



# Hydrochemistry, water quality and land use signatures in an ephemeral tidal river: implications in water management in the southwestern coastal region of Bangladesh

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## Abstract

Despite its complexity and importance in managing water resources in populous deltas, especially in tidal areas, literatures on tidal rivers and their land use linkage in connection to water quality and pollution are rare. Such information is of prior need for Integrated Water Resource Management in water scarce and climate change vulnerable regions, such as the southwestern coast of Bangladesh. Using water quality indices and multivariate analysis, we present here the land use signatures of a dying tidal river due to anthropogenic perturbation. Correlation matrix, hierarchical cluster analysis, factor analysis, and bio-geo-chemical fingerprints were used to quantify the hydro-chemical and anthropogenic processes and identify factors influencing the ionic concentrations. The results show remarkable spatial and temporal variations ( $p < 0.05$ ) in water quality parameters. The lowest solute concentrations are observed at the mid reach of the stream where the agricultural and urban wastewater mix. Agricultural sites show higher concentration of DO, Na<sup>+</sup> and K<sup>+</sup> reflecting the effects of tidal spill-over and shrimp wastewater effluents nearby. Higher level of Salinity, EC, Cl<sup>-</sup>, HCO<sub>3</sub><sup>-</sup>, NO<sub>3</sub><sup>-</sup>, PO<sub>4</sub><sup>3-</sup> and TSS characterize the urban sites indicating a signature of land use dominated by direct discharge of household organic waste into the waters. The spatial variation in overall water quality suggests a periodic enhancement of quality especially for irrigation and non-drinking purposes during monsoon and post-monsoon, indicating significant influence of amount of rainfall in the basin. We recommend that, given the recent trend of increasing precipitation and ground water table decrease, such dying tidal river basins may serve as excellent surface water reservoir to supplement quality water supply to the region.

**Keywords** Land use signature · Ephemeral tidal river · Water quality · Hierarchical cluster analysis (HCA) · Bio-geo-chemical fingerprint

