

Groundwater Fluoride Contamination and Probabilistic Health-risk Assessment in Fluoride Endemic Areas of the Lower Satluj Basin, Punjab, India

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1 **Groundwater fluoride contamination and probabilistic health-risk assessment in fluoride endemic**
2 **areas of the Lower Satluj Basin, Punjab, India**

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8 **Abstract**

9 Groundwater fluoride contamination in some parts of the study region was long recognized as a water
10 quality issue. The results of WQI showed that 85% and 15% of sampling sites fall within the class of “good”
11 and “poor” quality, respectively. Non-carcinogenic health risk (NCHR) assessment (using Hazard quotient
12 (HQ)), and sensitivity analysis for three age groups were also carried out using the Monte Carlo simulation
13 technique. The estimated levels of HQ_{oral} were greater in magnitude than those estimated from HQ_{dermal},
14 thus the main source for fluoride toxicity is oral ingestion. Amongst the three age groups studied, children
15 >female >male were found to be more prone to NCHR with HQ_{oral} ranging from (0.13-5.45), (0.07-2.97),
16 and (0.06-2.51), respectively. Sensitivity analyses indicated that fluoride concentration, ingestion rate,
17 shower exposure time, and fractional skin contact with water were the most relevant variables in the model
18 to reduce the potential health effect.

19 **Keywords:** Dermal absorption; Endemic; Fluoride; Health risk; Oral ingestion

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25 **Highlights**

- 26 1. No studies in the region deal with fluoride contamination and its assessment of
27 human health risks.
- 28 2. The WQI of 15% of the sampling locations have fluoride above acceptable limits
29 (>1.5 mg/L) and falls under “poor” water class.
- 30 3. Deterministic risk assessment of fluoride exposure was carried out for three age
31 groups (HQ_{Fluoride}: children>female>male).
- 32 4. Based on the sensitivity analysis, fluoride concentrations, daily ingestion rate,
33 fractional surface skin contact with water, and shower exposure time were the
34 most relevant parameters.
- 35 5. Public education and understanding of the impact of water quality and fluorosis
36 on human health should be high.

37

38 **Introduction**

39 Groundwater is the world's most valuable resource and plays a key role in socio-economic
40 development. Due to less rainfall and shortage of surface water supplies, significant areas of rural
41 communities, particularly in semi-arid regions, rely on this source for drinking, irrigation, and industrial
42 purposes. In the last few decades, it is constantly being over-exploited and contaminated by the rapid
43 increase in anthropogenic activity in the agricultural and industrial sectors (Chaudhry *et al.* 2019). Geogenic
44 activities also result in groundwater contamination. Groundwater contaminants cover a broad range of
45 physical, chemical (organic and inorganic), radioactive, and bacteriological parameters. When
46 contaminated, groundwater remains in an unusable state for quite a long time or even for centuries. So, the
47 concerns of groundwater contamination have gained the attention of social activists and researchers
48 worldwide.

49 Recently high fluoride contamination in groundwater is becoming a major global issue and has been
50 reported from various parts of the world (Kundu and Mandal 2009; Edmunds and Smedley 2013). Natural
51 groundwater concentrations of fluoride are documented to be high (>30 mg/L) in more than 30 countries,
52 including India (Ahada and Suthar 2019). Over 0.2 billion people use fluoride-concentrated drinking water
53 having concentrations above the acceptable limits (>1.5 mg/L as per World Health Organization (WHO))
54 in over 20 industrialized and developing countries including India (WHO 2004; Amini *et al.* 2008;

