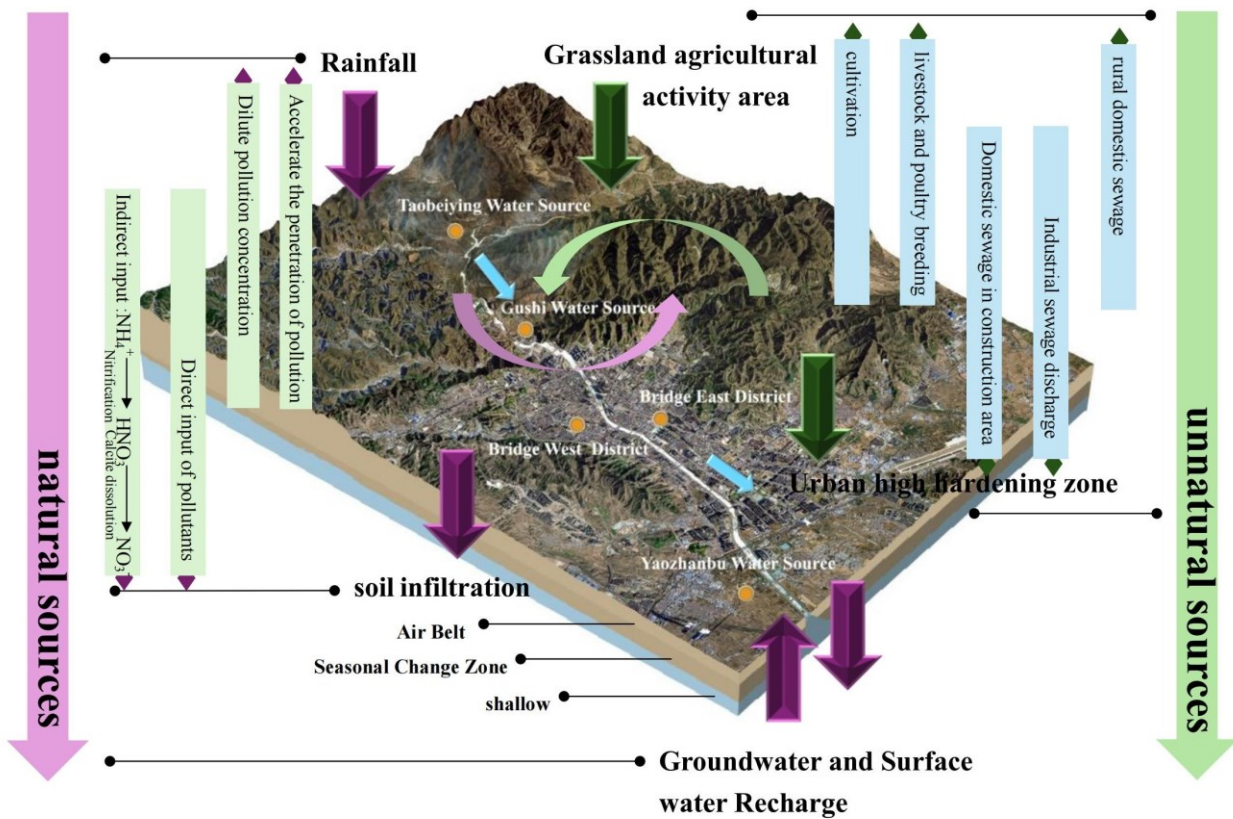


13 **GRAPHICAL ABSTRACT**



14

15 **ABSTRACT**

16 In order to investigate the main pollution factors of underground drinking water sources in semi-arid
 17 agricultural areas in China, and to reveal the threatening influence of pollutants on the normal water
 18 security of local society. Single-factor evaluation index, principal component analysis, basic data
 19 statistics are used to clarify the main pollution indicators of underground drinking water sources in
 20 Zhangjiakou main city and discuss the main influencing factors of the change of their pollution
 21 concentration, and evaluate the degree of health threat of its pollution to the drinking water of local
 22 residents. The results show that: the water sources of Taobeiying and Gushi are deeply affected by
 23 human activities, and nitrate, as the only exceeding substance under drinking water standards, is the
 24 most important indicator of groundwater pollution; and the nitrate concentration of groundwater is
 25 higher in the pasture and nearby agricultural activities; nitrate contamination levels in groundwater
 26 are within the health acceptability range for the vast majority of the population, with only newborns

27 in the Taobeiying drinking water source being exposed to a non-carcinogenic risk of nitrate. The
28 results of the study will help to maintain a stable groundwater environment.

29 **Keywords:** groundwater contaminants, nitrate contamination, land use, agricultural activities, human
30 health risk assessment

ACCEPTED MANUSCRIPT

31 **1. Introduction**

32 Groundwater, as an important component of the Earth's water resources, provides all or part of the
33 drinking water for up to 50 percent of the world's population(IGRAC, 2018, Project, 2023). Especially
34 in arid and semi-arid areas where surface water resources are limited, groundwater has become the
35 most important source of drinking water for the continuation of normal human life activities. The
36 main city of Zhangjiakou is located in the transition zone of forest and grassland in northern China,
37 and shoulders the important responsibility of water conservation and stabilizing the ecological
38 environment. The city's water supply is highly dependent on groundwater resources. Along with
39 climate change and economic growth, the amount of groundwater extracted has risen year after year,
40 but recharge has been limited, so that by 2023, the underground water supply will account for 68.41%
41 of the total water supply, with agriculture being the main source of water consumption, which will
42 account for 66.39% of the total(Jasechko and Perrone, 2021, Province, 2023). The non-sustainable
43 development of groundwater resources exposes them to problems such as restricted water circulation
44 and pollution of the natural water environment, which in turn threaten human health and industrial
45 development(Castellazzi et al., 2016). Therefore, elaborating the current status of groundwater
46 environmental pollution in the region and evaluating the health risk of residents' drinking water will
47 provide risk warning and scientific reference for maintaining the safety of drinking water for citizens
48 in the main urban area of Zhangjiakou and the stability of the overall water environment.

49 Nitrate pollution is a common problem in the groundwater environment, which faces problems such
50 as difficult to manage the contamination of water bodies and weak resistance of the water
51 environment to damage due to the hydraulic cycle flow characteristics of groundwater(Benes et al.,
52 1989). In recent years, the problem of groundwater nitrate pollution has become increasingly
53 prominent in North China, especially in rural areas where groundwater is used as a source of drinking
54 water(Hu et al., 2005). According to Gan et al(Gan et al., 2022), who studied the distribution, sources
55 and health risks of nitrate in groundwater in the northern plains of China, it is clear that intensive
56 groundwater mining has been identified as a key factor in exacerbating nitrate contamination, as the