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## Introduction

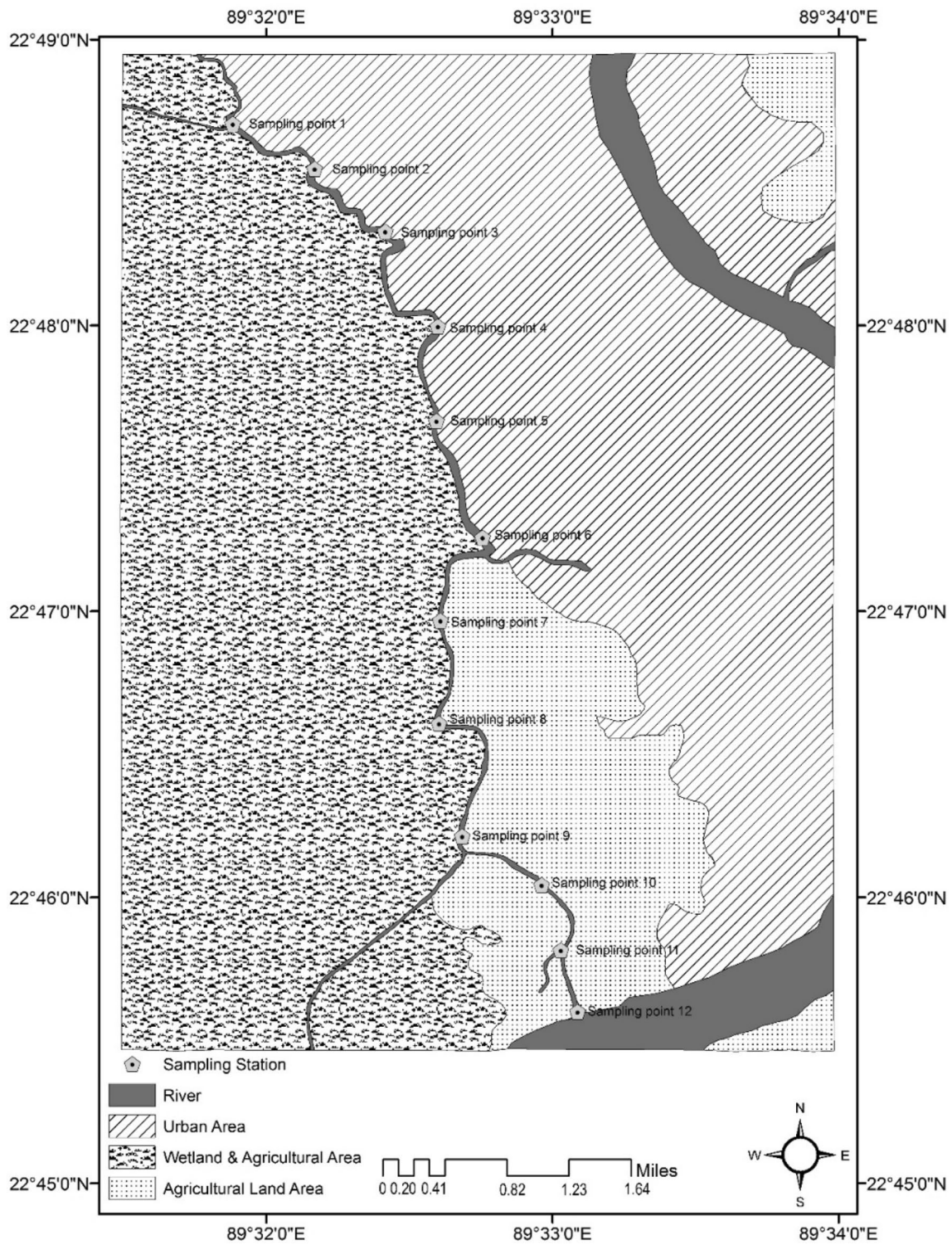
River water chemistry is controlled by many natural and anthropogenic factors. Anthropogenic factors such as land use is well known as one of the major influences on the hydrochemistry of the rivers (e.g., Rothwell et al. 2010; Pratt and Chang 2012; Huang et al. 2013a, b, etc.). Anthropogenic activities are increasing day by day leading towards conversion of pristine lands, increasing urban residences, surface water runoff, wastewater input and dwindling forested lands and wetlands. Literatures suggest the practice of land use changes has an impact spanning from local to global scale (e.g., Wilson and Weng 2010; Yang et al. 2012; Hur et al. 2014; Roy et al. 2015, etc.), ranging from changes in the global carbon cycle (e.g., Pielke et al. 2002; Kalnay and Cai 2003; Don et al. 2011; Poeplau et al. 2011, etc.), through changes in surface energy and water balance to widespread effects on water quality (e.g., Foley et al. 2005; Shen et al. 2014, 2015). It has been observed that, the water chemistry parameters synchronously vary with the changes of land use pattern (e.g., Zhou et al. 2012) and hydrological dynamics (e.g., Zhang et al. 2014). Runoff is largely affected by physical alteration of the landscapes (e.g. Tang et al. 2005; Valentin et al. 2008; Nunes et al. 2011). The relationship between water quality and land use, however, may be concealed by other factors complicating to obtain a distinct hydro-chemical signature (e.g., Kang et al. 2010; Huang et al. 2013a, b; Bu et al. 2014, etc.). Thus, the study of stream hydrochemistry is important in revealing the pattern and linkage between evaporation, chemical weathering, precipitation and anthropogenic impacts (e.g., Gibbs 1970; Meybeck 1987; Brennan and Lowenstein 2002; Rothwell et al. 2010; Tran et al. 2010; Mitchell et al. 2013). Quantifying the major ion composition of stream waters also has broad implications, i.e., water type, hydrogeology characteristics, weathering processes and rainfall chemistry. These researches featured in scientific literatures over 50 years (e.g., Gibbs 1970; Brennan and Lowenstein 2002; Nordstrom 2011). Understanding how land use and land cover change influence the flow and water quality of rivers is of utmost importance for river management and restoration (e.g., Barbosa et al. 2012; Huang et al. 2013a, b).

