ORIGINAL ARTICLE



Sources evaluation and ecological risk assessment of heavy metals accumulated within a natural stream of Durgapur industrial zone, India, by using multivariate analysis and pollution indices

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Abstract

In this study, variations in physicochemical parameters and heavy metal contamination in water–sediments of a natural stream in the Durgapur industrial zone have been investigated. pH, COD, Cl⁻, CN⁻ and heavy metals, viz. Pb, Hg and Fe concentrations in channel water, are higher than Indian standards. Metal concentrations in sediments are many folds higher than background value, where Pb, Cd, Hg and Cr contents exceed the sediment quality guidelines. Contamination factor (C_f) value of channel water follows the order of Hg > Pb > Fe > Cr > Cd > Cu > Ni, whereas enrichment factor and geo-accumulation index (I_{geo}) values in channel sediments are in the order of Hg > Cr > Ni > Pb > Cd > Fe > Cu. The assessment of contamination index (C_d) , modified contamination index (mC_d) and pollution load index indicates that channel water and sediment samples in the study area are strongly contaminated by heavy metals. Sediment samples based on PELQ and ERMQ are highly toxic, with high degree of potential ecological risk at all the monitored stations. Multivariate analysis infers that heavy metals in channel water and sediments are majorly sourced from industrial discharge.

Keywords Physicochemical characterization \cdot Heavy metals \cdot Seasonal variation \cdot Pollution indices \cdot Risk assessment \cdot Multivariate analysis

Introduction

Heavy metal contamination in surface water and sediments due to industrial discharge is an issue of major environmental concern in a fast-growing country like India and has attracted the considerable attention of scientific and regulatory communities due to the persistence and toxicity of

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heavy metals in the aquatic system. Indiscriminate discharge of untreated sewage, industrial waste and other anthropogenic activities caused a significant deterioration in water and sediment quality, especially near large industrial complexes and in the lower basin (Kumar and Maiti 2015; Chung et al. 2016). In recent times, considerable research has been conducted to investigate heavy metal contamination in water and sediments of rivers/natural streams in industrially polluted various regions in India. Banerjee et al. (2016) investigated the seasonal variations in heavy metal concentrations in water sediments of Subarnarekha river due to the discharge of industrial and mining waste near Jamshedpur industrial region, eastern India. Sundaray et al. (2012) studied the dissolved heavy metal load and their seasonal variations in the Mahanadi river sourced from fertilizer plants and municipal sewage. Heavy metal contamination due to industrial and urban discharge in water-sediment system of Hindon river and Yamuna river near to the industrial regions of Haryana and Delhi (in northern India) was reported by Suthar et al. (2009) and Kaushik et al. (2009), respectively. Heavy metal contamination in water sediments of Kabini river and heavy metal accumulation in sediments of Cauvery



river due to industrial and urban discharge in Karnataka (southern India) were reported by Hejabi et al. (2011) and Raiu et al. (2012), respectively. Shah et al. (2012) assessed heavy metal contamination in the sediments of Tapti river near Hazira industrial zone, Surat (western India). The concentrations of heavy metals in water, sediments and wetland plants of the lentic water body in Singrauli industrial region and Mangalpur industrial complex were reported by Rai (2009) and Gupta et al. (2008, 2010a), respectively. Industrial effluents and wastes dumped into water bodies alter its physicochemical characteristics and elevate the heavy metal concentration according to the nature of effluent being discharged (Blinova et al. 2012). Besides chemical leaching from bedrock, water drainage basin and runoff from banks are the leading sources for the lithogenic contribution of heavy metals (Jain et al. 2005; Shakeri et al. 2016). Heavy metals added to the aquatic system are distributed during their transport between the aqueous phase and bed sediments (Sin et al. 2001). The measurements of pollutants in water are not conclusive due to fluctuation in water discharge and low residence time. The study of sediments is important as they have a long residence time, receive and absorb pollutants and have been recognized as secondary sources of water pollution (Jain et al. 2005; Liu et al. 2009). Therefore, analysis of bed sediment is a powerful approach not only for studying the distribution of contaminants in an aquatic system, but also for reconstructing historical inputs of these contaminants, improving management strategies and evaluating the effectiveness of recent pollution control measures (Lara-Martín et al. 2015).

Description of the study area

The field study was conducted along a natural stream near Durgapur industrial complex, one of the most industrialized cities in eastern India, located at 23.48°N 87.32°E (Fig. 1a). The study area belongs to the tropical climatic condition with two distinct seasons—dry (summer and winter) and rainy (during monsoon) with an annual rainfall of 52". Geologically, the study area is overlain by hard crust laterite of Cenozoic age (Fig. 1b). Within the laterites, Panchet formation and Durgapur bed of Gondwana supergroup are exposed. The eastern and southern part of the study area have moderate to very hard rock types of red shale, sandstone and very coarse sandstone, respectively. The southern part of the study area, along the Damodar river, is mostly dominated by clay alternating with silt and sand of Panskura formation (Quaternary) having the characteristics of soft, unconsolidated sediments (oxidized).

Studied natural stream (locally known as Tamla Nala) is a narrow channel fed by rain water and surface runoff, having an average elevation of 65 m (213 ft), with a flow rate of 13.33 ± 0.5 to 14.7 ± 0.15 ml/s. A major portion of

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its course (about 17 km), especially middle and downstream stretch, passes through the Durgapur industrial zone and ultimately terminates into the river Damodar near Majher Mana. This channel serves mainly as stormwater drainage for Durgapur industrial zone. The upstream stretch of the channel is devoid of industrial and anthropogenic discharges, but the middle section and downstream stretch of the channel are heavily affected by the industrial effluents and waste discharges. Besides, additions of domestic/urban wastewater, atmospheric deposition of heavy metals and surface runoff from adjoining areas, mainly during the rainy season, are the supplementary contributors of pollutant load in channel water. Our field study is focused on middle to downstream stretches of this natural stream (approximately 10 km) which is heavily contaminated by industrial and urban wastewater discharges. A number of heavy industries (including iron & steel, coal-based thermal power plants, cement, chlor-alkali, pharmaceuticals, fertilizers) as well as clusters of mediumand small-scale auxiliary industries of Durgapur industrial belt draining their wastewater enriched with heavy metals into the Tamla stream leading to heavy metal contamination in water-soil system and existing biota (Kisku et al. 2011). Barman and Lal (1994) and Barman et al. (2000) studied heavy metal accumulation and distribution in agricultural soil-cultivated vegetables and weeds grown in industrially polluted fields in Durgapur region. Contamination of soil and plants with potentially toxic elements irrigated with mixed industrial effluents was reported by Kisku et al. (2000). Gupta et al. (2010b, 2013) assessed biochemical changes in wastewater-irrigated vegetables and also the distribution of pollutants in stream water. But no such in-depth information is available on heavy metal contamination/distribution in channel sediments and its potential ecological risk. This research aims to focus on (1) spatial and seasonal variability of water parameters and heavy metals in channel water, (2) ecological risk assessment of metal contamination in channel water and sediments and (3) multivariate analysis to identify possible sources of contamination and the relative contribution of various water parameters.