55 Vithanage and Bhattacharya 2015). Around 80 percent of the world's diseases are due to poor drinking
56 water quality, 65 percent of which are due to endemic fluorosis (Brindha and Elango 2011; Ali *et al.* 2016).
57 Geogenic processes such as rock-water interaction, the accumulation of volcanic particles in the
58 atmosphere, leaching of fluoride-bearing minerals, and marine aerosols often add fluoride to the
59 groundwater (Gleeson *et al.* 2012; Karunanidhi *et al.* 2020). Major anthropogenic processes [Figure 1S]
60 include climate change, irrigation of dry land without sufficient drainage, increase in the use of phosphate
61 fertilizer, animal manures, domestic and industrial wastewater discharge on the surface, automobile exhaust
62 increase the fluoride contamination in groundwater (Genxu and Guodong 2001). Fluoride's effects on
63 human health, however, are not immediate but chronic, so long-term exposures to high doses of fluoride
64 are obligatory (Jia *et al.* 2019). The key routes of human ingestion of fluoride are fluoride-containing
65 groundwater used for drinking purposes, food compounds, and toothpaste (Das *et al.* 2020). Fluoride can
66 be absorbed from the gastrointestinal tract after ingestion, following inhalation, and through the skin.
67 Inhalation and skin/dermal absorption can be important for some occupational exposure situations but are
68 not important exposure routes for fluoride in drinking water (Zhang *et al.* 2019; Guth *et al.* 2020). Intake
69 of low fluoride concentrations (≈ 1 mg/L) in drinking water can stop the occurrence of dental caries.
70 However, surplus fluoride ingestion for long period may lead to dental and skeletal fluorosis, and other
71 adverse health effects like diarrhea, retardation in growth, Alzheimer's, reduced mobility, DNA structure,
72 and functional changes of soft tissues like the liver, lung, and kidneys, reduction in children's IQ and even
73 death if doses exceed very high levels (≈ 250 mg/L) (Shomar *et al.* 2004; Reddy *et al.* 2010; Choi *et al.*
74 2012; Salifu *et al.* 2012; Razdan *et al.* 2017). A United Nations International Children's Emergency Fund
75 (UNICEF 1999) report shows that 65% of the rural population of India including Punjab has been directly
76 exposed to fluoride-related health problems. They use untreated groundwater for drinking and cooking due
77 to the lack of knowledge, safe and clean water, sanitation, and lower socio-economic standards and are thus
78 exposed directly to the high level of fluoride (Mor *et al.* 2009).

79 The health risk assessment (HRA) is one such method that helps in determining adverse health
80 effects, based on input data such as fluoride or any other parameter concentration to the risk model. This
81 method of assessment will look at the real risk, particularly in areas where low risk is considered and is
82 widely used by various researchers to assess the non-carcinogenic health risk (NCHR) due to fluoride
83 exposure in water (Ahada and Suthar 2019; Mukherjee and Singh 2018; Narasimha and Ranjitha 2018; Gao
84 *et al.* 2019; Saeed *et al.* 2019). However, most of these studies have used a single point value for every

85 input model parameter to assess human health risks that may lead to intervention, error, and uncertainty in
86 the results of the model. Probabilistic methods such as the Monte Carlo simulation (MCS) include a more
87 practical risk assessment that accounts for the uncertainty, sensitivity to various exposure mechanisms, and
88 the consequences of different intervention scenarios (Yuan *et al.* 2020). Thus, in this study, MCS evaluated
89 possible adverse health effects from groundwater fluoride exposure through oral ingestion and dermal
90 contact pathways. The sensitivity analysis of the HRA parameters was also performed to understand the
91 parameters that influence the three age groups (i.e. children (0-16 years) and adults (males and females
92 having age greater than 16 years) studied (Soleimani *et al.* 2020).

