



Identification of high nitrate concentration in shallow groundwater of an arid region: a case study of South Kuwait's Bay

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Abstract Coastal aquifer is a fragile environment due to the interaction of groundwater with seawater, especially in arid environments. Groundwater along Kuwait's Bay is polluted due to discharge of waste from desalination plants, power plants, and other anthropogenic activities. Earlier studies on submarine groundwater discharge in Kuwait's Bay region have reported the transfer of nutrient flux from the groundwater to Kuwait's Bay. The current study focused on nitrate sources and processes governing their distribution in groundwater samples collected from the southern part of Kuwait's Bay. The concentration of nitrate in the samples ranged from 22.7 to 803.9 mg/L. Higher values were noted in the samples collected inland and a few samples adjacent to the Bay. Spearman's correlation analysis of the data indicated that NO_3^- has a strong positive correlation with SO_4^{2-} and moderate positive correlation with Na^+ , TDS/EC. The PCA analysis and factor scores revealed the different sources for groundwater nitrate contamination as follows: leakage of sewer lines in the urban region has led to the infiltration of contaminated

sewage, high saline environment due to seawater intrusion, chemical weathering, and influence of denitrifying bacteria. The health risk has resulted due to the NO_3^- concentration being above the standard limit for adults. Furthermore, the nitrate concentration was higher in the region adjoining the landfills. In addition, the discharge of groundwater with higher nitrate to the adjacent open water in the Bay may lead to eutrophication. Hence, proper management strategies are to be adopted to control the nitrate pollution in groundwater.

Keywords Nitrate · Groundwater quality · Correlation · Factor analysis · Anthropogenic · Infiltration

Introduction

Groundwater is an essential source of drinking water in many countries globally (Li & Qian, 2018; Li et al., 2018). However, groundwater quality is degrading due to anthropogenic activities and natural pollution from many sources (Bain et al., 2014; Li et al., 2016). One of the common pollutants that affect groundwater quality is nitrate (NO_3^-). Nitrate contamination in groundwater is chiefly influenced by the presence of pollutant sources and regional environmental conditions, where it infiltrates to groundwater either naturally or due to anthropogenic activities (He et al., 2022a, b). According to WHO (2017),

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the maximum permissible limit of nitrate in drinking water is 50 mg/L. People are mostly exposed to polluted groundwater via two routes: ingestion of drinking water or oral exposure and cutaneous interaction (Li et al., 2019). In general, a high concentration of nitrate in water and food leads to human health risks like stomach cancer, gastrointestinal malignancies, and hypertension (Ward et al., 2018). Reduction of nitrate to nitrite and on reaction with amines and amide it forms nitrosoamine and nitrosoamide, which leads to carcinogenicity (Jain et al., 2020). In addition, the risk of methemoglobinemia, a condition in which the blood lacks the capacity to deliver enough oxygen to individual body cells, increases (Shah & Joshi, 2017).

Nitrate has a nitrogen molecule present in small levels in various environments, derived predominantly from the atmosphere and soil. Anthropogenic activities like industrial emissions also play a significant role in increasing the concentration of NO_3^- in groundwater through infiltration process. Apart from the atmospheric source, sources of pollution can be classified as point or non-point source. Point source regions of nitrate contamination are intense livestock confinement, leaking septic or sewage systems, and chemical or manure storage (Haller et al., 2013). Point sources can result in exceptionally high nitrate concentrations in localized areas (Zhou et al., 2015). Agricultural operations are well-known non-point sources of nitrate contamination in groundwater via fertilizers applications (Pisciotta et al., 2015). Nitrates are the most common material added to and/or produced by agricultural soils because they are highly soluble and easily leached in the form of fertilizers (Forster et al., 1982).

In addition, NO_3^- is the principal source of inorganic nitrogen in the soil and required for growth and development of crops (Pisciotta et al., 2015). Nitrate is an extremely soluble compound; as a result, it is rapidly absorbed by soils and leaches into groundwater (Alex et al., 2021). Generally, in many types of soil, the N_2 increases with rainfall events, as the oxygen levels decrease due to the respiration process of microorganisms (Zaady et al., 1996; Kieft et al., 1987). This phenomenon in arid regions helps generate the denitrification process (Peterjohn & Schlesinger, 1990). Apart from the infiltration process, the presence of NO_3^- in groundwater may be due to natural minerals that contain nitrogen, especially in arid regions like

soda niter or (NaNO_3), niter or (KNO_3), and nitrocalcite [$\text{Ca}(\text{NO}_3)_2 \cdot 4\text{H}_2\text{O}$], their deposition is associated with halite, gypsum, and other soluble nitrates and sulfates (Hamilton et al., 1983).

However, the deposition of environment plays a significant role in the variation of nitrate concentration. In a desert ecosystem, the primary nitrogen source comes from fixing N_2 from the atmosphere by organisms, eolian transport, and deposits of NO_3^- salts, NH_4^+ , and NO_3^- during precipitation periods (Boring et al., 1988). The atmosphere has 78% of natural nitrogen gas apart from those derived from anthropogenic sources like burning fossil fuels and other pollution sources (Uhlman et al., 2011). The deposition of atmospheric nitrogen in the soil is mainly governed by the formation of biological soil crust and canopy covers (Zaady, 2005). The deposition of nitric acid or ammonia and sea spray is considered a chief source of nitrogen inputs from the atmosphere (Michalski et al., 2004). Recent studies on nitrate pollution in groundwater have also focused on a Graphical Interface System database Normalized Difference Vegetation Index and time-series (Rodriguez-Galiano et al., 2018). The effect of hydrogeological conditions on groundwater nitrate pollution was studied by DRASTIC and HHRA model and evaluated the human health risk assessment (Zhang et al., 2021). A review on global groundwater nitrate pollution indicated that the sources of pollution were due to agriculture, industry, sewage, septic tanks, and landfills (Abascal et al., 2021). Studies have also identified that water level fluctuation and land use pattern influenced NO_3^- level in groundwater along with sewage, septic sewage, and manure contributed to NO_3^- pollution in groundwater (Panda et al., 2022).

The availability of freshwater resources is scanty, especially in arid regions like Kuwait. In Kuwait, groundwater is mainly used for domestic purposes, irrigation, and livestock rearing. The earlier studies on groundwater from different regions of Kuwait have reported higher nitrate concentrations (> 10 mg/L) in the central and southern regions of Kuwait (Mukhopadhyay et al., 2008). Since then, there has been a drastic change in living conditions, industrialization, and urbanization. An increase in population and modernization may lead to an increase in NO_3^- concentrations over the years. The southern part of Kuwait's Bay has experienced rapid

urbanization and industrialization. Therefore, the current study has attempted to quantify nitrate concentration in groundwater, determine the significant sources south of Kuwait's Bay region, and perform scenarios of health risk assessment considering oral consumption for female and male adults. Furthermore, the study also aims to determine the spatial variation of the nitrate concentration in groundwater and the process governing its distribution.