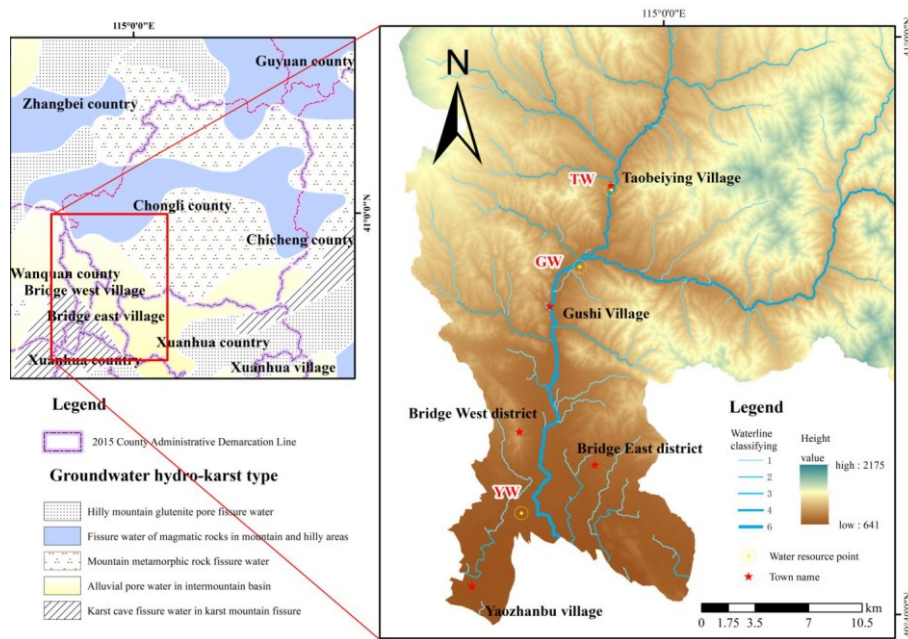
57 thicker envelope resulting from over-exploitation promotes the nitrification process. In addition,
58 Chen et al(Chen et al., 2010) clarified the significant impact of wastewater irrigation on groundwater
59 nitrate concentration levels based on analyzing the effects of land use changes and irrigation practices
60 on nitrate pollution in shallow groundwater. In summary, the changes of nitrate levels in groundwater
61 in North China are closely related to agricultural activities and groundwater resource management.
62 The undue attention to nitrate research stems from its harmful effects in the environment and in
63 humans. First of all, excessive intake of nitrate from drinking water combined with microorganisms
64 is converted into nitrite, which induces human methemoglobinemia, hypertension and cardiac system
65 diseases, and so on, seriously endangering human health(Ebdrup et al., 2022, Lin et al., 2023); in
66 addition, the excess of nitrate in the water will also be a burden on the carrying capacity of the aquatic
67 ecosystem, which will lead to the occurrence of eutrophication in the water body, resulting in an
68 imbalance of the aquatic ecosystem. Natural water bodies as a source of tap water, purification of
69 nitrate is difficult to remove, even in trace amounts, when repeated boiling when the conversion of
70 nitrite is able to pose a hazard to the human body(Hughes and Marion, 2021, Severe et al., 2023).
71 With the development and popularization of contemporary hygiene and metrology, the impact of
72 nitrate on human health has been quantified, thus this paper introduces the Human Health Risk
73 Assessment (HHRA) as a method for analyzing the health threat of nitrate.
74 Human health risk assessment is an important aspect of environmental and public health management
75 that aims to establish data linkages between human health and the ecosystem(Monosson, 1996). Since
76 long-term consumption of nitrate-contaminated groundwater can result in an elevated risk of certain
77 diseases, the U.S. Environmental Protection Agency (EPA) developed the Nitrate Indicator Health
78 Risk Determination (NIHRD) methodology, which combines oral (drinking intake) and dermal
79 exposure routes to determine the carcinogenic and non-carcinogenic health risk results of nitrate
80 contamination levels in local populations.
81 In order to investigate the environmental status of groundwater quality in the context of agricultural
82 activities in northern China, the main pollution indicators of the groundwater environment were

83 summarized, and on this basis, the analysis of the sources of pollution impact and health risk
84 assessment were carried out. In this paper, the source of underground drinking water in the main
85 urban area of Zhangjiakou is taken as the research object, the water quality indicators are standardized
86 by using the single-factor evaluation index, the main pollution contributing indicators and the
87 correlation of factors are calculated by using Principal Component Analysis (PCA), and the causes
88 of the changes in the concentration of the main pollutant indicators are discussed in terms of the land
89 use situation, etc., and the level of the impact of the pollution on the health risk of the local residents
90 is calculated in the end.

91 **2. Materials and methods**

92 *2.1. Subsection*

93 The study area is located in Zhangjiakou City in the northwestern part of Hebei Province, China, and
94 contains Chongli District and Zhangjiakou main urban area (Bridge-west district and Bridge-east
95 district), which are divided into three different zones according to the source of underground drinking
96 water, and the groundwater monitoring points are the Taobeiyong water source zone (TW, E114.92
97 N 40.89) and the Gushi water source zone (GW, E114.89 N 40.87) in the upstream Chongli District
98 and the Yaozhanbu water source zone (YW, E114.85 N 40.74) in Bridge-west district (Figure 1). The
99 groundwater in this area belongs to the subregion of pore and fissure groundwater resources in the
100 middle and upper reaches of the Yongding River basin, and the groundwater types of the underground
101 rock strata in Chongli are fissure water of mountain metamorphic rocks, fissure water of magmatic
102 rocks of mountains and hills, and near the downstream urban area, pore water of alluvial layers in the
103 intermountain basins, and fissure water of karst mountain fissures and caves, which is very much
104 associated with the distribution of the water types and the ancient crustal activities of the earth's
105 surface topography and the climate of the area is temperate continental monsoon. The regional climate
106 is temperate continental monsoon climate, located in the semi-arid and arid forest-steppe transition
107 zone, with cool and dry temperatures, and the surface elevation decreases from northeast to southwest,
108 which has led to the formation of a certain scale of cities in the southwest flat zone.



109

110 **Figure 1.** Distribution of elevation and surface river systems and karst types in the study area

111 *2.2. Data sources and research methods*

112 *2.2.1. Data sources*

113 Groundwater monitoring wells were collected once a month from January 2021 to November 2023.

114 Each sampling uses a high-density polyethylene bottle and glass bottle cleaned according to the

115 collection requirements to collect 500ml of groundwater, respectively, stored in a 4 °C environment,

116 waiting for detection. When collecting water samples, the TDS analyzer is used to directly determine

117 the detection value. Filter with 0.45 μm filter membrane before detection. Metrohm MIC Ion

118 Chromatograph (Switzerland) were used to analyze the concentrations of ammonium and nitrate,

119 chloride, fluoride, sulfate. The detection limits were 0.002 mg L⁻¹ and 0.15 mg L⁻¹, 0.15 mg L⁻¹, 0.1

120 mg L⁻¹, 0.75 mg L⁻¹, respectively. The oxygen consumption was detected by acidic potassium

121 permanganate titration, and the detection limit was 0.05 mg L⁻¹. The total hardness was also detected

122 by titration tube, and the minimum detection concentration was 1.0 mg L⁻¹. Iodide and nitrite nitrogen

123 were detected by spectrophotometry, and the detection limits were 0.001 mg L⁻¹. Sodium, copper,

124 manganese, zinc, aluminum and arsenic were determined by inductively coupled plasma emission

125 spectrometry. The detection limits were 6.36 μg L⁻¹, 0.08 μg L⁻¹, 0.12 μg L⁻¹, 0.67 μg L⁻¹, 1.15 μg

126 L⁻¹ and 0.12 μg L⁻¹, respectively. Radiation alpha and beta were measured by thick sample method

127 and thin sample method, and the detection limits were 0.016 Bq L⁻¹ and 0.028 Bq L⁻¹, respectively.
128 The above indexes were self-checked in the laboratory. Blank sample and parallel sample were
129 established, and the standard deviation value was less than 5 %.