93 There has been a paradigm shift from “groundwater development” to “groundwater management”
94 in the past decade in the study region. This is mainly due to rapid industrialization, urbanization, excessive
95 pumping for agronomic activities, and an increase in anthropogenic activities in the region. Most industries
96 dump their wastewater (directly or indirectly) in neighboring areas, open pits, or depressions at the field,
97 which contributes to groundwater contamination, with little treatment (Purandara & Varadarajan 2003).
98 Some earlier studies have indicated an increase in the spatial variability of fluoride content in the study
99 region. Singh *et al.* (2011) reported a significant range of fluoride (0.05-0.65 mg/L) in the region. Chaudhry
100 *et al.* (2019a) reported that fluoride in the region is due to an increase in anthropogenic activities and
101 geogenic processes such as weathering and the breakdown of rocks. In the study conducted by the
102 Geological Survey of India (GSI) for the northern region (GSI 2017), metamorphic and igneous rocks (i.e.
103 such as gneisses and granites) have been reported in the study region; indicating fluoride to be an endemic
104 problem in the region. Yet, no studies in the study region deal with fluoride contamination and its
105 assessment of human health risks. Comprehensive research was therefore conducted to elucidate the
106 possible effects of fluoride trends through time and also to assess the possible non-carcinogenic health risk
107 (NCHR) from the ingestion and dermal absorption of fluoride-exposed drinking water for three age groups
108 as no evidence has been found between fluoride and carcinogenic health risks after decades of research
109 (American Academy of Pediatrics 2020). Furthermore, the drinking water quality index (WQI) was
110 evaluated for the quantification of groundwater quality in the area. Using MCS and sensitivity analysis to
111 find the hazard quotient (HQ), the uncertainties in the risk estimates have been quantified too.

112 **Study Area**

113 Rupnagar district (1414 km² areal extent) lies in the eastern region of the Punjab state (76°16'26" E-
114 76°43'21"E, 30°44'21" N-31°25'53"N) and is a part of the Indo-Gangetic basin [Figure 1(a-b)]. The region
115 is surrounded by the Himachal Pradesh districts in the north and north-east, Fatehgarh Sahib, and Mohali
116 in the south and south-east, Hoshiarpur, Nawanshahr, and Ludhiana in the west. The major source of the
117 economy in the region is Agriculture (covering nearly 55% of the region). The main crops grown are rice
118 and wheat. Most of the fallow and uncultivated land is barren with few shrubs and bushes. In agricultural
119 activities, various kinds of phosphate fertilizers and other agrochemicals are used to increase farm yields
120 (Department of Agriculture and Farmer Welfare (DAFW), 2020). The area has semi-arid weather with
121 warm summers (April-June) and cold winters (November-February). River Satluj is the main and principal
122 source of water in the region. Drinking water, in the study region, is obtained from both surface and
123 groundwater supplies. The district is influenced by the southwest monsoon (July-September), which
124 constitutes about 78% of the total precipitation. The area is primarily filled by quaternary sediments, mainly
125 of fluvial nature. The rock formations ranging in age from Pleistocene to recent are exposed. They are
126 represented by siwaliks and alluvium deposits. Soil consists predominantly of four main types of soil,
127 namely, ustochrepts, ustorthents, ustipsamments, and ustifluvents (Chaudhry *et al.* 2019b). Based on the
128 piper trilinear plot, it was found that the governing cations and anions in the region are calcium (Ca²⁺),
129 sodium (Na⁺), magnesium (Mg²⁺), and bicarbonate (HCO₃⁻) [Figure 2S]. The groundwater samples in the
130 area are mainly of the form Ca²⁺, Na⁺ / Mg²⁺-HCO₃⁻ and control groundwater chemistry.

131 **Materials and Methods**

132 *Data procurement and descriptive statistics*

133 Central Groundwater Board (CGWB) is a statutory body that works under Water Resources
134 Ministry, India. All data regarding the country's physico-chemical parameters are monitored and analyzed
135 by them in their chemical laboratories using standard methods given in the Bureau of Indian Standards
136 (BIS) IS: 3025 (2004). For the present study, thirteen parameters for the 14 sampling locations (mainly
137 bore and dug wells) covered by the study area have been chosen which have consistency in their data set
138 for over 28 years (1990-2018). All the data was procured from CGWB. Table 1 lists the descriptive statistics
139 and acceptable limitations as per BIS IS 10500 (1991) and WHO (2011) for all the parameters being