Materials and methodology

Water samples collection and analysis

Water samples were collected from eight (8) different sampling sites at regular intervals started from the middle to downstream stretches of the stream (Fig. 1a), and the brief description of sampling stations is given in Table 1. Water samples were collected in wide mouth pre-acid-washed polythene bottles and rinsed with sample water before fill-up to the capacity (1 l). Water pH, temperature, conductivity (EC) and total dissolved solids (TDS) were measured at the



Fig. 1 Location of sampling sites (a) and regional geology (b) of the study area



Table 1 Description of the sampling sites

Sam- pling station	Latitude	Longitude	Description of the sampling location
S1	23°31′25.02″N	87°17′11.11″E	About 4 km away from the discharge point after two major steel and alloy industries (DSP and ASP)
S2	23°30′54.13″N	87°17′31.19″E	Located after coke-oven industries
S3	23°30′27.61″N	87°17′32.21″E	Located near thermal power plant, ferro-alloy and chlor-alkali industries
S4	23°30′3.42″N	87°17′28.81″E	Site is near to pharmaceutical industry and DCL residential complex
S5	23°29′31.00″N	87°17′49.71″E	Site is not affected by the any kind anthropogenic activity or discharge from industries, residential or agricultural units
S6	23°28′57.03″N	87°18′33.63″E	Located near Birbhanpur village and down-part of DPL colony
S7	23°28′39.75″N	87°18′54.84″E	Located near Shyampur village and agricultural fields
S8	23°28′22.63″N	87°19′0.88″E	Site is located at the river side before the termination of studied stream to river Damodar

sites by using portable hand analyzer (Multi-Parameter PCS TestrTM 35, Oakton). For estimation of heavy metals, water samples were fixed with 0.5 ml of conc. HNO₃ immediately after the collection to prevent precipitation of metals. Samples were taken to the laboratory and stored in the ice box for further analysis of various water parameters. Physicochemical analysis of water parameters was performed as per standard methods for the examination of water and wastewater (Lenore et al. 1998). For heavy metal analysis, water samples were digested with 3:1 (v/v) mixture of concentrated HNO₃ and HClO₄ (Lenore et al. 1998). Digested water samples were filtered with Whatman No. 42 filter paper and filtrate analyzed for lead (Pb), cadmium (Cd), chromium (Cr), iron (Fe), copper (Cu) and nickel (Ni) in atomic absorption spectrophotometer (GBC, Avanta), and Mercury (Hg) was estimated by cold vapor atomic absorption.

Analysis of sediment samples from the channel

Sediment samples were collected from the same location (eight sampling sites) from where the water samples were collected. Surface sediment samples were collected from 0 to 5 cm depth of the channel by using a stainless steel hand digger and were immediately kept in airtight zipped plastic bags. In laboratory conditions, sediment samples were airdried, crushed with a pestle in a mortar and sieved through 2-mm mesh for physicochemical characterization. Homogenized sediment samples were analyzed for pH and electrical conductivity (EC) as per standard methods (Lenore et al. 1998). Total organic matter (OM) and organic carbon (OC) of sediments were determined as stated by Walkley and Black (1934). For estimation of heavy metal concentrations, 1 g of air-dried homogenized sediment samples was digested with a mixture of concentrated HNO₃ and HClO₄ (3:1) (USEPA, Method 3051A, 2007). The solution was filtered, diluted to 50 ml with ultrapure water and analyzed for Pb, Cd, Cr, Fe, Cu and Ni contents in atomic absorption spectrophotometer (AAS). Hg was estimated by cold vapor atomic absorption. As there were no previously recorded background values for metal content in sediments before the industries were set up, a set of sediment samples were collected near the upper reaches of the stream (about 2 km away from the contaminated site) which is devoid of any type of industrial, urban, agricultural discharges which under the similar lithological units were considered as background or control sample value.

Quality control and assurance

Special care has been taken during sample collection, preservation and every experimental procedure. E-Mark (AR grade) standard solutions were used for the preparation of standard curve and intermediate solutions during the analysis of heavy metals and other physicochemical parameters of water and sediment samples. Ultrapure water (resistivity = 18.2 M Ω /cm) (Sartorius stedim biotech, arium[®] 61316) was used for the preparation of all the solution. The element standard solutions used for calibration were prepared by diluting stock solutions (Merck AA standard) of 1000 mg/l using micropipette. All glassware was cleaned by soaking in dilute acid for at least 24 h and rinsed properly in ultrapure water before use. Each analytical process (related to water and sediment analysis) was replicated three times to ensure the accuracy of the experimental results, and mean values were used. The analytical results for heavy metals in water and sediment samples were checked by using the standard reference material from National material testing laboratory, India. Reproducibility of analytical results was within 5% standard error (SE) level of certified values for each metal.

Different pollution indices for assessing metal contamination in water and sediments

Pollution indices seem to be promising and beneficial in assessing the metal enrichment and/or contamination in the water–sediment system. There are several methods to



The contamination factor (C_f) (Hakanson 1980, Backman et al. 1997) is the ratio obtained by dividing the concentration of each metal in the water/sediment by upper permissible value or its background value (concentration in uncontaminated water/sediment):

$$C_{\rm fi} = \frac{\text{Analytical value for ith component}}{\text{Permissible limit for ith component}}.$$

 $C_{\rm f}$ values were interpreted (Hakanson 1980) as: $C_{\rm f} < 1 = {\rm low}$ contamination; $1 < C_{\rm f} < 3 = {\rm moderate}$ contamination; $3 < C_{\rm f} < 6 = {\rm considerable}$ contamination and $C_{\rm f} > 6 = {\rm very}$ high contamination.

Contamination index $(C_{\rm d})$ was used to measure the quality of water and wastewater (Backman et al. 1997). The contamination index is calculated from the equation below

$$C_{\rm d} = \sum_{i=1}^n C_{\rm f}^{\rm i},$$

where $C_{\rm f}^{\rm i}$ are the individual contamination factors for the selected element and n is the number of the $C_{\rm f}s$ examined for specific element. The $(C_{\rm d})$ is computed separately for each sampling site as a sum of contamination factors $(C_{\rm f})$ of individual elements exceeding the permissible limits. Backman et al. (1997) described the degree of contamination $(C_{\rm d}$ value) as: $C_{\rm d} < 1 = {\rm low} \ (1 < C_{\rm d} < 3 = {\rm medium}, \ {\rm and} \ (C_{\rm d} > 3 = {\rm high}.$

Abrahim and Parker (2008) presented a modified form of the Hakanson (1980) equation for the calculation of the overall degree of contamination using following equation:

$$mC_{d} = \frac{\sum_{i=1}^{n} C_{f}^{i}}{n},$$

where n is the number of analyzed elements, i is the element, and $C_{\rm f}$ is the contamination factor. Gradation of sediment quality (Abrahim and Parker 2008), according to the calculation of ${\rm mC_d}$ values was categorized as: ${\rm mC_d}$ value 1.5–2 = low contamination, $2 < {\rm mC_d} < 4 = {\rm moderate}$ contamination, $4 < {\rm mC_d} < 8 = {\rm high}$ contamination, $8 < {\rm mC_d} < 16 = {\rm very}$ high contamination and ${\rm mC_d} > 16 = {\rm extremely}$ high degree of contamination.