130 China's multi-period land use/land cover data were produced by Esri in conjunction with Impact
131 Observatory and Microsoft's 10-meter-resolution satellite data based on Sentinel-2; atmospheric
132 rainfall, cultivated irrigated area, crop cultivation area, and livestock and poultry production data were
133 obtained from the 2015-2022 Hebei Statistical Yearbook.

134 2.2.2. Human health risk assessment

135 Human health risk assessment is used to quantitatively analyze the relationship between groundwater
136 quality and local human health risk, and to assess the likelihood of damage to human health caused
137 by exposure to chemical substances in a contaminated environment. Because groundwater
138 environments are relatively confined, contaminants relative to the human body are generally
139 considered only through two routes: oral and dermal absorption(Liu et al., 2021). In this study,
140 calculations were performed using a risk model developed by the EPA.

141 Dose of non-carcinogens ingested through drinking water:

$$142 \quad \text{CDI} = \frac{C_w \times \text{IR} \times \text{EF} \times \text{ED}}{\text{BW} \times \text{AT}} \quad (1)$$

$$143 \quad \text{HQ}_{\text{Oral}} = \frac{\text{CDI}}{\text{RfD}} \quad (2)$$

142 In:

143 CDI—Daily dose for chronic intake of drinking water ((mg kg⁻¹)d⁻¹);

144 C_w—Mass concentration of non-carcinogenic substances (mg L⁻¹);

145 IR—Daily human intake of drinking water (L d⁻¹);

146 EF—Exposure frequency (365d a⁻¹);

147 ED—Exposure time;

148 BW—Average human weight (kg);

- 149 AT—Mean time to produce non-carcinogenic effects (d);
- 150 HQ_{Oral}—Non-carcinogenic risk index for drinking water intake;
- 151 RfD—Reference dose of pollutant (RfD for nitrate is 1.6(mg kg⁻¹)d⁻¹).
- 152 Dose of non-carcinogens absorbed through the skin:

$$CDD = \frac{C_w \times K_i \times SA \times EF \times ED \times EV \times ET \times CF}{BW \times AT} \quad (3)$$

$$HQ_{Dermal} = \frac{CDD}{RfD} \quad (4)$$

$$HI_{Total} = \sum_{i=1}^n (HQ_{Oral} + HQ_{Dermal}) \quad (5)$$

- 153 In:
- 154 CDD—Daily dose for chronic absorption through the skin ((mg kg⁻¹)d⁻¹);
- 155 K_i—Skin permeability coefficient in water (cm h⁻¹);
- 156 SA—Average human skin surface area exposed to contaminated environment (cm²);
- 157 EV—Average bathing frequency, based on 1 bath per day;
- 158 ET—Average bathing time;
- 159 CF—Volume conversion factor (L (cm³)⁻¹);
- 160 HQ_{Dermal}—Non-carcinogenic risk index from dermal contact;
- 161 HI_{Total}—Total non-carcinogenic risk index;
- 162 N—Number of pollutants to be evaluated.
- 163 Carcinogenic risk through drinking water intake:

$$CR = CDI \times CSF \quad (6)$$

- 164 CR—Indicates cancer risk through oral intake;
- 165 CSF—Indicates carcinogenicity slope factor (1 × 10⁻⁵((mg kg⁻¹)d⁻¹)⁻¹).

166 In this study, only nitrate was used as a risk factor, and the number of pollutants to be evaluated was
 167 N = 1. The selection of parameters and the categorization of the target population for evaluation are
 168 shown in Table 1.

169 **Table 1.** Evaluation parameters of pollution for each target group

parameter	Infant (1 year old)	Children (average age 12 years)	Adult males (average age 30 years)	Adult females (average age 30 years)	reference source
IR	1	1.8	2.5	2.5	(USA.EPA, 1989, Han et al., 2021)
EF	365	365	365	365	(USA.EPA, 1989)
ED	1	12	30	30	(Wu and Sun, 2016)
BW	10	30	74	57	(Han et al., 2021, Institute of Sports Science, 2022)
AT	365	4380	10950	10950	-
RfD	1.6	1.6	1.6	1.6	(USA.EPA, 1989)
K _i	0.001	0.001	0.001	0.001	(Han et al., 2021)
SA	5000	12000	16000	15000	(China, 2019, Han et al., 2021)
EV	1	1	1	1	(Wu and Sun, 2016, China, 2019)
ET	0.5	0.2	0.3	0.5	(Han et al., 2021)
CF	0.001	0.001	0.001	0.001	(Liu et al., 2021, Han et al., 2021)

170 **3. Results**

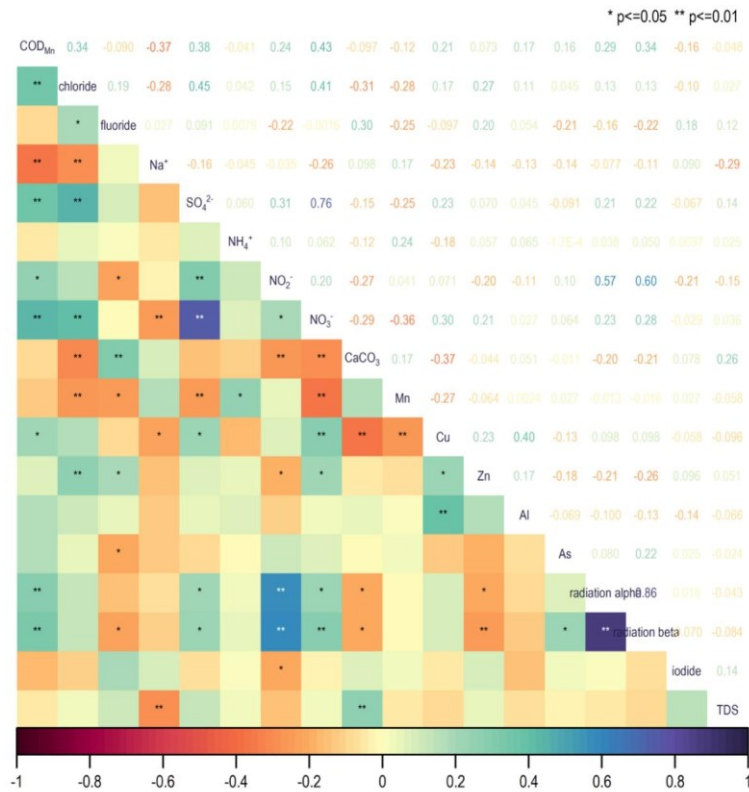
171 *3.1. Analysis of routine water quality indicators*

172 From the data of groundwater source monitoring points in Zhangjiakou from January 2021 to
 173 November 2023 (Table 2), it can be seen that the overall concentration level of oxygen consumption