140 evaluated. It has been evident from the results of the descriptive statistics that the concentrations of nitrate
141 (NO_3^-), total hardness (TH), magnesium (Mg^{2+}), and fluoride (F^-) are well above the acceptable limits of
142 BIS IS 10500 (1991). The ionic-balance-error (IBE, the ratio of $(\sum\text{Cation}-\sum\text{Anion})/(\sum\text{Cation}+\sum\text{Anion}) \times$
143 100)) was evaluated for each groundwater sample to ensure accuracy of the study. The determined IBE was
144 within the acceptable $\pm 10\%$ limit (Pastén-Zapata *et al.* 2014).

145 ***Trend analysis and its quantification***

146 The Mann-Kendall trend test was used in the analysis to assess the trend in time series data of
147 physico-chemical parameters over more than 28 years (1990-2018) at 14 sampling locations. It is a non-
148 parametric test and unlike parametric tests, it doesn't necessitate data to be independent and normally
149 distributed. It is also useful if the data set has some seasonal components in it (Mosmann *et al.* 2004). The
150 theoretical framework related to the methodology of the test is omitted here for brevity and can be found
151 in many books related to statistical hydrology (Haan 1977; Naghettini 2016). Sen's slope method (Sen
152 1968) an extension of the Theil method (1950), has been used to quantify increasing and decreasing trends
153 in all the physico-chemical parameters.

154 From the trend analysis results (Table 2, we displayed only fluoride results for brevity), it has been
155 elucidated that, there is an increasing trend ($p\text{-value} \leq 0.05$, $\alpha = 0.05$) in the fluoride parameter at the
156 sampling locations. Fluoride exhibited the presence of increasing trends at two sites (i.e. Chak Dera and
157 Soara), while no trend was observed at the rest of the sites. Thus, it can be concluded that the significant
158 increasing trends at two sampling locations may be attributed to various anthropogenic factors. Besides
159 this, natural factors could attribute to no trends in the rest of the study area (Machiwal and Jha 2015).

160 ***Water quality index (WQI)***

161 The WQI is a mathematical equation used to turn multiple groundwater quality data into a single
162 number by the policymakers, health care staff, planners, and the general public. It is determined from the
163 human consumption point of view as it is useful in evaluating drinking water quality and the impact of
164 various sources, i.e. natural and anthropogenic on it. The BIS IS: 10500 (1991) considered the water norm
165 for each physico-chemical parameter for computing WQI. The weight values for each parameter were
166 calculated in terms of their relative value (w_i) for overall drinking water quality to measure WQI values at
167 each sampling site [Table 1S]. A weightage (W_i) value of 5 was assigned to the parameters NO_3^- , and F^- ;

168 for pH, EC, and SO₄²⁻ the weight of 4 was assigned taking parameters' importance in water quality into
 169 account along with expert opinions. Due to their lesser importance in water quality, Cl⁻, TH, Ca²⁺, Mg²⁺,
 170 and HCO₃⁻ were given the minimum weight of 3 (Sener *et al.* 2017). The index developed for rating each
 171 parameter and the methodology used in calculating WQI is shown in equation 1 (Sharma *et al.* 2018).

$$172 \quad WQI = w_i w_r \quad (1)$$

$$173 \quad w_r = \text{water quality rating} = 100 \left(\frac{A_v - I_v}{S_v - I_v} \right) \quad (2)$$

174 where A_v is the actual value present in the water sample; I_v is the ideal value which is taken as 0 for all the
 175 parameters except for pH which is taken as 8.5; S_v is the standard value. Based on the WQI results,
 176 groundwater quality can be classified into five categories, namely, excellent (WQI<50), good (50-100),
 177 poor (100-200), very poor (200-300), and unsuitable for human consumption (WQI>300) (Wang *et al.*
 178 2019).