To evaluate natural or anthropogenic sources of heavy metals in sediment, the enrichment factor (EF) is calculated for sediment samples using conservative elements such as Al, Fe, Sc and Ti (Lee et al. 1998; Abrahim and Parker 2008) as reference elements.

The reference values were adopted from the baseline concentration of heavy metals using following equation:

$$EF = \frac{[M]/[Fe]_{\text{sediment}}}{[M]/[Fe]_{\text{baseline}}},$$

where [M] = total heavy metals concentrations measured in sediment samples (mg/kg) and [Fe] = total concentration of iron as the reference element (mg/kg). Five categories are recognized on the basis of enrichment factor (Sutherland 2000; Loska and Wiechuya 2003). EF value < 1-2 = deficiency to minimal enrichment, 2 < EF < 5 = moderate enrichment, 5 < EF < 20 = significant enrichment, 20 < EF < 40 = very high enrichment, and EF > 40 = extremely high enrichment.

Muller (1981) introduced the index of geo-accumulation (I_{geo}) which enables the assessment of metal accumulation in bottom sediments by comparing present and pre-industrial concentration.

$$I_{\text{geo}} = \log_2 \frac{M_{\text{x}}^{\text{i}}}{1.5M_{\text{b}}^{\text{i}}},$$

where $M_{\rm x}$ is the measured metal concentrations in sediment fraction (<2 µm) and $M_{\rm b}$ is the geochemical background value of metals. The factor 1.5 is introduced to include possible variations of background value due to natural fluctuations. Geo-accumulation index is classified as: $I_{\rm geo}$ value <1 = uncontaminated or no pollution, $1 < I_{\rm geo} < 2 = {\rm slightly\ polluted}, \ 2 < I_{\rm geo} < 3 = {\rm moderately\ polluted}, \ 3 < I_{\rm geo} < 4 = {\rm strongly\ or\ highly\ polluted}$ and $I_{\rm geo} > 4 = {\rm extremely\ polluted}$ (Muller 1981).

Pollution load index (PLI) provides a simple, comparative means for assessing soil/sediment quality (Tomlison et al. 1980). PLI is represented as geometric mean of C_f value of n number of metals estimated at the contaminated site by using the following equation:

$$PLI = \left(C_{f_1} \times C_{f_2} \times \dots \times C_{f_n}\right)^{1/n}$$

where n is the number of metals (n=7 in this study) and C_f is the contamination factor (C_f) of each metal present in the sediment. PLI ≤ 0 indicates perfection or control and PLI value of > 0-1 represents the baseline level of pollutants, while PLI > 1 indicates progressive deterioration of site due to elevated metal content (Gupta et al. 2013).

Statistical analysis

Pearson's correlations are performed between water quality parameters and also for various sediment parameters for



analyzing the interrelations between them. Factor analysis is used as a numerical method for discussing variables and identifying geochemical processes by extracting minimum acceptable eigenvalue > 1. Principle component analysis (PCA) along with varimax rotation is performed for physicochemical parameters of channel water and sediment samples to analyze the interrelated variations and also to identify their possible sources. Pearson's correlations (r) are performed between the physicochemical parameters and heavy metals in stream water and sediments for the better interpretation and understanding of metal distribution and their interrelations in water–sediment system. Statistical calculations are carried out at significance level 0.05 by XLSTAT (version 15.1).

Results and discussion

Characterization and spatial variation of physicochemical parameters in stream water

The physicochemical characteristics of channel water samples from eight sites are summarized (Table 2) and compared with the Indian Standards for effluent discharged to inland surface waters (IS 1981). The pH of channel water is highly alkaline with highest value at Site 3 (pH 10.22 ± 1.20) and

then gradually decreases until it reaches the lowest value of 8.83 ± 1.03 at Site 8. Water pH values at all the sites (except Site 8) are higher than the IS discharge standards. Total dissolved solid (TDS) gives a better idea about the solid load transported by the channel water, which mainly consists of a variety of inorganic minerals including different salts (Rai 2010). TDS value in water is under the IS permissible limits, but its higher value is noted at Site 3, 4 and 7. Total hardness (TH) is well under the permissible limit at all sites with a maximum value at Site 3 (65.56 ± 17.09 mg/l). Chemical oxygen demand (COD) is an indicator of chemical pollutants in the aquatic system. COD values at all the sampling sites exceed the IS standard (250 mg/l) with a maximum value at Site 3 ($466.8 \pm 97.80 \text{ mg/l}$) and minimum at Site 8 $(415.42 \pm 62.89 \text{ mg/l})$ showing a decreasing trend. A slight increase in COD value at Site 7 (430.94 \pm 59.29 mg/l) can be attributed to the mixing of sewage water at this point. However, evaluation of biological oxygen demand (BOD) at all sampling points shows low values (maximum value 27.73 ± 5.62 mg/l at Site 7) and is well below the permissible limit. The BOD and COD ratios for the stream water samples are very low (0.04-0.1). This signifies poor availability of biodegradable organic compounds and greater loading of non-biodegradable waste, and thus higher recalcitrant of pollutant in stream water and sediments (Adams et al. 1997). The mean chloride (Cl⁻) concentrations in channel

Table 2 Spatial characteristics of physicochemical parameters and heavy metal concentrations in stream water samples