Study area

The study area is located inland south of Kuwait's Bay with a ground surface elevation varying from 4 m along the seashore to about 45 or 50 m above mean sea level in the city towards the southern suburbs (Al-Rashed & Sherif, 2001). Samples were collected chiefly in areas around agriculture, landfills, and urban areas. Kuwait City, its environs, and industrial zones cover roughly 600² km. The region also includes sites for oil wells, pipelines, and processing facilities (Omar & Shahid, 2013). The population for 2021 is approximately 813,618 (Worldpopulationreview, 2021), with a higher population density with various plants and trees distributed in private houses, public shopping areas, public parks, and along the streets. The most common plants and trees found around the study area are Conocarpus, Palms, Nerium Copa, and Albizia Lebbeck. Kuwait, in general, is known for having a very hot climate, especially in summer seasons, with an annual average temperature of 26 °C with an average rainfall of 110–120 mm (Dhanu Radha et al., 2022).

Geology and hydrogeology

Kuwait has two main aquifers with brackish water, mostly utilized for irrigation and animal husbandry. The clastic Kuwait Group Aquifer (KGA) that overlies the dolomitic limestone is referred to as the Damam formation (DF). A clayey aquitard zone separates both formations (Omar et al., 1981). The thickness of KGA and DF varies from 0 to 300 m and 120 to 300 m, respectively. Both aquifers show an increase in thickness in northeastern parts of Kuwait (Mukhopadhyay et al., 2008). The groundwater in Kuwait generally flows from the southwest to the northeast part of the country, where it flows towards the sea. A study by Al-Senafy

and Fadllemawla (2014) illustrated that the submarine groundwater discharge (SGD) is the result of groundwater flowing directly into the sea as it descends a gradient whenever an inland aquifer is linked to the sea. Furthermore, the SGD was estimated by calculating the nutrient inputs and radioactive tracers along coastal areas (Al-Senafy & Fadllemawla, 2014). Al-Sulaimi (1988) reported that KGA is composed of a thick succession of unconsolidated, coarse, pebbly to gravelly sand of terrestrial fluvial origin, potentially corresponding to the Oligocene Ghar formation and the Lower Fars formation representing the lower Miocene. The calcareous sandstone, fine-grained limestone, and muddy sand with modest amounts of granules and dispersed pebbles are the most common rock types found in KGA. In addition, the study identified the topsoil layer of eolian dust, which was transported by the northwesterly wind from Iraq to Kuwait (Al-Sulaimi & Al-Ruwaih, 2005). Kuwait City underlines Ghar and Fars formations, both belonging to KGA, with minor regional variations (Al-Sulaimi & Al-Ruwaih, 2005). Calcrete is abundant in the undifferentiated Ghar and Fars formations in the south, which is found in a thick sand succession. Gypcrete is predominantly associated with the Dibdibah formation's top part in the north (Al-Sulaimi & Pitty, 1995). The widespread presence of calcrete, dolocrete, and gypcrete deposits, several meters thick and with limited permeability, has been documented in shallow excavations and boreholes in Kuwait City (Al-Rashed & Sherif, 2001).

Methodology

Nineteen groundwater samples were collected from monitoring wells distributed in different regions of the study area (Fig. 1) during September 2021 by adopting standard procedures (SMEWW, 2017). The location of the samples is based upon the availability of sampling wells and accessibility to the locations. The well depth of the collected samples ranges from 9.8 to 49.8 m. The samples were filtered using 0.45 µm Millipore filter paper and transferred to glass bottles for further analysis in the Water Research Center (WRC) laboratories of the Kuwait Institute for Scientific Research (KISR). Nitrate and other physical, chemical, and microbiological parameters like pH, electrical conductivity, total dissolved solids, alkalinity, major cations and anions, silica, and sulfide

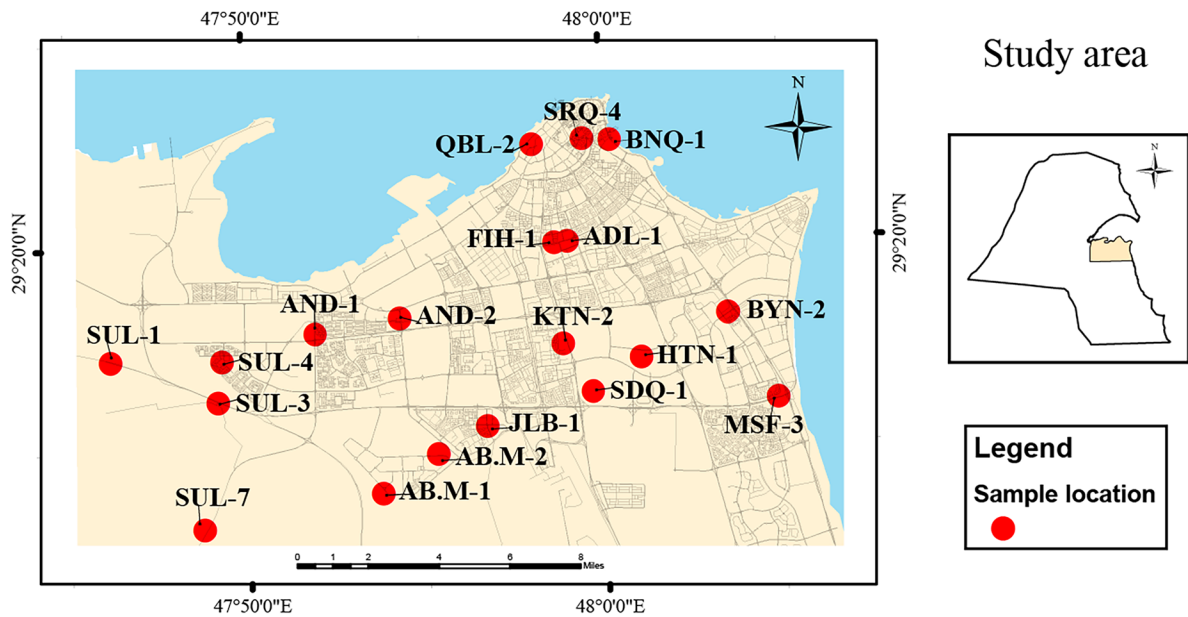


Fig. 1 Study area map representing the south of Kuwait Bay with groundwater sampling location

were analyzed using the standard methods (SMEWW, 2017; ASTM, 2009). The variables were chosen for analysis based on their respective relevance in terms of groundwater contamination potential/availability. The QC/QA procedures were adapted to the analytes as per the standard methods such as duplication, standard checks, QC sample, and ion balance error equation were used. The Statistical Package for Social Sciences (SPSS v26) software was used to analyze the data.

All groundwater sample parameters (pH, EC, TDS, SiO₂, nitrate, and major ion concentrations) were subjected to descriptive statistics (minimum, maximum, and average values). The results of applying statistical analysis to the raw dataset showed that not all variables were normally distributed, and hence all data for each parameter was used in the analysis without removing any outliers. Spearman's correlation method is preferred because the total number of variables is less than 30, and the data is not following a normal distribution. PCA is an effective approach for reducing the dimensionality of a data set with many connected variables while preserving as much variability as possible (Ren et al., 2021; Wu et al., 2020). Factor loadings are categorized as (strong, moderate, or weak), with absolute loading values of > 0.75, 0.75–0.50,

and 0.50–0.30, respectively (Liu et al., 2003). Four factors were extracted as primary principal components using PCA with Varimax rotation and Kaiser normalization, identifying the variables impacting each principal component for the physico-chemical parameters. MapInfo Software was used to generate the spatial distribution of nitrate in the study area.