179 ***Fluoride non-carcinogenic health risk assessment for oral and dermal absorption***

180 HRA has been carried out in the present study to determine the adverse health effects of fluoride
 181 exposure in groundwater resources. Human exposure to contaminants can occur across three main
 182 pathways, namely oral, dermal, and inhalation. In the present study, only two modes were considered (i.e.
 183 oral ingestion and dermal absorption). The daily exposure dose (EDI) of fluoride can, therefore, be
 184 determined by oral ingestion and dermal absorption using equations (3), and (4), respectively (U.S.
 185 Environmental Protection Agency (USEPA 2010); Yuan *et al.* 2020):

$$186 \quad EDI_{\text{oral}} = \frac{F_C * D_{WIR} * E_F * E_D}{B_W * T_{Avg}} \quad (3)$$

$$187 \quad EDI_{\text{dermal}} = \frac{F_C * SS_A * K_D * F_{SW} * S_{ET} * E_F * E_D * 10^{-3}}{B_W * T_{Avg}} \quad (4)$$

188 where EDI_{oral} estimates daily fluoride intake per day from drinking water and EDI_{dermal} estimates the amount
 189 of fluoride received by skin absorption (mg/kg/day); F_C is fluoride concentration in drinking water (mg/L);
 190 D_{WIR} is drinking water intake rate (L/day); E_F is the frequency of exposure (day/year); E_D is the duration
 191 of exposure (year); B_W is body weight (kg); T_{Avg} is the average lifespan (days); SS_A is skin surface area
 192 (cm²); K_D is the coefficient of skin permeation (cm/h); F_W is fractional surface skin contact with water
 193 (dimensionless), and; S_{ET} is the shower exposure time (h/day). Parameters used for HQ assessment are
 194 given [Table 3]. HQ for oral intake is calculated using equation 5, where R_fD₀ refers to reference dosage or
 195 minimal risk level (MRL) is taken as 6E-2 mg/kg/day for oral ingestion (USEPA 1993).

196 $HQ_{\text{oral}} = \frac{EDI_{\text{oral}}}{RfD_0}$ (5)

197 HQ for dermal/skin absorption is calculated using equation 6, where reference skin/dermal
198 absorption dosage (RfD_{dermal}) is taken as 5.82×10^{-2} mg/kg/day (Staff 2001; Mukherjee *et al.* 2019). The
199 complete NCHR for a high concentration of F^- present in groundwater is estimated in terms of the Total
200 Hazard Index (THI) by using equation 7.

201 $HQ_{\text{dermal}} = \frac{EDI_{\text{dermal}}}{RfD_{\text{dermal}}}$ (6)

202 $THI = HQ_{\text{oral}} + HQ_{\text{dermal}}$ (7)

203 If THI is > 1 , possible non-carcinogenic effects on health may occur while THI < 1 means that people
204 in the area are less likely to be at risk for their health due to fluoride exposure (USEPA 2010).

205 *Monte Carlo simulation (MCS) and sensitivity analysis*

206 High ambiguity is found during the evaluation of health risks. For instance, if individual point values
207 are used for calculating the risk of a given population, a high degree of uncertainty is obtained. Thus, MCS
208 has been used in this analysis to minimize uncertainty (Miri *et al.* 2018). In MCS, a set of variable values
209 is used instead of using an individual point value of parameters, and the measurement is repeated many
210 times, and results are obtained with different degrees of confidence (1-99 percent).

211 Sensitivity analysis has been performed in the MCS to evaluate the parameters which have the
212 greatest effect on the risk assessment outcome. Crystal Ball software (version 11.1.1.1 Oracle, Inc., USA)
213 has been used in this analysis for MCS and conduct sensitivity analysis using 10000 trails. The parameters
214 used during the analysis are listed in Table 3.