However, despite land use and its linkage with hydrochemistry being center of attention to many researchers in the recent past, tidal rivers in populous deltas have attracted little attention. Tidal rivers in coastal deltas are dynamic in terms of variations in settings (e.g. Well 1995); changes of courses (e.g., Zhang et al. 2010), rate of accretion and erosion (e.g., Rogers et al. 2013) and the amount of water discharge/intake over short period. Such characteristics of tidal rivers lead to dynamic changes to coastal

landscape. Due to high diversity and biological resources, such river basins are also exposed to maximum human perturbation resulting in various land use (e.g., Auerbach et al. 2015; Gain et al. 2017; Mutahara et al. 2017). The dynamism of tidal rivers, frequent changes in flow and multipurpose use of land resources poses complex impacts of the hydrochemistry and water quality. Therefore, integrated water resource management in such regions is quite difficult and requires in-depth research efforts and high-resolution monitoring data.

The southwestern costal region of Bangladesh is one of top vulnerable regions in the world due to Climate Change (CC) and Sea Level Rise (SLR) (e.g. Mondal et al. 2013; Auerbach et al. 2015, Roy et al. 2017). The region is also one of the examples of massive anthropogenic perturbation and degradation in water quality (e.g. Brammer 2010; Auerbach et al. 2015; Ayers et al. 2016, 2017; Roy et al. 2017). Our study area concentrates on the Mayur river basin, a major tributary of the Bhairab river system (Fig. 1). The Bahiarab river system is one of the major systems that flows through the southwest delta of Bangladesh. This heavily populated delta (~ 14 million, calculated from BBS 2011) has evolved around this river. Originated from a beel (wetland system) river Mayur contributes fresh water to the Bhairab system and provides irrigation for ~48,000 ha of farmland. Besides the river supports aquaculture and provides base flow for the surrounding groundwater system. Over last 30 years Mayur has become an ephemeral tidal river and now-a-days gets disconnected from its source during dry season. However, tidal influence is quite active at the confluence with the river Bhairab. The river, besides irrigation and aquaculture, is used as the municipal wastewater drainage along with industrial discharges from ~ 1500 industries and factories. Because of the rivers ephemeral character, its capacity to assimilate and eliminate pollutants from water is gradually reducing. In the context of declining ground water table in the city (Fig. 2), salinity intrusion and growing demand for potable water, search for an alternative water source is now of utmost importance. The state of current water chemistry, land use pattern in the drainage basin, rainfall runoff, water use conflicts, etc. can be major determinants for the potentiality of the Mayur as an option. To start with, this river deserves a deeper insight to its chemistry and sources of pollution.

Researchers have employed many statistical applications all over the world to investigate the linkage between land use and water quality. These applications include Correlational Analysis (CA) (e.g., Bu et al. 2014), Multiple Regression Analysis (MRA) (e.g., Kang et al. 2010), Redundancy Analysis (e.g., Shen et al. 2015) and Principal Component Analysis (PCA) (e.g., Villegas et al. 2013). In this study, major ion composition of the Mayur River has been examined and spatio-temporal patterns indicative of their source

