive rights to this article under a publishing agreement with the author(s) or other rightsholder(s); author self-archiving of the accepted manuscript version of this article is solely governed by the terms of such publishing agreement and applicable law.