215 **Results and Discussion**

216 *Spatial distribution of fluoride*

217 From the spatial distribution map of fluoride (prepared using inverse weighted distance technique
218 in ArcGIS 10.5 software) [Figure 3S], it can be elucidated that the northern and central region is worst
219 affected with fluoride contamination, while the rest of the regions were well within the acceptable limits of
220 1.5 mg/L. The fluoride concentration in the region ranged between 0.12 and 4.90 mg/L with a mean
221 concentration of 0.78 mg/L. Weathering of fluoride-bearing minerals is the most significant geogenic
222 source (GSI 2017). Given that no other natural source of fluoride exists in the study region, various

223 anthropogenic activities also contribute to increasing the fluoride concentration in the region (i.e. brick
224 kilns, industrial and domestic wastewater discharge, increase in the use of fertilizers, mining activities, and
225 extreme irrigation practices) (Chaudhry *et al.* 2019a). The broad gap between the groundwater residence
226 time and the charging area alongside Ca^{2+} insufficient groundwater level is responsible for Na^+ - HCO_3^- level
227 groundwater in the region. This is also one of the major causes of fluoride contamination in the region
228 (Hounslow 1995). Since the study is related to fluoride assessment, spatial distribution maps of other
229 parameters are avoided here for brevity. Readers can refer to Chaudhry *et al.* (2019) for details.

230 ***WQI-based water quality assessment***

231 One of the main objectives of this work was to analyze the drinking water quality in the region. For
232 this, 10 physico-chemical parameters [pH, EC, Cl^- , NO_3^- , SO_4^{2-} , TH, Ca^{2+} , Mg^{2+} , HCO_3^- , and F] have been
233 taken and the WQI method was used.

234 The computed WQI values range from 55.44-139.40 [Table 4]. The region's water quality is in the
235 "poor" to "good" range. Out of the fourteen sampling locations, two sampling locations (Ahmedpur and
236 Bhalan) fall under the "poor" water class while the rest of them fall under the "good" class. The spatial
237 distribution map of the final WQI has been prepared and presented [Figure 1b]. From the map, it can be
238 elucidated that the northern and central region has poor water quality mainly due to input of municipal and
239 industrial waste and/or discharge of agricultural activities in the area (Yidana and Yidana 2010).

240 ***HQ based human health risk assessment***

241 In the current study, a health risk assessment was performed to evaluate the NCHR effects of fluoride
242 in the area using MCS for each site and age group. The EDI_{oral} , $\text{EDI}_{\text{dermal}}$ of fluoride [Table 2S and 3S,
243 respectively] as well as HQ_{oral} and $\text{HQ}_{\text{dermal}}$ for male, female, and children have been determined to assess
244 the THI of the fluoride in drinking water [Table 5]. The table describes that fluoride exposure due to oral
245 ingestion was higher than the exposure due to dermal absorption by several orders of magnitude. Oral
246 ingestion is thus the main route for fluoride exposure of the three age groups in the region. NCHR in
247 children due to oral ingestion of fluoride was maximum in Ahmedpur district ($\text{HQ}_{\text{oral}} = 5.45$) followed by
248 Bhalan ($\text{HQ}_{\text{oral}} = 1.73$) while it was least in Dumewal ($\text{HQ}_{\text{oral}} = 0.13$). This heterogeneity can be due to
249 fluoride concentration differences at various locations. Amongst different age groups studied, children were
250 found to be at maximum risk (0.13-5.45) followed by females (0.07-2.97), and males (0.06-2.51) through

251 HQ_{oral}. However, NCHR associated with HQ_{dermal} for each population group at each site is close to zero
252 (≈ 0), hence negligible.