Parameters	Site 1	Site 2	Site 3	Site 4	Site 5	Site 6	Site 7	Site 8	IS standard
pН	9.06±0.83	8.94±0.50	10.22 ± 1.20	10.02 ± 1.13	9.74 ± 1.35	9.56±1.39	9.20 ± 1.14	8.83 ± 1.03	5.5-9.0
Temp.	26.0 ± 4.03	25.9 ± 4.22	25.8 ± 4.16	25.7 ± 4.17	25.9 ± 4.21	26.2 ± 4.15	26.1 ± 3.99	26.1 ± 3.92	-
EC	3.64 ± 1.03	3.85 ± 1.21	4.04 ± 1.22	3.99 ± 1.24	3.65 ± 1.55	3.59 ± 1.30	3.76 ± 1.26	3.29 ± 1.62	_
TDS	952 ± 69.44	1019.5 ± 145.84	1115 ± 142.71	1064.5 ± 139.72	1024.5 ± 123.77	981 ± 97.00	1044.75 ± 132.76	965.75 ± 60.15	2100
TH	60.92 ± 16.66	63.22 ± 16.31	65.56 ± 17.09	64.62 ± 16.82	63.53 ± 16.97	60.38 ± 14.82	57.69 ± 11.71	56.29 ± 11.04	250
BOD	26.41 ± 5.85	26.19 ± 5.54	27.36 ± 5.40	26.95 ± 5.63	26.76 ± 5.70	27.25 ± 5.59	27.73 ± 5.62	26.92 ± 5.73	30
COD	423.59 ± 53.05	417.63 ± 54.85	466.8 ± 97.80	461.6 ± 96.59	431 ± 59.47	424.1 ± 61.15	430.94 ± 59.29	415.42 ± 62.89	250
NO_3^-	4.121 ± 0.87	3.970 ± 0.92	4.231 ± 0.70	3.995 ± 0.82	3.681 ± 1.06	3.916 ± 0.57	4.268 ± 0.84	3.889 ± 0.67	18
PO_4^{3-}	0.567 ± 0.10	0.551 ± 0.10	0.6 ± 0.09	0.575 ± 0.09	0.556 ± 0.09	0.832 ± 0.56	1.111 ± 1.06	1.079 ± 1.03	5
SO_4^{2-}	64.24 ± 14.18	61.58 ± 15.04	64.173 ± 15.84	62.405 ± 15.66	58.807 ± 14.98	55.72 ± 14.83	53.385 ± 14.27	49.765 ± 13.20	1000
Cl-	821.3 ± 52.62	764.7 ± 60.76	1144.2 ± 113.75	1091.5 ± 122.11	1046.1 ± 141.98	1015.7 ± 150.13	1050 ± 150.46	1018.1 ± 141.5	7 1000
CN-	0.696 ± 0.70	1.478 ± 0.73	1.345 ± 0.65	1.263 ± 0.68	1.185 ± 0.69	0.968 ± 0.75	0.833 ± 0.77	0.41 ± 0.04	0.2
Na ⁺	323.5 ± 50.72	348.7 ± 44.63	371.7 ± 45.22	360.9 ± 51.65	353 ± 56.37	334.8 ± 50.85	343.7 ± 49.31	310.2 ± 52.92	_
K ⁺	72.18 ± 7.36	77.93 ± 10.44	83.99 ± 17.92	80.12 ± 15.72	74.75 ± 14.56	71.58 ± 13.01	76.39 ± 15.91	64.38 ± 9.11	_
Pb	2.8 ± 0.47	2.53 ± 0.41	2.94 ± 0.45	2.79 ± 0.48	2.47 ± 0.33	2.28 ± 0.33	2.18 ± 0.29	2.02 ± 0.29	0.1
Cd	0.33 ± 0.08	0.312 ± 0.07	0.346 ± 0.05	0.333 ± 0.05	0.320 ± 0.04	0.304 ± 0.04	0.295 ± 0.04	0.283 ± 0.05	2
Cr	0.548 ± 0.15	0.519 ± 0.14	0.488 ± 0.13	0.457 ± 0.13	0.434 ± 0.12	0.421 ± 0.13	0.4 ± 0.12	0.384 ± 0.12	2
Fe	23.28 ± 4.64	22.27 ± 4.84	21.84 ± 4.75	20.85 ± 4.41	20.32 ± 4.36	19.32 ± 4.21	20.84 ± 4.67	18.49 ± 3.51	3
Cu	0.256 ± 0.05	0.242 ± 0.05	0.228 ± 0.04	0.284 ± 0.04	0.265 ± 0.03	0.243 ± 0.03	0.225 ± 0.03	0.199 ± 0.03	3
Ni	0.186 ± 0.01	0.173 ± 0.01	0.164 ± 0.01	0.204 ± 0.03	0.190 ± 0.02	0.173 ± 0.02	0.159 ± 0.01	0.139 ± 0.01	3
Hg	0.625 ± 0.14	0.603 ± 0.14	0.996 ± 0.35	0.861 ± 0.26	0.647 ± 0.14	0.574 ± 0.11	0.489 ± 0.07	0.451 ± 0.06	0.01

Units: EC in mS/cm, Temperature in (°C) and all other parameters are expressed in mg/l

IS standard (1981) for discharge into inland waterbodies

- standard not mentioned



water are higher than the IS standards at all sites except Site 1 and 2. The value for chloride is maximum at Site 3 $(1144.2 \pm 113.75 \text{ mg/l})$ which may be attributed to the discharge of chlor-alkali wastewater at this site. Nitrate (NO₃⁻) and phosphate (PO₄³⁻) concentrations are quite low for all sites and very much within the permissible limits. Values of these parameters are highest at Site 7 (4.268 \pm 0.84 mg/l and 1.111 ± 1.06 mg/l, respectively), which can be explained due to the intermixing of sewage water and runoffs from the nearby agricultural fields. Cyanide is an extremely toxic parameter in aquatic systems and contributed from industrial sources (Gupta et al. 2008). The cyanide concentrations in stream waters are higher than IS standard for all the sampling sites. The highest values occur at Site 2 $(1.478 \pm 0.65 \text{ mg/l})$ due to the intermixing of coke-oven wastewater at this site and then showing decreasing trend with the lowest value at Site 8 $(0.41 \pm 0.04 \text{ mg/l})$.

The presence of heavy metals in the aquatic environment is of major concern because of their persistence, toxicity and bio-accumulating tendency (Igwe and Abia 2003). Seven heavy metals like Pb, Cd, Cr, Fe, Cu, Ni and Hg are analyzed (Table 2) and compared with the recommended standards for industrial effluents discharged into the surface waters (IS 1981). Total metal concentrations in channel waters are in the order of Fe > Pb > Hg > Cr > Cd > Cu > Ni (Table 2),

of which mean concentration of Fe (20.9 \pm 4.18 mg/l), Pb $(2.5 \pm 0.46 \text{ mg/l})$ and Hg $(0.655 \pm 0.24 \text{ mg/l})$ exceeds the IS discharge standards. Rest of the metal concentrations are well under the permissible limit. The result shows decreasing trend in metal concentrations from Site 1 to Site 8, with few exceptions for Pb, Cd and Hg (at Site 3) and Cu and Ni at (Site 4). The high values of Pb, Cd and Hg at Site 3 can be attributed to the discharge from chlor-alkali and ferro-alloy industries near to those stations, and the possible sources of Cu and Ni at Site 4 are from pharmaceutical effluents (Rai 2010; Gupta et al. 2013, James et al. 2013). The decrease metal concentrations in downstream may be due to the alkaline nature of the water that favors and accelerates metal deposition in bottom sediment (Salati and Moore 2010). Moreover, an increase in the volume of channel water in the downstream stretch may bring a dilution effect and reduce the metal concentrations at these sampling sites (Site 7 and Site 8).

Seasonal variation of water parameters and heavy metals in stream water

The seasonal variation of different physicochemical parameters and heavy metals is represented in (Table 3). Three distinct seasons, viz. pre-monsoon, monsoon and

Table 3 Seasonal variations of physicochemical parameters and heavy metal concentrations in stream water samples