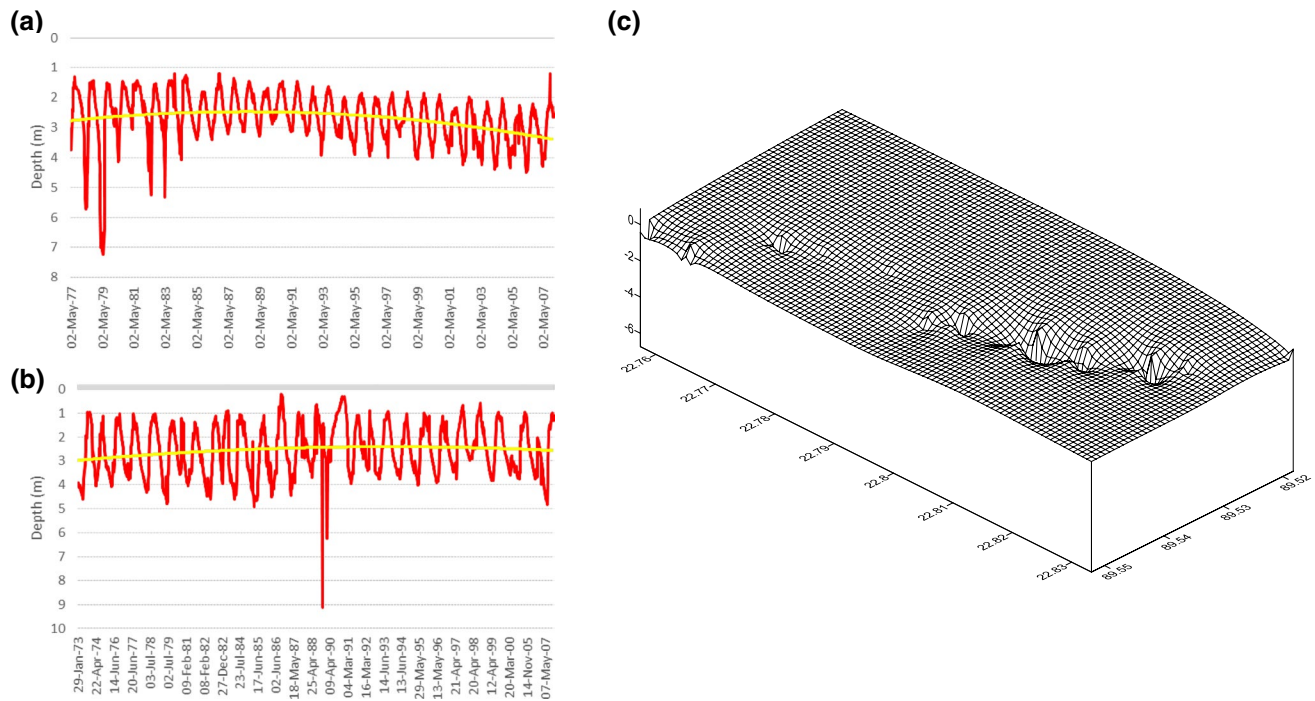


**Fig. 1** Distribution of sampling points and major land use pattern in the Mayur River basin

are investigated as well as the control mechanisms of ion chemistry is explained through various multivariate statistics and water quality indices. In addition, this dying tidal river’s potential as a surface water resource has been inspected

through drinking and irrigation water quality analysis. It should be noted that, although use of multivariate techniques to identify the linkage between hydrochemistry and land use is quite common and popular in scientific community to





**Fig. 2** Measurements of groundwater tables over 1987–2007 in two observation wells in the basin area (**a**, **b**). **c** Exhibits the bathymetric measurement of the river basin

reveal the management strategy, this is the first attempt to apply such a technique for a tidal river in Bangladesh.

## Study area

Our study concentrates on the tidal river basin of Mayur, located at the back swamp of the river Bhairab. The river is originated from a large wetland system called beel Pabla and nowadays is ~11 km long with 22 canals and one river joining in its course. While its right bank is industrialized and receives municipal and industrial waste, the left bank characterized with wetlands and agricultural lands being irrigated with its water (Fig. 1). Due to the river's geographical location, the river shares the basin of river Bhairab's large tidal basin. Although river Mayur serves fresh water to the river Bhairab during monsoon and post-monsoon, tidal impacts are heavy at the confluence of these rivers. Because of wastewater discharge to this river, it is also subject to a massive anthropogenic perturbation (Rahman et al. 2014). It is embanked on both heads to create land for aquaculture. A large 10-vent sluice gate controls the southern end of the river (lower reach) to control tidal floodwater from river Bhairab. The northern end (upper reach) is also embanked to reserve beel Pabla's water. These interventions practically accelerated the death of the river. However, the river still

serves irrigation water for the whole basin and plays critical role in maintaining the local groundwater table.