253 Several other public health studies also indicate that the NCHR of fluoride cannot be ignored in
254 drinking water (Huang *et al.* 2017; Fallahzadeh *et al.* 2018; Ghaderpoori *et al.* 2019; Kabir *et al.* 2020).
255 Excessive and insufficient fluoride intake can cause adverse effects, including dental caries, dental, and
256 skeletal fluorosis. The precise age when the teeth are most vulnerable is quite uncertain, with views ranging
257 from the prenatal stage to the age of 2-5 when mineralization is optimum. However, it is widely recognized
258 that teeth are no longer susceptible to harmful fluoride effects after 5-8 years (Adimalla and Qian 2019).
259 Skeletal fluorosis is an advanced stage of bone fluorosis that results in localized cracking and bone
260 weakening in both children and adults. Nevertheless, signs can only be visualized when the disease has
261 reached an advanced stage. Adimalla and Li (2019) in their research stated that skeletal fluorosis begins at
262 10 years of age and reaches 100 percent at 20 years of age. As a result, children are usually not vulnerable
263 to bone and skeletal fluorosis. To enhance the quality of healthy life, careful attention should be paid
264 immediately to the NCHR assessment of residents' in the affected regions.

265 *Sensitivity analysis*

266 Sensitivity analyses were carried out to classify the main significant parameters that contribute to
267 the performance values of the model's risk estimates. Results of the NCHR sensitivity study (oral and
268 dermal absorption) are shown [Table 4S]. For oral ingestion exposure, F_C and D_{WIR} were found to be the
269 most influencing parameters in all of the three age groups with correlation coefficients ranging from (0.96-
270 0.98) and (0.16-0.23), respectively. For dermal exposure, F_W and S_{ET} posed the greatest influence on the
271 output risks for the three age groups [Figure 4S]. Thus, a decrease in fluoride concentration, ingestion rate,
272 shower exposure time, and fractional skin contact with water in all exposed groups will reduce the risk of
273 oral intake and dermal absorption of fluoride. It was also found that sensitivity was inversely related to B_W.
274 These results indicate that higher B_W is related to lower sensitivity.

275 **Conclusion**

276 In this study, fluoride concentration, and its NCHR were investigated in the study region using long-
277 term data sets. The trend in fluoride parameter was identified and quantified using Mann–Kendall and Sen's
278 slope tests. The highest fluoride concentrations were detected in the northern and central parts of the study

279 area. GIS-based WQI was computed to demarcate groundwater quality zones. The computed WQI values
280 range from 55.44-139.40 with 85% of the sampling locations falling under the “good” water class and the
281 rest of them under the “poor” water class. Based on HRA, the children were found to be more prone to
282 NCHR than the female and male due to oral ingestion of fluoride. The estimated levels of HQ_{oral} were
283 greater in magnitude than those estimated from HQ_{dermal} . Sensitivity analysis suggested that the most
284 important parameters in the model for minimizing the possible health impact were fluoride concentration
285 in drinking water, ingestion rate, fractional surface skin contacts with water, and time of exposure to the
286 shower. Thus, an increase in anthropogenic activities in the region is the main reason for the increase in
287 fluoride concentration in the region apart from rock-weathering. Therefore, waste from the rural, domestic,
288 and industrial sectors should be properly handled and disposed of. A suitable system for the continuous
289 monitoring of water supplies for its hydrochemistry and hydrology be created so that a policy and action
290 plan for the conservation and restoration of this valuable resource is formed. Defluoridation of drinking
291 water in fluorotic areas should be implemented.

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296 **Conflict of Interest**

297 The authors declare no conflict of interest.

298 **Contributions**

299 AKC and PS conceived and designed the methodology; AKC and PS analyzed the results; AKC and PS
300 wrote the paper; AKC and PS revised the paper.