174 in GW, TW, and YW areas is maintained at $0.75\pm 0.28 \text{ mg L}^{-1}$, the concentration level of total hardness
175 (in terms of CaCO_3) is $349.29\pm 16.70 \text{ mg L}^{-1}$, the concentration of total dissolved solids (TDS) is
176 maintained at $472.63\pm 74.23 \text{ mg L}^{-1}$, reducing organic matter in GW and TW at a higher level, total
177 hardness is the opposite, in the southern part of the city's groundwater belongs to the low-
178 mineralization water, low salinity; water source monitoring indicators of halide to chloride (Cl^-) as
179 the main body of the overall concentration of $36.84\pm 7.78 \text{ mg L}^{-1}$, and sodium ions (Na^+) to maintain
180 at the same level of concentration; sulfate (SO_4^{2-}) like substances concentration of $73.12\pm 15.19 \text{ mg}$
181 L^{-1} , nitrate (NO_3^-) in the inorganic nitrogen class occupies 97.53%~99.93% of the overall, nitrite
182 (NO_2^-) and ammonia nitrogen (NH_4^+) in the water source concentration level is almost the same, and
183 NO_3^- concentration in TW is significantly higher than the level of other monitoring water sources;
184 metal elements and arsenic elemental content is maintained at the same level, zinc (Zn), aluminum
185 (Al) concentration is higher, respectively, for $0.0046\pm 0.0072 \text{ mg L}^{-1}$ and $0.0030\pm 0.0051 \text{ mg L}^{-1}$, and
186 the average concentrations of copper (Cu), zinc, aluminum, and arsenic (As) elements in groundwater
187 north of the city are higher than those south of the city; the drinking water source radiation
188 measurements are all kept below the guideline values, but with a greater degree of dispersion. GW
189 and TW are involved in a relatively close range, and the data bases and trends of changes in the
190 monitoring are somewhat similar, and they are subjected to anthropogenic activities. Strongly
191 influenced by anthropogenic activities, YW has low concentrations of organic and dissolved
192 substances, high total hardness, and is more deeply influenced by dissolution of natural subsurface
193 rock formations.

194 Figure 2 shows the correlations between the water quality indicators, and the significance of most of
195 the correlation indicators meets the probability limit of $p \leq 0.01$ and 0.05 , which is statistically
196 significant. Among them, radiation alpha and radiation beta are highly significant correlation, the
197 correlation coefficient is 0.86, positively promote each other, and at the same time radioactive
198 substances and NO_2^- also have highly significant positive correlation, along with the increase of NO_2^-
199 concentration level, the release of radioactive substances increased; Secondly, there is a highly

200 significant positive correlation between SO_4^{2-} and NO_3^- , the correlation coefficient is 0.76, the two
 201 have a very close correlation; NO_3^- and manganese (Mn), total hardness and Cu, but the correlations
 202 were low, with correlation coefficients less than 0.4.



203

204

Figure 2. Heat map of significant correlations of water chemistry indicator data

205

Table 2. Statistics on groundwater quality indicators in the monitoring area

norm	items	GW	TW	YW	the total
COD _{Mn}	Mean/SD	0.83±0.20	0.85±0.17	0.56±0.33	0.75±0.28
CaCO ₃	Mean/SD	345.09±16.91	347.94±14.98	354.83±16.61	349.29±16.70
TDS	Mean/SD	477.57±83.12	476.51±67.44	463.8±70.32	472.63±74.23
Cl ⁻	Mean/SD	41.01±5.75	38.22±8.83	31.30±4.56	36.84±7.78
F ⁻	Mean/SD	0.71±0.14	0.67±0.11	0.61±0.08	0.67±0.12
I ⁻	Mean/SD	0.003±0.004	0.004±0.005	0.005±0.005	0.004±0.005
Na ⁺	Mean/SD	34.41±7.86	33.86±7.21	43.57±9.03	37.28±9.21
SO ₄ ²⁻	Mean/SD	76.55±13.19	80.16±17.85	62.67±5.40	73.12±15.19
NH ₄ ⁺	Mean/SD	0.019±0.027	0.019±0.030	0.019±0.028	0.019±0.029
NO ₂ ⁻	Mean/SD	0.0020±0.0031	0.0020±0.0031	0.0020±0.0031	0.0020±0.0031
NO ₃ ⁻	Mean/SD	10.97±2.84	12.13±2.55	7.55±1.27	10.22±3.03
Mn	Mean/SD	0.0006±0.0009	0.0008±0.0010	0.0024±0.0020	0.0012±0.0016
Cu	Mean/SD	0.0014±0.0007	0.0013±0.0005	0.0009±0.0004	0.0012±0.0006
Zn	Mean/SD	0.0053±0.0073	0.0063±0.0081	0.0022±0.0050	0.0046±0.0072
Al	Mean/SD	0.0045±0.0068	0.0032±0.0047	0.0014±0.0017	0.0030±0.0051
As	Mean/SD	0.0007±0.0006	0.0010±0.0005	0.0009/0.0006	0.0009±0.0006
radiation alpha	Mean/SD	0.073±0.110	0.058±0.082	0.048±0.065	0.060±0.089
radiation beta	Mean/SD	0.076±0.090	0.069±0.062	0.054±0.062	0.067±0.073

206 3.2. Analysis of major groundwater contamination indicators

207 Since different water quality indicators have different concentration limits that cause harm to human
208 beings, each country has limited different indicator limits in combination with multiple conditions
209 and uses. According to the drinking function of groundwater in the study area, the Class III standard
210 in China's *Groundwater Quality Standard (GB/T 14848-2017)* and the *Hygienic Standard for*
211 *Drinking Water for Daily Life (GB 5749-2022)* were adopted as the unification conditions for the
212 indicators, respectively, so as to eliminate the differences in the concentrations of different quantities,
213 and the processed data were brought into the box-and-line diagrams for analysis.

214 Harmonized formulae refer to single-factor pollution indices for water quality evaluation P_i :

$$P_i = C_i / S_i \quad (7)$$

215 In: C_i is the measured concentration of the i th water quality indicator (mg L^{-1}); S_i is the evaluation
216 standard of the i th water quality indicator (mg L^{-1}).

217 As can be seen from **Error! Reference source not found.**, the indicators under the Class III standard
218 in the *Groundwater Quality Standard (GB/T 14848-2017)* are all less than 1, while only nitrate
219 appears to be greater than 1 under the Health Standard for *Hygienic Standard for Drinking Water for*
220 *Daily Life (GB 5749-2022)* as the standard, which indicates that only NO_3^- appears to be more than
221 the drinking water hygiene standard under the two standards, and the other indicators are all under
222 the concentration range specified by the target water function. This indicates that under the two
223 standards, only NO_3^- exceeds the drinking water health standard, while the other indicators are in the
224 concentration range specified by the target water use function, and NO_3^- has appeared in the
225 groundwater of Zhangjiakou City, which affects the normal use of drinking water. Besides, nitrate
226 has the widest interquartile range and no outliers, so the results are good.

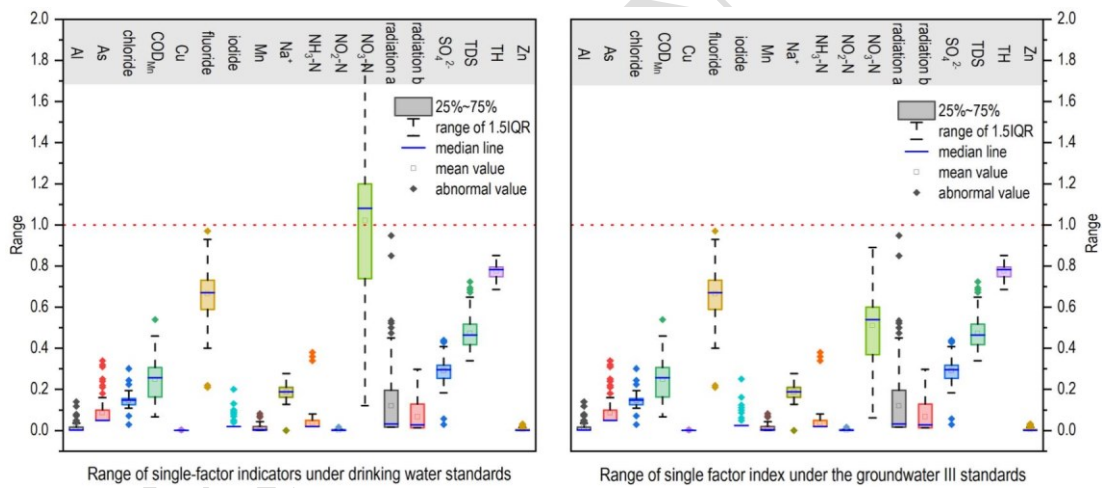
227 Using SPSS 25 for PCA calculation, the KMO value of the 18 indicators involved in the calculation
228 was 0.6, Bartlett's spherical test $P < 0.001$, and the correlation matrix conformed to the normal
229 distribution, which fulfilled the pre-calculation requirements. The eigenvalue mapping and ellipse
230 confidence were shown in **Error! Reference source not found.**(a). The top two main influencing