The Hazard Index (HQ) is the ratio of a single drug exposure level (dose or concentration) during a specified time period to the Oral toxicity Reference (RfD) calculated for the same substance over the same time period. When the ratio is higher than one, the chemical concentration is high enough to have long-term non-carcinogenic effects.

$$HQ = \frac{EDI}{RfD} \quad (1)$$

This value is according to the USEPA's Integrated Risk Information System (USEPA, 2014). The NO₃⁻ exposure dose is calculated using the estimated daily intake (EDI) of NO₃⁻ from groundwater, by calculating various variables (Table 1). Equation 1 from the US Environmental Protection Agency was used to compute the EDI values. EDI can be determined using the following equation (Ji et al., 2020; Wang & Li, 2022; Wei et al., 2022):

Table 1 Description of each variable used in the Hazard Index calculation

Variable	Description	Adult female	Adult male	Reference
AT (day)	Averaging time of exposure	28,105	27,375	
BW (kg)	Average body weight	78.3	85.8	Samayamanthula et al. (2021)
C (mg/L)	Concentration of nitrate in groundwater	22.7–803.9		
ED (Year)	Exposure duration	75.9	73.9	Ali and Chidambaram (2020)
EF (days/year)	Exposure frequency	365		
IR (L/day)	Daily water intake rate	2.5		Rahman et al. (2021)
RfD (mg/kg)	Oral Toxicity reference	1.6		

$$EDI = \frac{C \times IR \times EF \times ED}{BW \times AT} \quad (2)$$

Results and discussion

Statistical analysis

The pH values varied between 7.33 and 8.26, showing neutral to basic water type. Also, it indicates the type of sediments that are alkaline and carbonate in nature. Limestone and carbonate minerals are two substances that may help to buffer pH variations in water (Jeong et al., 2020). Calcium carbonate (CaCO₃) and other bicarbonates may neutralize pH by combining hydrogen or hydroxyl ions (McNally & Metha, 2004). The DO (Dissolved Oxygen) values varied from 4.9 to 7.9 mg/L. The analytical results of samples reflect nitrate concentrations ranging from 22.7 to 803.7 mg/L with an average of 143.8 mg/L (Table 2). The highest concentration of nitrate was found in the groundwater sample collected from Abdullah Al Mubarak (AB.M-2). ABM is a residential area adjoining the south side of a non-active landfill area called Jleeb Al Shuyoukh (Fig. 2).

At an approximate distance of 9 km from the south of AB.M-2, two large landfills were reported by EPA (2010), located in the north and south parts of the seventh ring road, whereas the north landfill is non-active and the one in the south is active. The deepest sample (49.8 m) was collected from well SUL-7, with a nitrate concentration of 535.9 mg/L, which considers the second-highest value of NO₃⁻. SUL-7 is located along the Sulabiya road, and on the west and northwest side of the well sample are livestock farms, and agricultural areas were observed, respectively.

Another old landfill in the Kabd area is found almost south of sampled well at an approximate distance of 12 km. This landfill is non-active and characterized by animal waste dumping sites (EPA, 2010). The lowest NO₃⁻ concentration recorded was observed in sample BNQ-1, with a value of 22.7 mg/L. BNQ-1 sample located in Bnied Algar area along the gulf road near the Arabian gulf sea considered an urbanized area with tall medical buildings and apartments.

Spearman’s correlation

The correlation coefficient measures the relationship between variables. The correlation coefficient of 0.25 to 0.5 and > 0.5 are considered moderate correlation and good positive correlation, respectively. The correlation coefficient was observed only for sixteen parameters (Table 3). The ion distribution in a groundwater sample is non-parametric. Therefore, Spearman’s correlation was attempted to understand the relationship between nitrate and other parameters. EC and TDS exhibited an excellent positive correlation between them, with the highest value (*r*=0.98) and had a moderate correlation with pH, which reflects that electrical conductivity (EC) is dependent on total dissolved solids (TDS). Na⁺ and Cl⁻ resulted in a good positive correlation (*r*=0.79), indicating the saline nature, especially in arid and semi-arid regions (Ganyaglo et al., 2010), due to the availability of salt deposits in that area due to chemical weathering or saline water infiltration.

The molar NO₃⁻/Cl⁻ a ratio of the groundwater is generally assessed to the surface water and the rainwater to assess the conservative nature of the coupled ions and to unravel the vertical migration history during recharges (Gates et al., 2008). On comparing Cl⁻ and NO₃⁻ ratios to depth profiles,

Table 2 Analytical results of physics-chemical parameters in groundwater samples collected along South of Kuwait's Bay

Well ID	Well depth (m)	pH	EC (µS/cm)	TDS (mg/L)	DO (mg/L)	Na ⁺ (mg/L)	K ⁺ (mg/L)	Ca ²⁺ (mg/L)	Mg ²⁺ (mg/L)	F ⁻ (mg/L)	Cl ⁻ (mg/L)	SO ₄ ²⁻ (mg/L)	NO ₃ ⁻ (mg/L)	NH ₄ ⁺ (mg/L)	HCO ₃ ⁻ (mg/L)	Silica (mg/L)
JLB-1	19.8	7.82	8130	6350	4.9	1532	56.3	226.0	147.0	2.02	1150	3021	107.6	0.50	77	20.7
KTN-2	20.8	7.86	11,260	8020	7.8	2093	59.1	359.7	151.9	0.79	2709	2233	36.4	0.90	336	25.78
SDQ-1	32.8	8.26	19,690	17,200	6.9	4410	79.9	391.9	142.6	2.31	1409	10,438	176.0	<0.03	84	15.05
AB.M-1	20.8	7.77	6302	5200	6.9	643	81.9	475.3	225.8	1.30	227	3325	43.3	0.33	80	21.05
AB.M-2	20.8	8.11	22,920	19,500	6.4	5142	106.2	496.8	313.8	1.44	2238	10,125	803.9	<0.03	148	24.39
HTN-1	17.8	7.97	7993	6690	6.4	1132	137.6	568.8	172.9	1.47	1003	3382	111.7	0.42	128	39.7
FIH-1	20.7	8.03	5931	4670	6.2	883	70.6	329.4	154.0	1.95	621	2463	32.8	0.40	73	22.22
AND-1	14.8	7.89	8142	6820	6.5	1259	51.3	559.5	224.2	1.89	1304	3159	23.6	0.43	174	41.93
AND-2	14.8	8.05	8843	7300	6.5	1852	34.2	276.7	109.0	2.21	1119	3607	92.9	<0.03	165	25.96
BNQ-1	9.8	7.82	11,110	8710	5.5	1617	58.6	747.0	332.8	1.38	2360	3365	22.7	0.85	159	26.53
BYN-2	11.8	7.75	8304	6850	6.7	1147	110.0	649.9	202.8	0.96	1472	2956	55.6	0.39	210	32.2
MSF-3	11.8	7.61	8905	6930	6.5	1111	60.4	826.4	198.8	1.78	2037	2416	46.2	0.38	184	33.26
SUL-1	17.8	7.75	7879	6030	6	1186	21.4	459.2	108.5	1.62	728	3045	205.2	0.54	246	25.09
SUL-3	16.8	7.85	12,250	9520	7	1936	65.3	673.4	302.1	1.89	2708	3501	80.0	0.80	196	38.62
SUL-4	17.8	7.94	4125	3210	7.9	193	44.4	514.3	88.6	2.28	96	2082	61.8	0.18	87	32.68
SUL-7	49.8	7.97	14,750	11,860	7.2	2680	46.7	748.1	278.3	1.80	3212	4238	535.9	0.85	79	19.52
ADL-1	17.8	7.33	12,970	9290	5.5	1626	156.8	957.5	331.1	<0.01	3479	2428	105.0	0.72	158	26.5
QBL-2	14.8	8.20	4848	3420	5	792	26.5	138.2	15.3	1.48	393	1759	59.8	<0.03	200	24.03
SRQ-4	20.8	7.76	8054	6850	6.8	952	66.8	580.9	313.1	3.12	787	3596	132.1	0.45	363	43.15