Parameters	Pre-monsoon (Summer)	Monsoon	Post-monsoon (Winter)
pН	10.50 ± 0.88	8.10 ± 0.41	9.94 ± 0.62
Temp.	29.43 ± 0.18	26.95 ± 0.20	20.01 ± 0.27
EC	3.38 ± 0.38	5.58 ± 0.27	3.27 ± 0.17
TDS	1046.25 ± 100.75	1152 ± 100.62	970.25 ± 56.53
TH	75.23 ± 6.46	40.08 ± 0.89	67.49 ± 3.56
BOD	22.41 ± 0.69	35.17 ± 0.47	25.16 ± 0.45
COD	509.65 ± 52.93	371.49 ± 8.73	470.24 ± 9.06
NO ₃	3.66 ± 0.36	4.77 ± 0.36	3.12 ± 0.40
PO_4^{3-}	0.45 ± 0.03	1.28 ± 0.92	0.64 ± 0.04
SO_4^{2-}	79.25 ± 6.30	49.00 ± 5.30	59.64 ± 5.29
Cl-	1096.15 ± 160.58	893.14 ± 106.98	1093.39 ± 159.71
CN-	1.57 ± 0.52	0.48 ± 0.28	1.56 ± 0.51
Na ⁺	395.67 ± 19.76	276.39 ± 21.34	342.00 ± 26.57
K ⁺	89.54 ± 14.39	65.49 ± 4.88	81.08 ± 2.58
Pb	2.86 ± 0.40	2.03 ± 0.26	2.65 ± 0.46
Cd	0.354 ± 0.03	0.240 ± 0.03	0.354 ± 0.03
Cr	0.554 ± 0.07	0.272 ± 0.04	0.546 ± 0.06
Fe	23.39 ± 1.89	14.28 ± 1.09	23.10 ± 1.84
Cu	0.281 ± 0.03	0.191 ± 0.03	0.243 ± 0.03
Ni	0.189 ± 0.03	0.155 ± 0.02	0.177 ± 0.02
Hg	0.762 ± 0.25	0.421 ± 0.04	0.734 ± 0.24

Units: EC in mS/cm, temperature in (°C) and all other parameters are expressed in mg/l IS standard (1981) for discharge into inland waterbodies

- standard not mentioned



Heavy metal concentration and its distribution in stream sediments

The accumulation and distribution of heavy metal in bed sediments are affected by mineralogical composition, the presence of organic matter, anthropogenic influences and in situ process such as precipitation and adsorption (Jain et al. 2005). Physicochemical analysis of sediment samples (Table 4) shows that pH of channel sediments is highly alkaline (7.98-9.8) with EC value of 12.6-22.1 Ms/cm. Organic carbon content (%) in channel sediments is in low range (1.02–1.36). Abundance of average metal contents in the sediments samples (Table 4) is in the order of Fe> Cu > Cr > Pb > Cd > Ni > Hg. Unlike channel water, Fe is the most abundant metal in bed sediments, which can be attributed to its high concentration in ferro-alloy industrial wastewater and some extent due to lateritic soil type of the area. Lateritic soil, known for their high concentrations of iron oxides, releases iron in ionic form (Fe²⁺ and Fe³⁺) in soil-water leading to higher iron content in soil (Schellmann 1986). However, rest of the metals in channel sediment do not strictly follow their abundance sequence as in the water samples. This may be due to the preferential chelation and deposition of some of the metals over the others (Salati and Moore 2010). The measured concentrations of heavy metals in all the sampling stations are notably higher than the baseline/background value (Table 4). Comparison of average metal contents with respect to sediment quality guidelines (SQGs) reveals that Pb, Cd, Cr and Hg is higher in concentrations than PEL and ERM standards (Table 4). Elevated metal concentration in channel sediments can be corresponded to the discharge of industrial and urban wastes into the channel and also alkaline nature of water which favors precipitation of metals and subsequent accumulation in channel sediments.

Table 4 Physicochemical characteristics and heavy metal concentrations in stream sediment samples

Physicochemi- cal parameters	Analyzed value (Mean ± SD)	Background sediments value	Reference value TEC ^a	Reference value PEC ^b	Reference value PEL ^c	Refer- ence value ERM ^d
рН	8.94 ± 0.64	7.54	_	_	_	_
EC	17.46 ± 3.22	18.6	_	-	_	_
OC	1.19 ± 0.11	2.86	_	_	_	_
OM	2.04 ± 0.19	4.92	_	-	_	_
Pb	138.18 ± 16.04	11.4	35.80	128.00	91.3	110
Cd	57.29 ± 14.42	4.8	0.99	4.98	3.53	9
Cr	204.86 ± 33.45	14.2	43.40	111.00	90	145
Fe	442.45 ± 27.53	148	_	-	_	_
Cu	55.83 ± 9.68	22.46	31.60	149.00	197	390
Ni	30.18 ± 1.68	2.28	22.70	48.60	36	50
Hg	3.44 ± 0.77	0.011	0.18	1.06	0.486	1.3

Units: EC in mS/cm, organic C in % and all other parameters in mg/kg

^dERM Effect range-median (MacDonald et al. 2000)



^aTEC Threshold effect concentrations (MacDonald et al. 2000)

^bPEC Probable effect concentrations (MacDonald et al. 2000)

^cPEL Probable effect level (MacDonald et al. 2000)

Evaluation of heavy metal contamination by using indices

The concentration of metals in water and sediments can be a sensitive indicator of contaminants in the hydrological system (Jain et al. 2005). Elevated concentrations of metals in water and sediments are often related to toxic effects on the aquatic ecosystem. Contamination factor (C_f), contamination index (C_d) and modified contamination index (mC_d) were successfully used by earlier workers (Edet and Offiong 2002; Jain et al. 2005; Abrahim and Parker 2008; Gupta et al. 2010a; Nayek et al. 2013) singly or in combination with assessment of heavy metal enrichment and contamination in water and sediments.

The picture of heavy metal contamination in channel water with respect to C_f , C_d and mC_d values is presented in Table 5. Mean C_f value of heavy metals in channel water follows the order of Hg > Pb > Fe > Cr > Cd > Cu > Ni. The C_f values of Hg, Pb and Fe at all sampling sites reveal very high contamination. The contamination index (C_d) values for heavy metals at all sampling stations indicate the very

high degree of contamination (Table 5). Similarly, the measured ${\rm mC_d}$ values of channel water samples at most of the sampling stations are also high, whereas at Site 3 and Site 4 (>16) they show extremely high contamination (Table 5). The high contamination of channel water can be attributed to the direct discharge of industrial effluents and urban wastewater and disposal of waste materials over time.

Enrichment factor (EF), geo-accumulation index ($I_{\rm geo}$) and pollution load index (PLI) are often used for quantitative measurement of metal pollution in sediments. The average EF values of heavy metals in channel sediments (Table 6) follow the sequence of Hg > Cr > Ni > Pb > Cd > Fe > Cu. Among the studied metals, Hg shows extremely high enrichment at all sampling sites, while the enrichments of Cr, Ni, Pb and Cd are categories as significant enrichment in surface sediments. Cu shows moderate enrichment at all sites except Site 7 and 8, where it shows minimal enrichment. This can pose a long-term environmental hazard as there may be the possibility of heavy metals leaching into soil layers (Lu et al. 2015). The mean $I_{\rm geo}$ value of heavy metals in channel sediments (Fig. 2) is in the order of Hg (7.67) > Cr (3.25) > Ni

Table 5 Contamination factors (C_f) , degree of contamination (C_d) and modified degree of contamination (mC_d) of heavy metals in stream water samples