231 factors from groundwater pollution were 20.5% and 14.0% contribution rate respectively, in which
232 NO_3^- had the highest correlation with Factor 1 and was positively correlated; SO_4^{2-} and NO_3^- indicator
233 eigenvalues tended to converge, and the enhancement of Factor 1 sources would promote the
234 elevation of SO_4^{2-} , NO_3^- , COD_{Mn} , and Cl^- concentrations; Zn showed the main positive correlation
235 in Factor 2, followed by radioactive substances showed negative correlation, in which the
236 downscaling tendency of NO_2^- almost overlapped with radioactive substances with high correlation.
237 The data downscaled elliptic confidence intervals of GW and TW overlap to a high degree, and the
238 TW confidence interval is contained within the GW interval. There are some similarities in
239 groundwater chemistry types and pollution sources between the two places, and the downscaled
240 projection of YW indicators is more concentrated, forming two different systems with TW and GW
241 groundwater environments.

242 Principal components extracted from the two-dimensional data projection formed in the ellipse
243 confidence, choose the Kaiser normalized maximum variance method for the rotation of the
244 component matrix, and converge after nine iterations, to get the rotated component matrix in **Error!**
245 **Reference source not found..** The maximum correlation index of the highest contributing principal
246 component, factor 1, was nitrate with a correlation coefficient of 0.808, followed by positive
247 correlations of 0.795 for SO_4^{2-} and 0.738 for Cl^- , and an increase in the source of factor 1 leads to an
248 increase in the concentration of salts, and the preliminary type of the factor 1 source was residential
249 sewage or inputs from inorganic fertilizers in agriculture; Indicators closely related to the source of
250 factor 2 are radioactive substances, which show positive correlation, NO_2^- shows a correlation of 0.72
251 in factor 2, which comes from radionuclide decay in the natural environment; Al and Cu are the main
252 correlation indicators of factor 3; the top three component factors occupy 39.301% of the total
253 variance after rotation, and based on the eigenvalues, the top seven screening factors selected greater
254 than 1, the occupied 69.843% of the total variance.

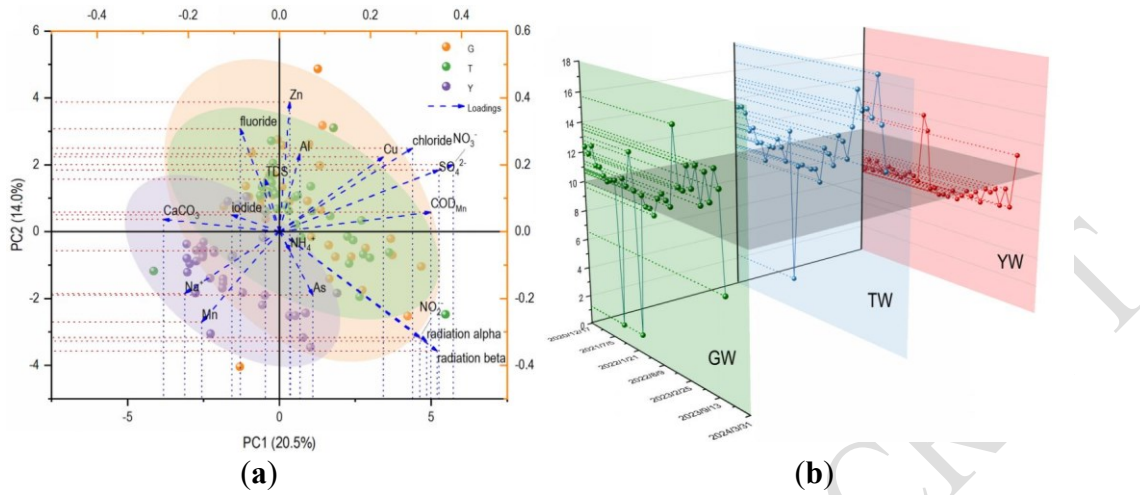
255 Comprehensive single-factor indicator range distribution and PCA factor analysis results show that
256 the increase in nitrate concentration is the main cause of pollution of underground drinking water

257 sources in Zhangjiakou City, and the correlation indicators of SO_4^{2-} and Cl^- among the maximum
 258 pollution factors did not appear to exceed the limiting standards in the actual measurement. Combined
 259 with the monthly trend of NO_3^- concentration from 2021 to 2023 (**Error! Reference source not**
 260 **found.**(b)), the overall fluctuating upward trend of NO_3^- concentration in GW and TW, except for
 261 some months the NO_3^- concentration in drinking water sources north of the city exceeded the limit
 262 value of drinking water health standards. The degree of concentration variability was higher in TW
 263 than in GW, and the NO_3^- concentration in YW remained stable between 6 mg L^{-1} and 8 mg L^{-1} for
 264 most of the time, with the lowest level of contamination. Overall, TW showed obvious water quality
 265 problems, and the exceedance of NO_3^- concentration was the main manifestation of pollution
 266 problems in this shallow groundwater, and there was a trend of superimposed increase in NO_3^-
 267 concentration in the groundwater with the increase of time.



268 (a) Range of single-factor indicators under drinking water standards (b) Range of single factor index under the groundwater III standards

269 **Figure 3.** Box plots for each indicator based on the results of single factor calculations for (a) drinking
 270 water standards and (b) groundwater class III standards



271 **Figure 4.** (a) Indicator factor fits and confidence intervals for principal component analysis and (b)
 272 changes in monthly nitrate indicator concentrations in water sources

273 **Table 3.** Rotated component matrix

norm	Faction 1	Faction 2	Faction 3	Faction 4	Faction 5	Faction 6	Faction 7
F ⁻	0.282	-0.226	-0.043	0.493	-0.485	-0.091	0.138
Na ⁺	-0.341	-0.004	-0.363	-0.204	-0.605	-0.007	-0.085
SO ₄ ²⁻	0.795	0.244	0.022	0.080	-0.110	0.001	-0.073
NH ₄ ⁺	0.142	0.013	-0.043	-0.049	-0.017	0.859	0.052
NO ₂ ⁻	0.187	0.720	-0.086	-0.200	-0.008	0.131	-0.228
NO ₃ ⁻	0.808	0.183	0.062	-0.114	0.090	-0.056	0.059
CaCO ₃	-0.305	-0.117	-0.053	0.815	-0.109	-0.035	-0.118
Mn	-0.502	0.097	0.028	0.046	0.036	0.632	-0.073
Cu	0.204	0.090	0.714	-0.363	-0.016	-0.313	0.131
Zn	0.329	-0.379	0.394	-0.059	-0.118	0.183	0.302
Al	-0.014	-0.097	0.800	0.085	-0.065	0.083	-0.233
As	-0.035	0.075	-0.250	-0.050	0.733	-0.022	-0.060
radiation alpha	0.102	0.917	0.026	-0.035	0.020	-0.001	0.124

radiation beta	0.124	0.906	-0.026	-0.074	0.151	-0.009	0.018
I ⁻	-0.100	-0.007	-0.102	0.089	-0.065	-0.002	0.856
TDS	0.131	-0.066	0.002	0.618	0.258	0.033	0.344
Cl ⁻	0.738	-0.013	0.088	-0.072	0.063	0.042	-0.059
COD _{Mn}	0.443	0.314	0.301	0.100	0.342	-0.051	-0.254