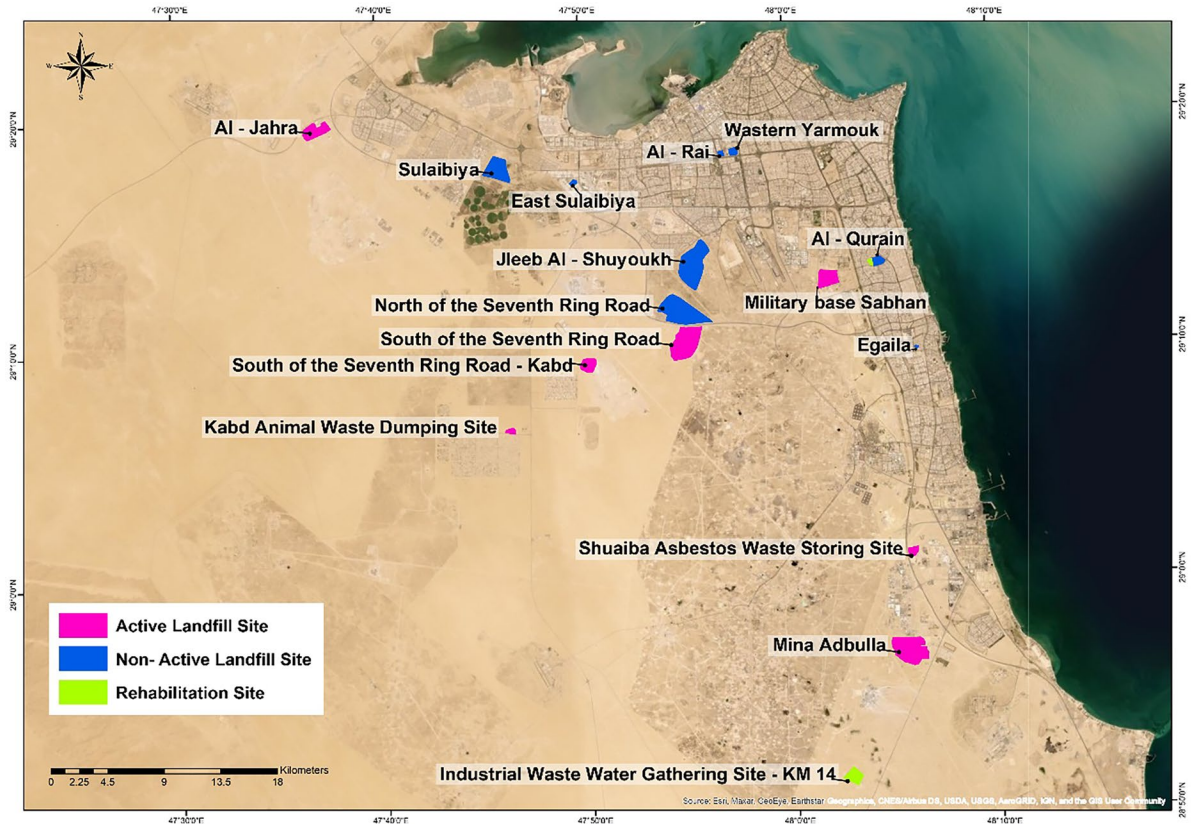


Fig. 2 Distribution of active and non-active landfill locations in Kuwait. (Modified after EPA, 2010)

Table 3 Spearman’s correlation analysis for the geochemical data obtained from the analysis of the groundwater samples

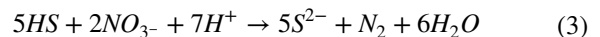
	pH	EC	TDS	HCO ₃ ⁻	F ⁻	Cl ⁻	Br ⁻	NO ₃ ⁻	SO ₄ ²⁻	Li ⁺	Na ⁺	NH ₄ ⁺	K ⁺	Ca ²⁺	Mg ²⁺	SiO ₂
pH	1	0.05	0.08	-0.36	0.36	-0.19	-0.20	0.18	0.33	-0.01	0.24	-0.48	-0.18	-0.55	-0.37	-0.38
EC		1	0.98	0.01	-0.19	0.89	0.69	0.31	0.53	0.55	0.91	0.24	0.31	0.41	0.53	-0.14
TDS			1	0.05	-0.14	0.85	0.69	0.35	0.62	0.53	0.89	0.23	0.32	0.43	0.57	-0.07
HCO ₃ ⁻				1	-0.19	0.12	-0.04	-0.09	-0.20	-0.26	-0.02	0.17	-0.18	0.13	0.00	0.56
F ⁻					1	-0.39	-0.53	0.25	0.30	-0.26	-0.10	-0.28	-0.38	-0.28	-0.36	0.02
Cl ⁻						1	0.66	0.09	0.23	0.45	0.79	0.55	0.27	0.56	0.59	0.02
Br ⁻							1	-0.03	0.36	0.43	0.48	0.28	0.45	0.56	0.75	-0.12
NO ₃ ⁻								1	0.54	0.32	0.40	-0.10	0.05	0.01	-0.03	-0.25
SO ₄ ²⁻									1	0.42	0.58	-0.06	0.19	0.12	0.38	-0.12
Li ⁺										1	0.53	0.16	0.70	0.06	0.47	-0.22
Na ⁺											1	0.27	0.10	0.11	0.30	-0.26
NH ₄ ⁺												1	-0.05	0.42	0.42	0.15
K ⁺													1	0.37	0.55	0.11
Ca ²⁺														1	0.72	0.49
Mg ²⁺															1	0.27
SiO ₂																1

few samples showed that Cl^- increases with depth and NO_3^- decreases (Fig. 3). It is due to the process of progressive evaporation (Phillips, 1994). Moreover, the decrease of NO_3^- with depth results from the plant uptake and biological activity in the shallow zone (Jobbagy & Jackson, 2001). Especially Cl^- ion is excluded from soil vapor, and the plant membranes avoid uptake during transpiration. As water returns to the atmosphere, subsequent rain enhances the Cl^- infiltration to the deeper layers. The second trend shows that nitrogen increases with depth which might be governed by EOR that is adopted in the adjoining oil fields, where the nitrogen is facilitated by structural and geological controls (Carman, 1996).