Sites	$C_{ m f}$							$C_{\rm d}$	mC_d	
	Pb	Cd	Cr	Fe	Cu	Ni	Hg			
Site 1	27.96	0.17	0.27	7.76	0.09	0.06	62.48	98.78	14.11	
Site 2	25.26	0.16	0.26	7.42	0.08	0.06	60.25	93.48	13.35	
Site 3	29.40	0.17	0.24	7.28	0.08	0.05	99.60	136.83	19.55	
Site 4	27.89	0.17	0.23	6.95	0.09	0.07	86.10	121.50	17.36	
Site 5	24.70	0.16	0.22	6.77	0.09	0.06	64.65	96.65	13.81	
Site 6	22.84	0.15	0.21	6.44	0.08	0.06	57.35	87.13	12.45	
Site 7	21.75	0.15	0.20	6.95	0.07	0.05	48.85	78.02	11.15	
Site 8	20.20	0.14	0.19	6.16	0.07	0.05	45.10	71.91	10.27	
Min	20.20	0.14	0.19	6.16	0.07	0.05	45.10	71.91	10.27	
Max	29.40	0.17	0.27	7.76	0.09	0.07	99.60	136.83	19.55	
Mean	25.00	0.16	0.23	6.97	0.08	0.06	65.55	98.04	14.01	

Table 6 Enrichment factors (EF) and pollution load index (PLI) of heavy metals for sediment samples

Sites	EF							PLI
	Pb	Cd	Cr	Fe	Cu	Ni	Hg	
Site1	12.62	15.13	17.33	3.31	2.84	13.80	313.64	14.49
Site2	10.78	14.03	16.72	3.19	2.77	13.36	294.55	13.64
Site3	14.72	15.73	16.17	3.06	2.62	12.82	420.00	14.88
Site4	13.03	13.00	15.41	2.94	2.95	14.29	374.55	14.28
Site5	12.42	11.71	13.96	2.87	2.68	13.80	349.09	13.34
Site6	11.91	9.03	13.21	2.75	2.33	13.28	301.82	12.03
Site7	11.12	8.58	11.44	2.95	1.89	12.34	256.36	10.98
Site8	10.36	8.28	11.18	2.86	1.82	12.19	192.73	10.23
Min	10.36	8.28	11.18	2.75	1.82	12.19	192.73	10.23
Max	14.72	15.73	17.33	3.31	2.95	14.29	420.00	14.88
Mean	12.12	11.93	14.43	2.99	2.49	13.24	312.84	12.98



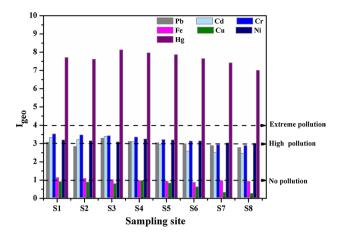


Fig. 2 Geo-accumulation index ($I_{\rm geo}$) of heavy metals for sediment samples in various sampling sites

(3.14) > Pb (3.01) > Cd (2.95) > Fe (0.99) > Cu (0.71), consistent with the enrichment factors (EF) in channel sediments. The I_{geo} values for Cu at all sites are < 1 indicating no pollution in channel sediments (Fig. 2). Similarly, the I_{geo} values of Fe at Site 4 to Site 8 are < 1, indicating no pollution at these sampling stations. The I_{geo} values for Cr at Site 7, 8, Pb at Site 2, 6, 7, 8 and Cd at Site 5, 6, 7, 8 show moderate pollution. I_{geo} values of Ni at all sites, Cr at Site 1 to Site 6 and Pb at Site 1, 3, 4, 5 and Cd at Site 1 to Site 4 indicate high pollution (Fig. 2). The highest I_{geo} value is observed for Hg at all the sampling sites, exhibiting "extremely polluted" condition of channel sediments. Strong positive correlations (p < 0.05) between EF with I_{geo} values for heavy metals may be due to similar levels of metal enrichment and accumulation rate/pattern in channel sediments. Pollution load index (PLI) for heavy metals, viz. in channel sediments, was computed for each sampling station. The integrated PLI of heavy metals in sediment samples ranged from 10.23 to 14.98 (Table 6), indicating the very high degree of metal pollution (PLI>1) in channel sediments.

Ecological risk assessment

The potential environmental risk of heavy metals in water sediments is associated with both their total content and their speciation (Jain et al. 2005; Nayek et al. 2013). Two sets of guidelines are commonly used to evaluate ecotoxicity of heavy metals in sediments; the effects range low/median (ERL/ERM) and threshold/probable effect level (TEL/PEL). Probable effect level (PEL) and effective range medium (ERM) represent chemical concentrations above which adverse effects are likely to occur (MacDonald et al. 2000). Among the studied metals, only Cu and Ni are lower in concentration than the recommended sediment quality guidelines (SQGs) for probable effect level (PEC). For a more realistic measure of the sediment toxicity, mean quotients were introduced (Shakeri et al. 2016).

$$PELQ = \frac{\sum_{i=1}^{n} M_i / PEL_i}{n},$$

$$ERMQ = \frac{\sum_{i=1}^{n} M_i / ERM_i}{n},$$

where the PELQ and ERMQ factors are the average ratios between the metal concentration in the channel sediment samples (M_i) and the related PEL and ERM values for the element i (PEL $_i$, ERM $_i$) and n is the number of metals. The gradation of sediment quality based on PELQ and ERMQ value is shown in Table 7. The calculated PELQ and ERMQ for the heavy metals in channel sediments at various sampling sites are represented in Fig. 3. Sediment samples based on these factors are highly toxic in heavy metal content for all the sampling stations except Site 8 (ERMQ = moderate toxic).

The potential ecological risk index (RI) is used to evaluate the toxicity of metals in the sediment (Hakanson 1980). According to this method, the potential ecological risk factor (E_r^i) for a single element and the potential ecological RI of multi-element can be computed by the following equation:

$$RI = \sum_{i=1}^{n} E_r^i = \sum_{i=1}^{n} C_f^i \times T_r^i$$

where C_f^i is the contamination factor for the element "i" and T_r^i is the toxic response factor for the given element of "i," which accounts for the toxic and the sensitivity requirements. The toxic response factors for Pb, Cd, Cr, Cu, Hg

Table 7 Classification of Ep, RI (Hakanson 1980), PELQ and ERMQ (MacDonald et al. 2000)

Value	Potential risk	Value	Ecological risk	Value	Degree of toxicity	Value	Degree of toxicity
$E_r < 40$	Low	RI < 150	Low	PELQ<0.1	Non toxic	ERMQ<0.1	Non toxic
$40 < E_r < 80$	Moderate	150 < RI < 300	Moderate	0.1 < PELQ < 1.5	Slightly toxic	$0.1\!<\! \mathrm{ERMQ}\!<\!0.5$	Slightly toxic
$80 < E_r < 160$	High	300 < RI < 600	High	1.5 < PELQ < 2.3	Moderately toxic	$0.5\!<\!\text{ERMQ}\!<\!1.5$	Moderately toxic
$160 < E_{\rm f} < 320$	Very High	RI>600	Very High	PELQ > 2.3	Highly toxic	ERMQ>1.5	Highly toxic
$E_{\rm f} > 320$	Dangerous						



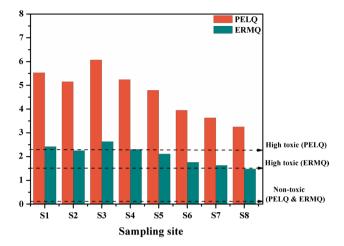


Fig. 3 PELO and ERMO of heavy metals for sediment samples in various sampling sites

and Ni were 5, 30, 2, 5, 40 and 5, respectively. Metal (viz. Fe) with E_r value < 1 is not considered for the calculations of RI. The gradation of E_r, RI, and degree of toxicity levels are shown in Table 7. The potential risk factor for individual metal in channel sediments is in the sequence of Cd > Hg > Pb > Ni > Cr > Cu. The E_r values for Cd at different sampling stations exhibit high (Site 6,7 and 8) to very high (Site 1 to 5) risk level, while Hg falls under the category of high risk except Site 8 (medium risk). The rest of the metals are very much under the low-risk category at all sampling stations (Table 8). The calculated ecological risk index (RI) values (Table 8) with respect to SQGs (PEL & ERM) for all monitored stations are classified under the category of moderate-high risk level.