274 *3.3. Analysis of the causes of changes in nitrate concentrations*

275 Most studies have shown that synthetic fertilizers, livestock manure, domestic and industrial
276 wastewater, atmospheric deposition, natural organic matter of soil, septic tanks and landfills are the
277 main sources of nitrate pollution (McLay et al., 2001, Gutiérrez et al., 2018, Gan, 2023). Zhangjiakou,
278 as a typical city focusing on primary industry economy, the study area has frequent agricultural
279 farming activities, the water surface is covered with a large area of facility farmland, and the
280 utilization of land is crucial to the impact of groundwater environmental pollution. The common
281 dissolved nonpoint source pollution in agricultural watersheds includes two major sources,
282 anthropogenic and natural, and the lost part of the natural source is not a pollutant in the strict sense,
283 but the tracing of the pollution source inevitably needs to determine the contribution of the natural
284 source (Nie, 2016).

285 The anthropogenic sources of pollution in the study area include fertilizer and drug application losses
286 from crops, leakage of manure wastewater from livestock and poultry farming, and rural and urban
287 domestic sewage discharges, while the natural sources include atmospheric precipitation, natural
288 organic matter of the soil, inputs, runoffs, and outputs of terrestrial sources such as subsurface karst
289 and other substances in the groundwater system, as well as physiological survival of plants, animals,
290 and microorganisms. In the following, we will analyze the reasons affecting the level of nitrate
291 concentration in groundwater from the aspects of land use, precipitation changes and agricultural
292 activities.

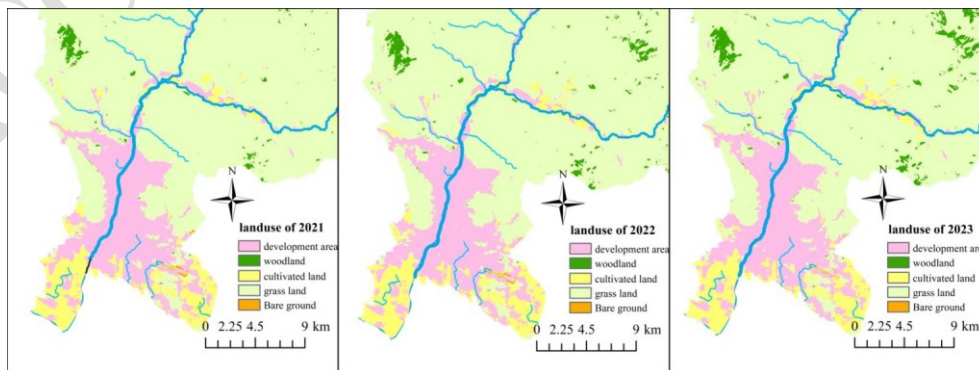
293 *3.3.1. Impact of land use status and migration on nitrate pollution*

294 According to Figure 5, it can be seen that the upper part of the main urban area has grassland as the
295 main land use type, and the cultivated area is distributed in the flat beaches along both sides of the
296 river, and the urban settlements are scattered, sparsely populated, and have not formed a large-scale
297 city; Bridge-west district and Bridge-east district have built-up areas and grassland as the main land
298 use types, followed by cultivated land distributed in the lower part of the city. Forest land is small
299 and concentrated in the northwest corner away from urban agglomerations. TW, GW and YW land
300 cover types are very different.

301 The buffer zones of 300 m, 500 m, 800 m, 1000 m, and 1200 m distance were divided respectively
302 with the monitoring point as the center, and the land use transfer matrix of the buffer zones in 2021-
303 2022-2023 was established (Figure 5). The land types of the buffer zones from 300 m to 1000 m in
304 TW were built-up area and grassland, and with the increase of buffer area, the percentage of built-up
305 area was gradually decreasing and grassland becomes the main land use type in the area with simple
306 land use transfer. Grassland accounts for the largest proportion of land use in the vicinity of GW, and
307 the proportion of built-up area and cropland area gradually increases with the increase of buffer
308 distance, and there is a mutual transfer of the utilization of grassland and cropland, and on the whole,
309 the area of cropland shows a significant increase with the change of time, and the use of grassland for
310 clearing the land is the main source of its contribution. the area of built-up area of YW occupies an
311 absolute dominant position in the buffer zones of different distances , the share of watershed is
312 decreasing in the growing buffer area, the growth and utilization matrix of grassland type changes
313 significantly below 800 m distance, a significant urban expansion occurs in 2022, erosion of grassland
314 area, between 800 m, 1000 m, and 1200 m distance buffer ranges, cropland becomes a secondary land
315 use type other than built-up area, and the land use transfer situation is complex.

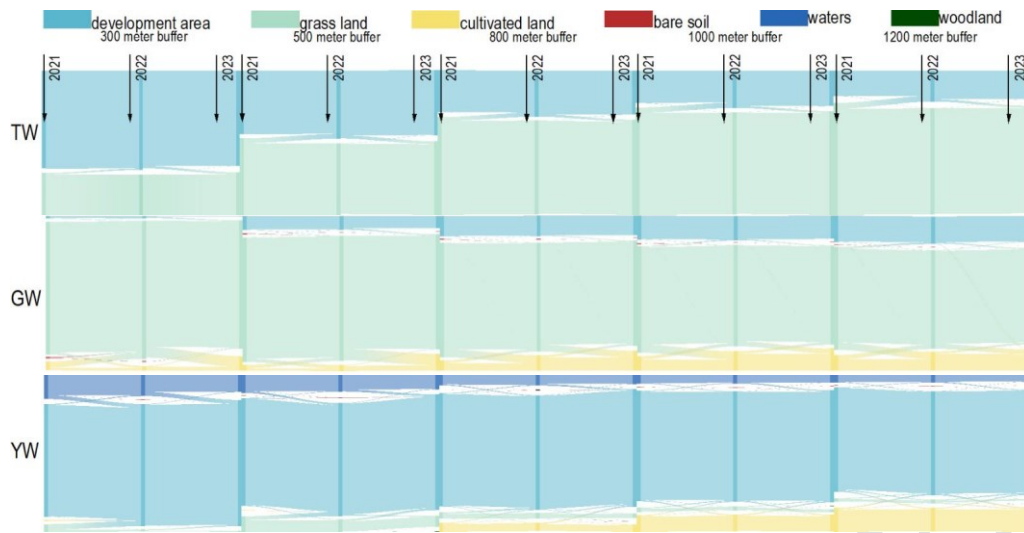
316 The urbanization of the study area deepens year by year, and the town land starts to spread to the
317 surrounding, the degradation of the grassland is affected by the cultivated land clearing and urban
318 expansion, the water collection area of the study is less affected by the mountain forest cover, the
319 forest land has been in a low development and high protection use state, and the agricultural