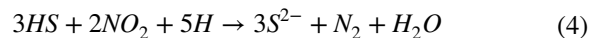
The correlation between Ca^{2+} and SO_4^{2-} is moderate, indicating no significant mineral dissolution, especially with gypsum and anhydrite in the study area. NO_3^- has a strong positive correlation with SO_4^{2-} with a value of $r=0.54$, which probably indicates the presence of nitrogen-type fertilizers that infiltrated to groundwater (Babiker, 2004). Sulfate is a common anion in water that has been overlooked as a source of groundwater contamination in the past (Wang and Zhang, 2019). Through geothermal processes, seawater intrusion, and atmospheric

deposition, SO_4^{2-} is released into the water as part of residential wastewaters, industrial wastes, and wastewaters through mining, smelting, steel production, kraft pulp, paper mills, and flue gas desulphurization circuits. Sulfate minerals (e.g., gypsum), oxidation of sulfide minerals (e.g., pyrite), rainfall, and volcanic activity are responsible for greater amounts of SO_4^{2-} in groundwater (Fernando et al., 2018). However, the study area is dominated by sedimentary rocks. And the surrounding area, mainly southwest of the state of Kuwait, has many oil fields. Enhance Oil Recovery (EOR) preferred in the oil field could be another reason for increasing nitrate concentration. The generation of H_2S is observed during the secondary recovery of oil due to the development of SRB (Sulfate Reducing Bacteria) during seawater injection to maintain high pressure during oil extraction (Vigneron et al., 2017). This development of H_2S is mainly due to the processes of high sulfatic in reducing environment in seawater.

Moreover, this sulfate is anaerobically reduced by bacteria and organic acids, hydrocarbon, and H_2 , facilitating an ideal environment for SRB. The mechanism involved in this process is sulfate anaerobically reduced by bacteria SRB converted into H_2S . Hence to prevent the formation of H_2S , nitrate is injected into a system where the growth of NRB is enhanced as it is a high-energy electron acceptor, then sulfate, thereby reducing the formation of H_2S (Dolfing & Hubert, 2017). Further, the formation of sulfur or sulfate from sulfides could result from oxidation process due to chemo lithospheric bacteria.



The dissolved sulfides also react abiotically with NRB (Nitrogen Reducing Bacteria) (Davidova et al., 2001)



A moderate positive correlation was observed between NO_3^- with Na^+ ($r=0.40$), Li^+ ($r=0.32$), TDS ($r=0.35$), and EC ($r=0.31$). Lithium in groundwater may come from various sources, including waste disposal leachate. Kjolholt et al. (2003) determined a concentration of 330 g/L in leachate from a waste disposal site. Lithium excreted from medicinal users into wastewater has been identified as a possible

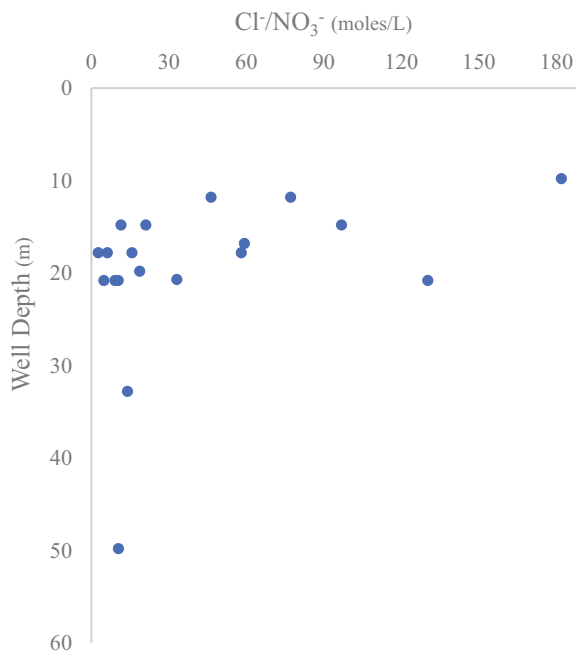


Fig. 3 Mole ratio of nitrate and chloride with respect to depth

source in septic systems and sewage treatment facilities (Bexfield et al., 2019). Additionally, soils' lithium concentrations have been linked to synthetic fertilizers made from rock phosphates and naturally occurring brines (Ebensperger et al., 2005). Weak correlations were observed between NO_3^- and F^- , similarly with K^+ and Ca^{2+} . NO_3^- also shows a weak negative correlation with HCO_3^- ($r = -0.09$), indicating that denitrification took place in groundwater wherein acts as nitrate removal (Laftouhi et al., 2003). The presence of dissolved oxygen in the arid environment deters the process of biotic denitrification and favors the persistence of NO_3^- in the saturated zone for a very long period (Edmunds, 2003). Interrelationships between NO_3^- and other variables were also considered from previous studies to characterize the sources and processes leading to nitrate occurrence.

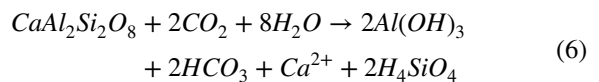
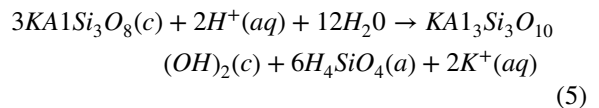
Principal component analysis (PCA)

Four PCA components of eigenvalue greater than 1 are of variance up to 80% (Table 4). The first component (PCA-1) is the most significant in PCA (37% variance) with loadings of EC, TDS, Cl^- , NO_3^- , SO_4^{2-} , Li^+ , and Na^+ while an intermediate representation of pH, K^+ , and Mg^{2+} was observed. As a result, the substantial positive loadings of the principal ions and EC and TDS in PCA-1 imply that the groundwater in the region is brackish/saline, indicated by the association of Na^+ , Cl^- , and TDS. This saline water reflects anthropogenic contamination by the loadings of NO_3^- , SO_4^{2-} , and Li^+ in the study area, such as industrial, agricultural, and domestic sewage (Yang et al., 2013). Hence, the PCA-1 reflects sewage contamination, either septic tanks discharge or leakage of sewage pipelines (Mukhopadhyay et al., 2007). The second component (PCA-2) represents a 25% variance with the association between Cl^- , NH_4^+ , and Ca^{2+} , which is mainly due to the utilization of chemical fertilizers such as NH_4HCO_3 , $\text{CO}(\text{NH}_2)_2$, NH_4NO_3 , $(\text{NH}_4^+)_2\text{SO}_4$, $\text{Ca}(\text{H}_2\text{PO}_4)_2$, and KCl (Zhang et al., 2014). The third component (PCA-3) with 11% variance attributes K^+ , Ca^{2+} , Mg^{2+} , and silica. This factor represents rock-water interaction between the groundwater and the aquifer few reactions as shown in Eqs. (5 and 6) are listed below:

Table 4 Rotated component matrix analysis applied to groundwater samples using 5 iterations converged rotation and a VARIMAX rotation with Kaiser normalization method