Multivariate statistical approach

Multivariate statistical analyses are carried out to assess the dynamics of metal distribution and identify the potential sources in water and sediments. The correlation between two variables reflects the degree to which the variables are related.

The Pearson's correlation matrix of the various water parameters is presented in Table 9. Strong positive correlation occurs between pH and Na⁺ and pH-K⁺ revealing that alkaline nature of channel water is contributed by highly alkaline sodium and potassium hydroxides coming from the industrial source. High concentration of strong hydroxides especially sodium hydroxide (NaOH) and potassium hydroxide (KOH) is common in industrial effluents as they are used for industrial processing (such as process catalyst and caustic agent) and cleaning purposes (Nyamangara et al. 2007). Water pH shows significant positive correlation with TH, COD, and anions, viz. SO_4^{2-} , Cl⁻ and CN⁻. Biogenic nutrients, viz. NO₃⁻ and PO₄³⁻, show significant positive correlations with BOD and negatively correlation with COD, whereas SO₄²⁻ and Cl⁻ execute strong positive correlations with COD indicating their industrial source. Besides, the strong correlation also exists between TDS and EC, Na⁺-TH, COD-K⁺, COD-CN⁻. The significant positive correlation was noted between pH with all the heavy metals. TH shows strong positive correlation with Cd, Cr and Fe. COD shows significant positive correlation with Pb, Cd and Cr, whereas BOD is negatively correlated with Pb, Cd, Cr, Fe and Cu. Heavy metal loading and high pH of the channel water reduce the biodegradability of the wastewater, thereby reducing BOD (Wang et al. 2002). Among heavy metals, Pb-Cd, Pb-Cr, Pb-Fe, Pb-Hg, Cd-Cr, Cd-Fe, Cd-Cu, Cd-Hg, Cr-Fe, Cr-Cu and Cu-Ni have strong positive correlations (Table 9), indicating that their primary sources are the same, i.e., industrial discharge. These heavy metals are widely used as raw materials or process catalysts to produce alloys and steels and various other industrial purposes. As a result, they are found in significant quantities in industrial wastes/wastewater which are discharged into the Tamla channel (Gupta et al. 2013). In addition, deposition of heavy metals through industrial emissions can also be recognized as a source of metal contamination in the study area. The high correlation between heavy metals may be due to their

Table 8 Potential ecological risk factors (E_{i}^{i}) and potential ecological risk indexes (RI) of heavy metals in sediment samples

Sample Site	Er						RI
	Pb	Cd	Cr	Cu	Ni	Hg	
Site1	6.54	242.00	3.39	0.82	3.15	106.15	362.05
Site2	5.59	224.40	3.27	0.80	3.05	99.69	336.80
Site3	7.63	251.67	3.17	0.75	2.92	142.15	408.29
Site4	6.75	208.00	3.02	0.85	3.26	126.77	348.65
Site5	6.44	187.33	2.73	0.77	3.15	118.15	318.58
Site6	5.81	144.43	2.59	0.67	3.03	102.15	258.68
Site7	5.76	137.33	2.38	0.54	2.81	86.77	235.60
Site8	5.55	129.13	2.33	0.52	2.78	65.23	205.55
Mean	6.26	190.54	2.86	0.72	3.02	105.88	309.27



Table 9 Pearson's correlation matrix of analyzed variables for water samples

Variables	PH	Temp.	EC	TDS	TH	BOD	COD	NO ₃	PO ₄ ³⁻	SO ₄ ²⁻	Cl-
pН	1										
Temp.	-0.069	1									
EC	-0.489	0.101	1								
TDS	-0.216	0.214	0.756	1							
TH	0.856	-0.040	-0.738	-0.413	1						
BOD	-0.760	0.005	0.865	0.584	-0.949	1					
COD	0.848	-0.103	-0.325	-0.013	0.776	-0.653	1				
NO_3^-	-0.546	0.537	0.408	0.274	-0.645	0.580	-0.669	1			
PO_4^{3-}	-0.545	0.004	0.508	0.309	-0.566	0.623	-0.399	0.238	1		
SO_4^{2-}	0.718	0.187	-0.154	0.135	0.706	-0.580	0.857	-0.508	-0.452	1	
Cl-	0.744	-0.215	-0.165	0.114	0.456	-0.342	0.709	-0.473	-0.181	0.431	1
CN-	0.729	-0.291	-0.194	0.103	0.651	-0.520	0.789	-0.689	-0.420	0.701	0.613
Na ⁺	0.843	0.203	-0.660	-0.263	0.913	-0.870	0.700	-0.374	-0.620	0.680	0.463
K ⁺	0.784	-0.064	-0.127	0.160	0.687	-0.517	0.901	-0.538	-0.381	0.855	0.591
Pb	0.712	-0.049	-0.440	-0.161	0.786	-0.660	0.703	-0.394	-0.573	0.734	0.308
Cd	0.807	-0.244	-0.649	-0.326	0.923	-0.852	0.766	-0.667	-0.561	0.681	0.464
Cr	0.724	-0.220	-0.661	-0.438	0.907	-0.881	0.707	-0.652	-0.615	0.702	0.253
Fe	0.690	-0.145	-0.802	-0.572	0.906	-0.923	0.582	-0.513	-0.615	0.528	0.209
Cu	0.712	0.146	-0.562	-0.315	0.829	-0.778	0.576	-0.440	-0.553	0.632	0.249
Ni	0.648	0.012	-0.292	-0.181	0.623	-0.521	0.530	-0.381	-0.569	0.608	0.243
Hg	0.743	-0.102	-0.399	-0.125	0.727	-0.565	0.618	-0.301	-0.399	0.515	0.470
Variables	CN-	Na ⁺	K ⁺	Pb	Co	i C	Cr	Fe	Cu	Ni	Hg

pН Temp. EC TDS TH BOD COD NO_3^- PO₄³⁻ SO_4^{2-} Cl-CN-1 0.601 Na⁺ 1 K⁺ 0.821 0.658 1 Pb 0.515 0.753 0.673 1 Cd 0.626 0.814 0.664 0.855 0.932 0.611 0.760 0.643 0.820 1 Cr 0.459 0.816 0.518 0.765 0.891 0.939 Fe 1 Cu 0.439 0.816 0.521 0.728 0.789 0.747 0.761 1 Ni 0.470 0.618 0.558 0.695 0.604 0.598 0.547 0.8380.517 0.723 0.590 0.847 0.762 0.653 0.657 0.642 0.544 Hg 1

Values in bold are different from 0 with a significance level alpha = 0.05

similar type of distribution pattern, or may be because of similar pollution level and similar pollution source, i.e., industrial discharge (Sun et al. 2010).