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Figures

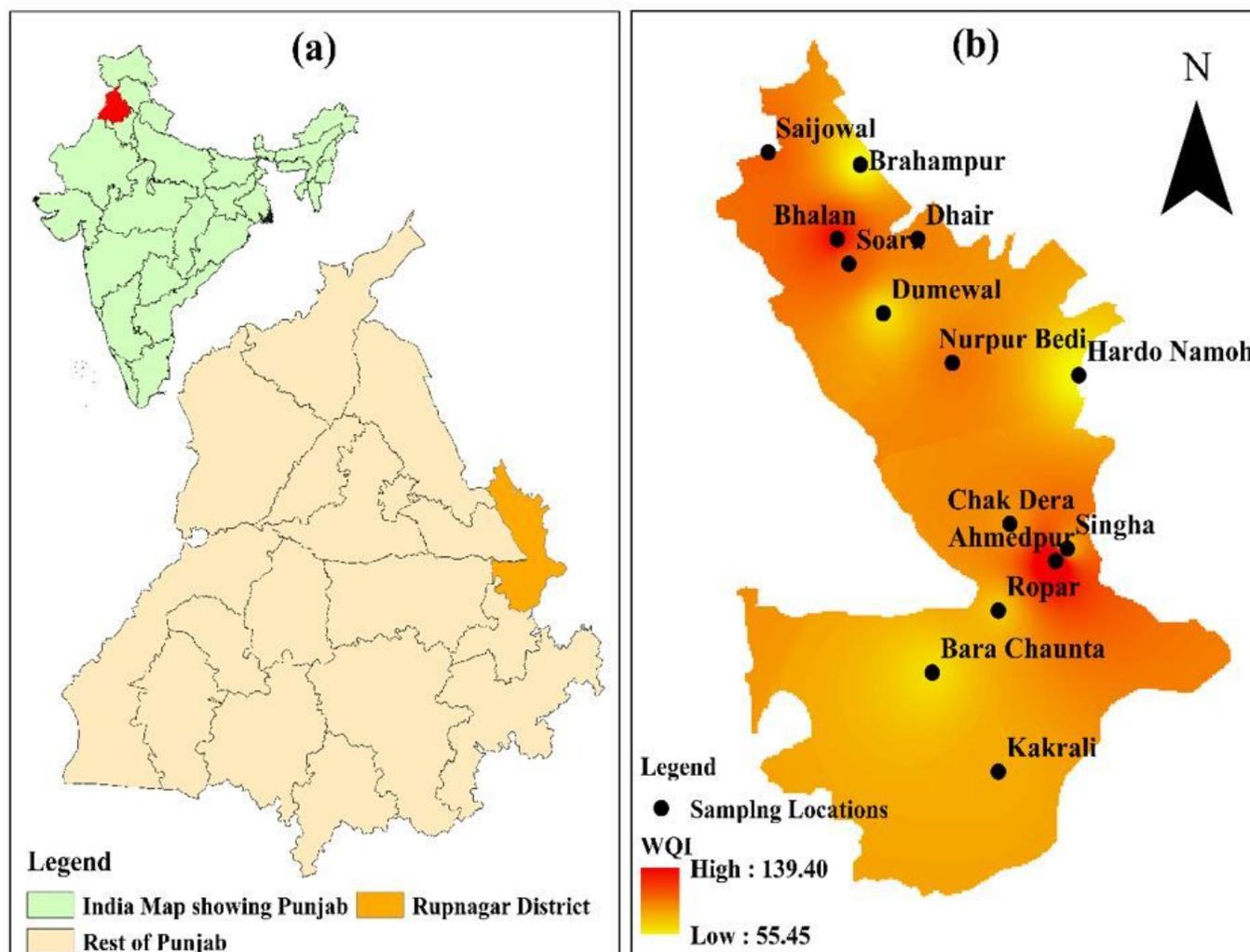


Figure 1

(a-b). (a) Location map of the study region; (b) Sampling locations and WQI distribution in the study region Note: The designations employed and the presentation of the material on this map do not imply the expression of any opinion whatsoever on the part of Research Square concerning the legal status of any country, territory, city or area or of its authorities, or concerning the delimitation of its frontiers or boundaries. This map has been provided by the authors.

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