	Rotated principal component analysis			
	PCA-1	PCA-2	PCA-3	PCA-4
pH	0.38	-0.61	-0.53	0.07
EC	0.97	0.17	0.08	-0.05
TDS	0.98	0.06	0.09	-0.04
HCO_3^-	-0.13	0.27	0.10	0.65
F^-	0.03	-0.06	-0.14	0.54
Cl^-	0.48	0.82	0.15	0.04
Br^-	-0.03	0.08	0.24	-0.66
NO_3^-	0.81	-0.01	-0.01	-0.02
SO_4^{2-}	0.91	-0.32	0.04	-0.08
Li^+	0.71	0.05	0.35	-0.29
Na^+	0.99	0.01	-0.08	-0.05
NH_4^+	-0.16	0.87	0.09	0.12
K^+	0.24	0.11	0.76	-0.38
Ca^{2+}	0.07	0.59	0.64	0.06
Mg^{2+}	0.38	0.48	0.66	0.06
SiO_2	-0.34	-0.05	0.61	0.64
Variance %	36.86	24.86	10.57	7.39
Cumulative %	36.86	61.72	72.28	79.67

Loadings above 0.5 are represented in bold



Reflecting the fact that chemical weathering process is also a predominant factor in the region, the fourth component (PCA-4) shows a 7% variance with an association between bicarbonate, fluoride, and silica, where HCO_3^- illustrates the impact of carbonate mineral dissolution. An experiment by Gao et al. (2019) illustrated that the increased fluoride contents in the microcosm flasks showed that microbial activity had induced fluoride release from the sediment into aqueous solutions. The experiment also showed that the fluoride culture kept growing despite the microbial population not increasing, while the nitrate showed a decreased trend during the first days of the experiment. In a natural groundwater-sediment system, the interaction between microbes and F-bearing

sediments is most likely an ongoing process. Nitrate, acetate, and formate entirely vanish in the culture group but remain in the control group, indicating that the indigenous microorganisms in the culture experiment absorb them (Gao et al., 2019).

Denitrifying bacteria also utilize nitrate oxygen to create energy from organic carbon and release bicarbonate and nitrogen as a byproduct into the system (Babiker, 2004). Dissolved oxygen ranging from 1 to 6 mg/L favors the process of infiltrations, and thus the absence of Mn, and NH_4^+ also reduces the possibility of denitrification.

Factor score (FS)

Factor score analysis is a multivariate statistical method widely used to characterize the general connections between multiple observable variables in terms of a possibly smaller number of unobserved variables, referred to as factors, with minor information loss (Liang et al., 2020). The FS values of samples concerning the described factors (Table 5) show that the samples from SDQ-1, AB.M-2, SUL-3, and SUL-7 in F1 reflect the high effect of nitrate desert pools. The second factor score of samples KTN-2, BNQ-1, BYN-2, MSF-3, SUL-1, SUL-3, SUL-7, and ADL-1 reflects a high saline environment due to the predominance of Ca^{2+} , Cl^- , and Mg^{2+} which reflects hypersaline groundwater. The third factor represented in locations AB.M-1, AB.M-2, HTN-1, AND-1, BYN-2, MSF-3, SUL-3, ADL-1, and SRQ-4 indicating the predominance of chemical weathering. The FS for the fourth PCA represents samples KTN-2, AND-1, AND-2, BNQ-1, MSF-3, SUL-1, SUL-3, SUL-4, and SRQ-4, illustrating the influence of denitrifying bacteria associated with the release of HCO_3^- into groundwaters. However, it is notable that all four factors are active in SUL-3, and no significant factor is active in FIH, QBL-2, and JLB-1. The spatial distribution of all the factor scores regarding the association between each sample was conducted (Fig. 4).

Sources and distribution of nitrate

Further to have a general understanding of NO_3^- concentration and distribution around the study area, a contour map was generated (Fig. 5). It was observed that high nitrate concentration was found in the southern parts of the study area predominantly represented

Table 5 Factor score results with respect to the groundwater sample ID

Sample ID	F1	F2	F3	F4
JLB-1	-0.11	-0.22	-0.71	-0.58
KTN-2	-0.01	1.69	-1.18	0.34
SDQ-1	1.98	-1.24	-0.70	-0.43
AB.M-1	-0.94	-0.62	0.71	-2.70
AB.M-2	2.95	-0.75	0.67	-0.25
HTN-1	-0.33	-0.87	1.44	-0.14
FIH-1	-0.64	-0.58	-0.59	-0.60
AND-1	-0.41	-0.32	0.54	0.95
AND-2	-0.07	-0.87	-0.90	0.29
BNQ-1	-0.01	1.27	-0.06	0.11
BYN-2	-0.47	0.13	0.80	-0.13
MSF-3	-0.50	0.44	0.50	0.47
SUL-1	-0.48	0.42	-1.15	0.56
SUL-3	0.22	0.80	0.49	1.00
SUL-4	-1.11	-1.09	-0.19	0.25
SUL-7	1.02	1.46	-1.05	-0.08
ADL-1	-0.02	1.88	1.60	-1.30
QBL-2	-0.86	-0.83	-1.68	-0.05
SRQ-4	-0.22	-0.70	1.46	2.31

Significant values above 0 are represented in bold

by PCA 1 and decreased gradually in the northeastern part. This might be due to the groundwater flow direction in Kuwait that moves from the southwest to the northeast towards the sea.

A study by Adnan Akber et al. (2006) reported that groundwater samples collected from Dammam and Kuwait aquifers contain nitrite-oxidizing and reducing bacteria. Similarly, in the present study, higher nitrate samples would contribute to microorganisms, and few samples have low values due to the consumption of NO_3^- by microbes. Within the groundwater, nitrate is the only dissolved inorganic nitrogen pool that can be detected. Given the rarity of mineral nitrate sources, the bulk of the nitrate came from microbial-degraded nitrogen fertilizers. The amounts of soluble reactive phosphorus were low, suggesting that phosphate was precipitated as insoluble apatite/fluorapatite (Gao et al., 2019).

The best conditions for nitrification are a pH of about 7 and oxygen (Keeney, 1970a, b). High temperature in arid regions due to high solar radiation favored by higher soil pH leads to the non-availability of NH_3 in the soil, as it is lost to the atmosphere through volatilization (Wang et al., 2014). Studies have reported

Fig. 4 Spatial distribution of each factor score that represent a significant relationship between sample locations