To gain further insight into the source and nature of the pollutants, factor analysis with varimax rotation is used to identify a small number of factors which explain most of the



indices observed in water quality monitoring. Three factors account for cumulative variance of 77.84% (eigenvalue > 1) for the channel water samples. The factor loading matrix, eigenvalues and variances are given in Table 10. The overwhelming 59.342% of the total variance is contributed by F1, showing strong positive loading for pH, COD, SO_4^{2-} ,

Table 10 Factor loading matrix (after varimax rotation), eigenvalues and variances for water samples

Variables	F1	F2	F3
pН	0.767	0.503	-0.094
Temp.	-0.018	-0.038	0.779
EC	0.015	-0.912	0.175
TDS	0.322	-0.752	0.238
TH	0.601	0.775	-0.078
BOD	-0.391	-0.880	0.083
COD	0.886	0.287	-0.176
NO ₃	-0.494	-0.343	0.623
PO ₄ ³⁻	-0.327	-0.574	-0.084
SO_4^{2-}	0.865	0.244	0.171
Cl-	0.639	0.045	-0.296
CN-	0.813	0.170	-0.328
Na ⁺	0.609	0.700	0.198
K ⁺	0.928	0.155	-0.060
Pb	0.643	0.565	0.126
Cd	0.616	0.703	-0.184
Cr	0.524	0.757	-0.157
Fe	0.355	0.892	-0.086
Cu	0.502	0.702	0.225
Ni	0.538	0.460	0.166
Hg	0.589	0.480	0.027
Eigenvalue	13.055	2.552	1.517
Variability (%)	59.342	11.599	6.897
Cumulative (%)	59.342	70.941	77.838

Values in bold correspond to each variable to the factor for which the squared cosine is the largest

Cl⁻, CN⁻, K⁺, Pb, Ni and Hg, which seems to be related with the direct discharge of industrial effluents. Therefore, in F1, major contribution comes from industrial discharge, attributed to anthropogenic activities, and may be considered as "industrial factor." The second factor F2 explains 11.599% of the total variance and shows strong positive loading for TH, Na⁺, Fe, Cd, Cr and Cu and strong negative loadings for TDS, BOD and PO₄³⁻ which can be corresponded to runoff from surrounding agricultural fields and surface runoff influenced by both agricultural process and lithogenic factors. The third factor F3 covers 6.897% of the total variance and includes strong positive loading for temperature and NO₃⁻ which can be considered as "temporal factor" as NO₃⁻ is highly influenced by temporal variation (Wakawa et al. 2010). Some metals emerge at both F1 and F2, presumably due to the characteristics of heavy metals resulting from anthropogenic contamination.

Pearson's correlation (Table 11) for the surface sediment parameters shows negative correlation between pH-OC. Sediment EC is positively correlated with Fe, Cr, Cu, Cd and Hg, whereas OC shows negative correlation with most of the metals. Sediment pH is positively correlated with Pb, Cd, Cr, Cu, Ni and Hg, which is associated with the low mobility of these elements in the alkaline environment, and favors their adsorption and precipitation in channel sediment (Gao et al. 2013). High degree of positive correlation between specific metals (viz. Cu-Ni, Cu-Cd, Cu-Cr, Pb-Hg and Cd-Cr) and significant correlation within metals (viz. Fe-Cr, Fe-Cd and Cd-Hg) in the channel sediments may reflect identical distribution/behavior of metals during their transport in channel system, or they may have originated from the common external source. From this, it can be inferred that these heavy metals enter into the channel system through the industrial discharge and their subsequent accumulation leads to elevated metal concentrations in channel sediments (Gupta et al. 2008).

Factor loading of the surface sediments shows (Table 12) that two factors F1 and F2 account for cumulative variance

Table 11 Pearson's correlation matrix for analyzed variables in sediment samples

Variables	PH	EC	OC	Pb	Cd	Cr	Fe	Cu	Ni	Hg
pН	1		'							
EC	0.574	1								
OC	-0.437	-0.184	1							
Pb	0.940	0.724	-0.241	1						
Cd	0.534	0.969	-0.257	0.674	1					
Cr	0.463	0.910	-0.435	0.544	0.953	1				
Fe	-0.042	0.758	0.105	0.166	0.763	0.768	1			
Cu	0.622	0.766	-0.583	0.571	0.835	0.902	0.501	1		
Ni	0.574	0.443	-0.640	0.399	0.525	0.654	0.224	0.896	1	
Hg	0.938	0.768	-0.428	0.924	0.736	0.657	0.185	0.756	0.591	1

Values in bold are different from 0 with a significance level alpha = 0.05



58 Page 14 of 16 Applied Water Science (2019) 9:58

Table 12 Factor loading matrix (after varimax rotation), eigenvalues and variances for sediment samples

Variables	F1	F2
рН	0.780	0.294
EC	0.876	-0.444
OC	-0.560	-0.707
Pb	0.778	-0.005
Cd	0.899	-0.398
Cr	0.914	-0.269
Fe	0.492	-0.743
Cu	0.937	0.042
Ni	0.730	0.283
Hg	0.889	0.106
Eigenvalue	6.695	2.160
Variability (%)	60.864	19.634
Cumulative (%)	60.864	80.498

Values in bold correspond to each variable to the factor for which the squared cosine is the largest

of 80.498% (eigenvalue > 1). F1 covers 60.864% of the total variance and explains strong positive loading for pH, EC, Pb, Cd, Cr, Cu, Ni and Hg, indicating various assimilated contaminants derived from industrial and urban waste/waste-water discharge. The second factor F2 explains 19.634% of the total variance, includes strong negative loading for OC and Fe and can be corresponded with the geological process and background lithogenic factors. Therefore, it can be concluded that the source of heavy metals in channel sediments is majorly derived from industrial contamination, with a very minor contribution of Fe from geogenic sources (Gupta et al. 2010a).

Conclusion

In conclusion, this study clearly infers that the cause of heavy metal pollution in water and sediments of the monitored stream is mainly due to the industrial discharge and anthropogenic activities along the channel. The measured values of most of the water parameters and heavy metals decrease from the middle section (Site 1) to downstream stretches (Site 8) of the channel with few exceptions. Clear seasonal variation is shown by water parameters and heavy metals indicating higher concentrations in summer and lower values in the rainy season. The concentrations of Pb, Hg and Fe in the stream water exceed the IS standards, while concentrations of most of the studied metals in channel sediments (except Cu and Ni) are higher than the recommended SQGs. Metal pollution indices and multivariate statistical analysis are used to assess the variations and source of pollution in the study area, which infers that industrial discharge

is majorly responsible for the spatial variability of water parameters and heavy metal concentrations in the study area. The results of various pollution indices clearly suggest that the degree of metal contamination in channel water and sediment is in alarming stage with very high ecological risk factor, which may pose serious threat to the ecological health of the study area. This situation seeks an immediate attention. There is also need for long-term investigation on contamination load in channel water—sediment and to develop a proper management strategy with an effective treatment scheme to reduce the potential threat and sustain the ecological integrity.

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