320 cultivation area is still increasing. The TW and GW collection areas upstream of the urban area are
321 mainly influenced by grassland, with simple land use composition, clear and simple matrix changes,
322 and low and flat terrain; the main land use type of the downstream YW collection area is construction
323 area, which is little influenced by land cover with high soil permeability coefficient such as grassland
324 cropland, and the terrain is higher and subject to hydraulic impacts from the upper reaches and hills
325 on the two sides. Changes in the proportion of land use types are closely related to local agricultural
326 and economic development, climatic conditions, urban planning and other environmental policies.
327 Combined with the contamination level of nitrate in different areas, the low concentration level of
328 nitrate indicator in YW groundwater may be related to the high degree of land hardening in the
329 construction area, the small permeability coefficient of the soil, and the slow rate of contamination
330 input from human activities, and in the YW and TW areas, which are dominated by grass, the nitrate
331 level of the groundwater is high, and there is a prolonged period of exceeding the standard, and the
332 high-frequency contamination from the nearby areas of human agricultural activities aggregation and
333 pollution transformation products from the natural environment seeped into the groundwater through
334 the loose soil. According to Xu et al.'s study on the water quality of surface rivers in Zhangjiakou
335 urban area(Xu et al., 2023), the overall concentration of total nitrogen in surface water averaged 5.87
336 mg L⁻¹, and the nitrogen pollution of groundwater was rather more serious than that of the surface, and
337 the inputs of nitrate from surface water to groundwater were almost small, and the pollution mainly
338 entered the groundwater system through soil.



340 **Figure 5.** Land use types in the study area, 2021, 2022, 2023

341



342 **Figure 6.** Land use migration in the last three years under 300m, 500m, 800m, 1000m, 1200m buffer

343 diameters for TW, GW, YW

344 3.3.2. Effect of precipitation on nitrate pollution

345 Soil infiltration and surface water replenishment and discharge are closely related to atmospheric
 346 precipitation, which is the main source of replenishment of local groundwater resources. The
 347 groundwater level in the study area is controlled by precipitation, and the water level drops to the
 348 lowest value in December, and the highest value of the water level of the whole year can generally
 349 be reached in August to September (Chen, 2020). The statistical yearbook data shows that the average
 350 annual precipitation in 2022 and 2023 is 378.2 mm, which is in the dry year and mostly concentrated
 351 in June to September in the form of showers, with poor groundwater recharge conditions. The study
 352 area is the demarcation zone between semi-arid and semi-humid, and the demarcation zone between
 353 forest vegetation and grassland vegetation.

354 The hydrodynamic forces generated by atmospheric rainfall drive the transport of soil nitrogen into
 355 the groundwater environment through infiltration and runoff. Many studies have shown that in
 356 forested watersheds with low precipitation, the soil retains most of the rainwater, resulting in
 357 nitrification reactions that increase the NO_3^- content of the soil water, which ultimately enters the
 358 groundwater body through leaching and infiltration (Phillips and Koch, 2002, Kumar et al., 2004,
 359 Pardo et al., 2004). For vegetable agriculture planting areas, sustained heavy rainfall will elute the
 360 remaining NH_4^+ in the air-packed zone, and nitrification produces more NO_3^- into the shallow

361 groundwater, and isotope traceability shows that the proportion of NO_3^- in the shallow groundwater
362 during periods of heavy precipitation from manure increases, and the proportion of NO_3^- from soil
363 organic nitrogen decreases (Chen et al., 2023). After linear fitting, precipitation and groundwater
364 nitrate concentration showed a poor negative linear relationship, which may be due to the sudden
365 precipitation situation to increase the amount of surface water, and the different sources of the
366 combined effect of supplemental dilution strengthened, accelerated the rate of circulation of
367 underground and surface water bodies, and improved the environmental conditions of groundwater.
368 Moreover, according to the field research, surface farming in the study area is dominated by facility
369 farmland, and the agricultural greenhouses and mulch erected for cash crops affect the infiltration of
370 precipitation into the soil and soil water migration.

371 *3.3.3. Impact of agricultural activities on nitrate pollution*

372 Based on the statistical yearbook data from 2015 to 2022 that the area under crop cultivation rises
373 slowly after 2021, which is consistent with the annual change in the area of land use type of arable
374 land, and cereals and vegetables are the main types of cultivated plants; the amount of agricultural
375 fertilizers applied decreases and stays at 129,000 tons after reaching a peak in 2018 and 2019, and
376 the amount of fertilizers per unit of arable land decreases from 2021 to 2022; the local area is mainly
377 dominated by cattle as the large livestock farming, livestock farming volume is in a trough between
378 2017 and 2020, and has rebounded in the past two years. Influenced by the type of surface cover,
379 agricultural activities are still one of the main influencing factors for the change of pollutant
380 concentration in the water collection area. The microbial life activities under different precipitation
381 seasons, types of cultivated crops, livestock and poultry activities, selection and regulation of
382 fertilizer application, as well as different soil temperatures, humidity, and acidity and alkalinity
383 differed. According to Duan's study (Duan et al., 2023), the main sources of nitrate pollution in surface
384 water of the lower Wei River and groundwater in the river floodplain, alluvial plain and loess plateau
385 areas were livestock and poultry manure and domestic sewage (32.6 %), animal manure and domestic
386 sewage (43.7 %), animal manure and domestic sewage (59.1 %), and atmospheric deposition (55.5

387 %) respectively. Nitrate from agricultural activities is transported to surface or groundwater systems
388 through, for example, soil leaching. Identification of the source of nitrate in soil filtrate under
389 conditions that limit microbial transformations revealed that 18% to 41% of nitrate originated from
390 rainfall, 38% to 57% from mineralization of soil organic matter in the rhizosphere of non-leguminous
391 plants, and 18% to 40% of nitrate originated from mineralization of soil organic matter in the
392 rhizosphere of leguminous plants(Oelmann et al., 2007). Using water chemistry methods and
393 environmental isotope techniques, the analysis of shallow groundwater of different land use types in
394 Wanzhou District, Chongqing shows that nitrate in shallow groundwater of arable land mainly comes
395 from chemical fertilizers (36.3%), sewage manure (35.4%) and soil organic nitrogen (24.7%), and
396 that the sources of nitrate in shallow groundwater of the study area are dominated by chemical
397 fertilizers and sewage manure as a whole(Fan et al., 2023). In general, the sources of nitrate pollution
398 in the context of agricultural activities are closely related to the application of agricultural fertilizers,
399 the treatment of livestock and poultry manure, the discharge of rural sewage, and the organic
400 mineralization of soil.