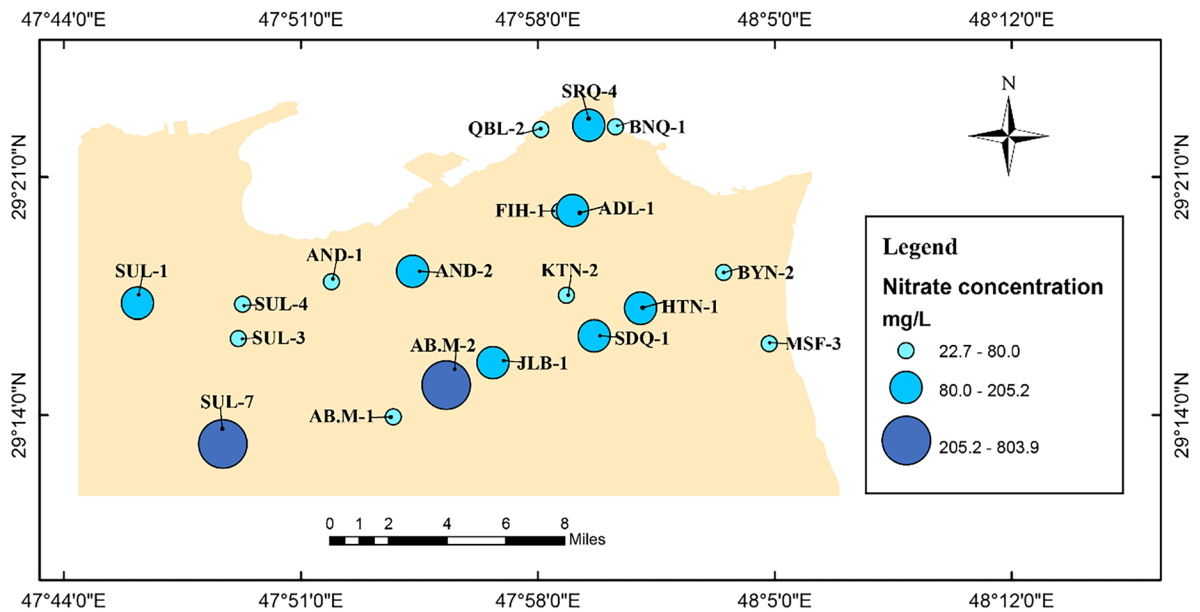
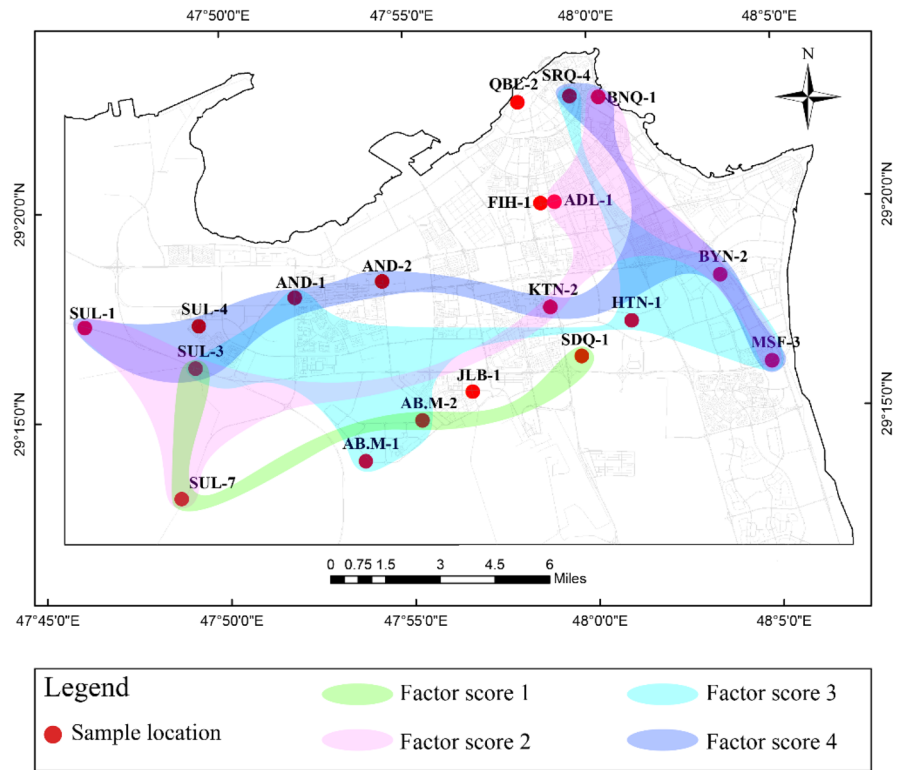
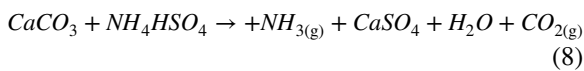
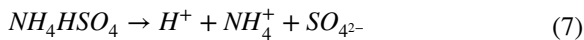


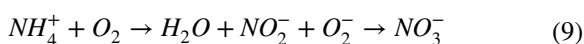
Fig. 5 Variation of nitrate concentration and its distribution along south of Kuwait's Bay

such conditions globally, and the presence of NH_3 in soil indicated low air temperature and pH (Hu et al., 2008). Since the study area is located south of Kuwait's Bay, the probability of oxidation of aqueous H_2O_2 and gaseous SO_2 along with NH_3 present in the atmosphere forms NH_4HSO_4 aerosols. This aerosol with higher relative humidity leads to acidic droplet formation. When the aerosol is associated with coastal CaCO_3 , pH increases loading and the volatilization of NH_3 , and the formation of CaSO_4 . Both cases are represented by the following reactions (Bidoglio & Stumm, 2013).



In general, nutrients and organic matter serve as potential energy sources for bacteria (Clark et al., 2003). Since nitrate is one of the nutrients being used as a food resource for a few microorganisms (Oskay & Yalcin, 2013), some samples contain low nitrate. Earlier studies have reported that the microbial population lowers nitrate concentrations (Mukhopadhyay et al., 2007). The variation of nitrate with respect to microbes also depends on the type of microbes present in the region. For instance, low nitrate is observed if the total viable counts are high.

Similarly, coliform bacteria are correlated to nitrate. Hence, nitrate could be high or low depending on the type of bacteria. Fecal coliform may reduce the nitrate, and it is also to be noted that higher nitrate indicates high total coliform bacteria (Vasudevan et al., 2021). It is also noted that cyanobacteria were reported to achieve nitrogen fixation in the warmer deserts (Gates et al., 2008). It was identified that the nitrogen derived by nitrification processes or due to nitrogen fixation facilitated by the microorganism might be transported either by surficial processes like eolian dust or by subsurface processes via infiltration to groundwaters in the arid regions. The nitrate in the playa sediments is associated with nitrogen-fixing bacteria (Ericksen, 1983). Water contains nitrogen in organic form decomposes into inorganic nitrogen either as free ammonia or ammonium salts. It further decomposes into nitrite and oxidizes to nitrate (Vasudevan et al., 2021).



Oxidation of NH_4^+ could be another source of nitrate, and the NH_4^+ may be either derived from nitrogen-fixing bacteria or organic marine soils (Moreno-Castilla et al., 2003). Nitrification is considered one of the essential sources of nitrate in slightly wetter arid regions (Leatham et al., 1983). During nitrification of NH_4^+ through microbes, the oxygen atom is derived from both atmosphere and water molecules (Castignetti & Hollocher, 1984).

Desert NO_3^-

Kuwait's original soils are mainly non-saline, but when there is influence from seawater in coastal locations, significant salinity levels occur; varying amounts of gypsum and calcium carbonate add electrolytes to the soil solution (Omar & Shahid, 2013). The pH is buffered between mildly to moderately alkaline (7.4–8.3), which is higher than the ideal values (6.7–7.3), where most nutrients become accessible to plants (Tisdale et al., 1993). Alkaline pH, aerobic condition with less water content in the soil zone, low microbial population, and organic matter in the desert environment prevent denitrification and help the accumulated NO_3^- to be stable (Hartsough et al., 2001). Few studies in geographical conditions similar to Kuwait have also reported higher desert nitrate (Table 6). NO_3^- in the desert was derived from atmospheric sources through photochemical reaction and oxidation of N_2 in the atmosphere. It is interesting to note that additional sources like plant recycling, weathering, and nitrogen fixation are also critical factors for higher NO_3^- concentration as observed in Mojave region (Michalski et al., 2004). Desert dunes have also been identified as geomorphic units favoring the accumulation of soil N_2 , especially the region with fixed dunes that accumulate NH_4^+ . Thus, the nitrate could accumulate over thousands of years and be mobilized/ migrated to groundwater when there is a change in land use pattern and climate (Hong et al., 2014). The studies on the subsoil N in the arid shrublands and hyper-arid regions have indicated higher levels of N_2 in the vadose zone (Walvoord et al., 2003).

A more extensive reservoir of nitrate in these regions, referred to as the "nitrate pool," was put forth as a significant contributor of nitrate to groundwater (Al-Taani and Al-Qudah, 2013; Ma et al., 2012).

Table 6 High groundwater nitrate reported in desert areas by various studies

No	Location	Country	Author
1	Atacama Desert	Chile	Michalski et al. (2004)
2	Badain Jaran Desert	China	Ma et al. (2012) Gates et al. (2008)
3	Badia Desert	Jordan	Al-Taani and Al-Qudah (2013)
4	Chihuahuan Desert	Mexico	Walvoord et al. (2003)
5	Kalahari Desert	United State	McMahon et al. (2004)
6	Kumtag Desert	Northwest China	Qin et al. (2012)
7	Lut Desert	Iran	Lyons et al. (2020)
8	Mojave Desert	Southwest United State	Leatham et al. (1983) Michalski et al. (2004)
9	Monte Desert	Argentina	Aranibar et al. (2011)
10	Mu Us Desert	China	Jin et al. (2015)
11	Negev Desert	South Israel	Zaady (2005)
12	Thar Desert	Pakistan	Soomro et al. (2017)

The subsurface accumulation of NO_3^- in these arid regions varies with respect to microbial activity, growth of plants, physiography of land surface, and hydraulic properties of soil. It also varies concerning climatic conditions, temperate to semi-arid conditions at different degrees. The natural process in arid countries depends on the time scales and periods of intense rain events and hyper-arid conditions during geological time scales. The hard calcrete is the gatch layer preventing infiltration in several locations of Kuwait. The calcic and/or gypsic pan, often known as gatch, is prevalent in several Kuwaiti soils. A petrocalcic or petrogypsic horizon is a continuous pan produced from precipitated and cemented carbonate or gypsum that acts as a barrier to plant roots (Omar & Shahid, 2013). However, evaporation enrichment and leaching govern NO_3^- in the subsoil layer. Hence, the gatch layer plays a vital role in maintaining the NO_3^- at a certain depth, noting that as residence time increases at that layer, the nitrate will continue to increase.

Hazard Index

Groundwater is polluted due to the intrusion of seawater from south of Kuwait Bay. The calculation for the human health risk is assumed if the groundwater is directly consumed apart from agricultural product intake. This infers a possibility of risk that the consumption of direct groundwater may

result in health issues but for the sea foods/vegetables, the consumption is based on the quantity and type of the product. In order to assess the possible risks of pollutants to human health, a process called health risk assessment essentially establishes a relationship between pollutant loads and human health (Ji et al., 2020). In this study, the health risk assessment was used to identify the negative impact of exposure to nitrate in groundwater on humans' health. Therefore, Hazard Index (HQ) was calculated for the groundwater wells close to south Kuwait Bay and HQ values represent female and male adult's values (Eq. 1). The estimated daily intake per unit weight through oral exposure pathway [mg/(kg day)] can be calculated by Eq. (2). Oral, dermal, and inhalational routes are the three major ways that a person might be exposed to pollutants. Typically, nitrate exposure occurs mostly via consumption (Soleimani et al., 2022) and it was considered for this study.

The HQ results are represented in Table 7. It was observed that out of nineteen sample locations, thirteen samples would have significant health effects on adult consumers, where the HQ value is above 1. The minimum HQ value for adult female and male is 0.446 and 0.407 respectively. whereas the maximum HQ value for adults female and male is 25.29 and 14.42 respectively. Therefore, it is inferred that the adult females will be more exposed to nitrate via ingestion than adult males in the current study.

Table 7 Hazard Index results based on NO₃⁻ concentration in groundwater for adults

ID	NO ₃ ⁻ (mg/L)	Adult female HQ	Adult male HQ
BNQ-1	22.7	0.447	0.408
AND-1	23.6	0.464	0.423
FIH-1	32.8	0.646	0.589
KTN-2	36.4	0.717	0.654
AB.M-1	43.3	0.852	0.777
MSF-3	46.2	0.910	0.830
BYN-2	55.6	1.094	0.998
QBL-2	59.8	1.177	1.073
SUL-4	61.8	1.216	1.109
SUL-3	80.0	1.574	1.435
AND-2	92.9	1.828	1.667
ADL-1	105.0	2.065	1.883
JLB-1	107.6	2.117	1.931
HTN-1	111.7	2.196	2.004
SRQ-4	132.1	2.599	2.370
SDQ-1	176.0	3.461	3.158
SUL-1	205.2	4.035	3.681
SUL-7	535.9	10.542	9.617
AB.M-2	803.9	15.812	14.424

Conclusion

It was concluded from the results that 13 out of 19 samples had high nitrate concentrations ranging from 55.6 to 803.9 mg/L. The higher concentrations of nitrate and sulfate reflect the anthropogenic influence in the study area. In addition, urbanization may increase nitrate concentration in groundwater due to increased sewer drains, usage of fertilizers in landscapes, and plantations in private homes and along the roads, where the water infiltrates below ground and facilitates nitrate contamination. The lithology in the study area, coupled with the groundwater flow direction, resulted in increased nitrate concentration in samples along the flow path. Moreover, the Spearman correlation between sulfate and nitrate illustrated a good positive correlation, indicating the sewage discharge either leakage from pipelines or septic tanks.

Nonetheless, the PCA results showed the anthropogenic impact compared to the geogenic process. In addition, the factor scores also reflected the significant role of anthropogenic activity in the study area. Overall, septic system and sanitary-sewer effluents,

domestic animal wastes, penetration of runoff from roadways and parking lots, house and farm fertilizer use, and atmospheric deposition are all familiar sources of nutrients in urban settings. The health risk assessment scenario resulted in a total of thirteen sample locations that had an HQ value above 1, indicating health risk on adult humans. Further investigations are in process to characterize the leakage of subsurface sewerage networks and the role of geological structure in the oxidation of nitrogen used in enhanced oil recovery.

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Declarations

Consent to participate Not applicable.

Consent for publication Since this study is not attempting to republish or publish any third party or author's previously published material, this section does not apply.

Conflict of interest The authors declare no competing interests.

Research involving human participants and/or animals Not applicable.

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