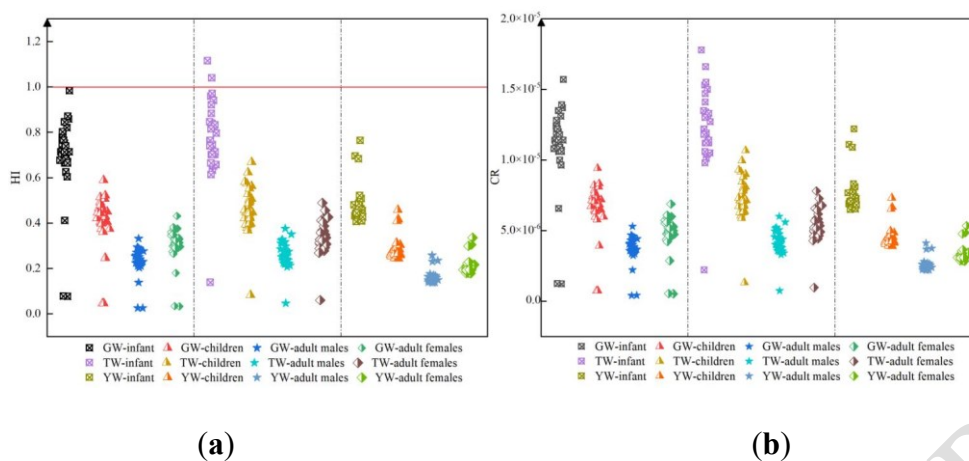
401 *3.4. Human health risk assessment*

402 According to the EPA's health risk assessment standards, when $HI_{Total} < 1$, the non-carcinogenic
403 health risk of pollutants to human beings is acceptable, the pollutant does not cause significant
404 damage to humans; when $HI_{Total} > 1$, it indicates that the non-carcinogenic risk caused by the
405 pollutant has exceeded the acceptable level, and that the non-carcinogenic health risk increases with
406 the increase of HI_{Total} , and there is a increasing trend(Feng et al., 2020). According to the calculation
407 results in 0(a), it can be seen that the non-carcinogenic health risk of nitrate contamination of
408 groundwater as a source of drinking water is not high. In the vicinity of GW and YW, monthly
409 samples of infants, children, adult males, and adult females meet the standard; only in TW, there is a
410 non-carcinogenic health risk of nitrate contamination for infants that exceeds the acceptable level,
411 which is 1.04 (May) and 1.12 (September) in 2023, respectively. The non-carcinogenic health risk
412 due to nitrate groundwater contamination in GW and TW is low for children, adult males, and adult

413 females, but cannot be ignored for newborns, and there is a high likelihood that this non-carcinogenic
414 risk will continue to increase based on the trend of contaminant growth from year to year. And
415 according to the conclusion of Jane et al (Lin et al., 2023), it is known that low and medium
416 concentrations of nitrates in drinking water may increase the risk of preterm birth, some specific
417 congenital malformations.

418 The carcinogenic risk CR value is in the range of $1 \times 10^{-6} \sim 1 \times 10^{-4}$, the risk of occurrence is at an
419 acceptable level; if $CR > 1 \times 10^{-4}$, the carcinogenic risk exceeds the maximum acceptable level
420 (Jiang et al., 2017). According to Figure 7(b), the carcinogenic risk values of the study subjects were
421 in the range of acceptable levels, with zero exceedance and very low risk values.

422 Although exceedances of the nitrate standard occurred in the GW and TW, the pollution level was
423 low, the health risk evaluation value for the local residents was low, and the majority of the residents
424 were given a non-carcinogenic risk and a low level of carcinogenic risk, but for newborn babies, the
425 low concentration of nitrate can still cause physiological adverse effects for this group. Combining
426 the land use and temporal node characteristics of the high-risk samples, TW is located in the lower
427 reaches of the Qingshui River Basin in Chongli District, where the land cover is dominated by
428 grasslands, and more clustered villages are distributed along the arable land and around the river, and
429 after a field visit, it was found that the ground surface is covered with a large area of agricultural land
430 dominated by large greenhouse cash crops, such as maize and colorful peppers, and that the roots of
431 non-soybean crops play a stronger role in mineralization of nitrogen in the soil, the Rural domestic
432 sewage, greenhouse plastic film, agricultural inorganic synthetic wastes, and livestock manure play a
433 co-influence on the growth of local groundwater nitrate concentrations. The months when the risk
434 value exceeded the standard coincided with the beginning and the end of the cultivation period.
435 Frequent agricultural activities and the wet and warm climate increased the nitrogen load in the soil
436 and accelerated the rate of recycling and seepage of nitrogen accumulated in the soil in the previous
437 period, which led to a sudden increase in the nitrate concentration in the groundwater.



438

439 **Figure 7.** (a) Evaluation results of non-carcinogenic health risks and (b) carcinogenic risks for different
 440 groups of local residents

441 **4. Discussion**

442 Contaminants generally enter the groundwater system through the soil. It is inferred that nitrate
 443 contamination is more influenced by rural human activities, livestock farming, and cultivation from
 444 grasslands and nearby than from municipal domestic sewage and industrial water from more
 445 urbanized built-up areas, and that the state of the soil will control nitrate inputs. Nitrate has relatively
 446 low pollution concentrations, and is characterized by non-overlap in time with traditionally indicated
 447 sources such as: flood season and periods of high agricultural activity. The reason for this may be due
 448 to the retention properties of the soil, which can trap pollutants from the surface, e.g. the
 449 transformation of some organic nitrogen species in the soil requires the involvement of
 450 microorganisms, however, the longer winters keep microbial activity depressed for a long period of
 451 time. According to Llovet et al.(Margalef Marti et al., 2021)' s study of soil extracts after the
 452 application of pig slurry, it is known that soil mineralization and migration of contaminants by
 453 percolation to groundwater requires time for migration.

454 Combined with the results of the HHRA, the risk of disease from underground drinking water is
 455 higher for people living in non-urban areas. Under the current known conditions, the downstream
 456 drinking water in the main urban area has a pre-treatment process, but the nitrate removal efficiency
 457 does not reach the desired level, which is due to the adjustment of the national limit values for

458 drinking water and the time difference between the upgrading of the process in the water plant; the
459 upstream water source point pollution problem is more serious, and the groundwater as a source of
460 drinking water directly into the villagers' homes, there is no centralized treatment, and the use of
461 groundwater in the form of villages as a unit, it is It is difficult to manage it as a whole. The study
462 area suffers from unsupported urban water supply, lack of rural water supply facilities, and
463 unbalanced development of regional water supply. Rural areas should receive more attention as a
464 vulnerable area in terms of resource tilting and water pollution damage, and it is also a key part of the
465 problem for the region to build a sustainable city with a healthy balance of clean water sources and
466 water resource control.

467 **5. Conclusions**

468 The groundwater in TW and GW is more deeply affected by human activities than in YW, forming
469 Ca-HCO₃ type high salinity and low hardness water quality, and there is a significant correlation
470 between some of the water quality indexes; only the nitrate indexes exceeded the drinking water
471 functional limit in TW and GW, which is also the main pollution problem faced by the groundwater
472 of the whole region, and the nitrate concentration of the groundwater had a tendency to increase with
473 the time scale. The cause of the change in nitrate concentration from the land use aspect can be
474 considered as the land use type with better soil permeability, low hardening of road surface and
475 frequent human agricultural activities such as grassland and nearby human rural activities have a
476 higher impact on the pollution compared to the urban built-up areas. Moreover, pollutants mainly
477 enter the groundwater system through the soil, and there is a certain delay in the outbreak of pollution
478 concentration, and precipitation will dilute and purify the quality of groundwater. In the face of the
479 emergence of nitrate contamination of underground drinking water sources, only newborns in the
480 vicinity of TW will be threatened by the non-carcinogenic risk of nitrate, but due to the existence of
481 an increasing trend of nitrate concentration in the upstream water sources of the urban area, the non-
482 carcinogenic health risk will correspondingly appear to be synchronously elevated.

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