The river basin is composed of various morphological features such as flood plain, flood basin, swamp, and abandoned channel (Roy et al. 2005). The elevation of this tidal basin varies between 1.2 and 3.8 m. The region lies on the Ganges deltaic plain in north and Ganges tidal plain in south of Holocene–Recent age (Adhikari et al. 2006). Tectonically, the area lies within the Faridpur Trough of Foredeep Bengal Basin. No subsurface fault has been demarcated in the region. Lithologically, the area is composed of very fine sand, silt and silty clay up to a depth of 300 m with peaty soil and calcareous as well as non-calcareous soil at the top.

## Materials and methods

### Sampling and analysis

Surface samples were collected from the river and its adjoining canals over four seasons: pre-monsoon, monsoon, post-monsoon and winter. Samples were collected at depths 40–50 cm from the water surface approximately at the middle parts of the river. The water samples were filtered (0.45 Millipore filter) in the field and stored in acid washed polypropylene bottles. Cleaning of plastic bottles and plastic bags was carried out by soaking in 5% (v/v) HNO<sub>3</sub> for

24 h and then rinsing with milli-Q water. After collection of water samples, the bottles were securely sealed with proper labeling (sample number, location name and date). Aeration during sampling was avoided as far as possible. The water samples were carefully transported to the laboratory and preserved for chemical analysis. Total analysis was carried out within 15 days of collection. The detail sampling and analytical methods for the water samples have been described elsewhere (APHA 1992; Ramesh and Anbu 1996).

Physical measures such as pH, electrical conductivity (EC), dissolved oxygen (DO) and total dissolve solids (TDS) were determined by portable water quality multiprobe meter (HACH Hydrolab Multiparameter Sonde 4a) in field.  $\text{Na}^+$  and  $\text{K}^+$  were measured by Flame photometric method (Flame photometer—models PEP 7), and  $\text{Ca}^{2+}$  and  $\text{Mg}^{2+}$  were determined by titrimetric method (Ramesh and Anbu 1996).  $\text{HCO}_3^-$  was analyzed by potentiometric method while  $\text{Cl}^-$  was quantified by ion electrode method (Cole-Parmer R 27502-22, -23).  $\text{PO}_4^{3-}$  and  $\text{SO}_4^{2-}$  were determined by ascorbic acid method and turbidimetric method, respectively (Thermo spectronic UV–visible spectrophotometers, Helios 9499230 45811) and dissolve silica ( $\text{H}_4\text{SiO}_4^{2-}$ ) was analyzed by molybdo-silicate method (Thermo spectronic, UV–visible Spectrophotometers, Helios 9499230 45811) (Ramesh and Anbu 1996).

### Basin delineation and bathymetric survey

The Mayur River watershed was divided into three zones through integrated watershed delineation using DEM

dataset provided by SRTM v.4.1 and land use characters were obtained from Khulna Development Authority (kDa). River cross-sections were taken along 12 chains to calculate Mayur's water retention capacity. Calculation was done using the trapezoidal volume equation. The adjoining 22 canals and one distributary were not considered for cross-sectional measurements.

### Multivariate analysis

Pearson correlation analysis for Mayur basin was carried out to evaluate the relationships between various physiochemical parameters, with statistical significance set at  $p < 0.05$  and  $p < 0.01$ . Hierarchical cluster analysis (HCA) and factor analysis (FA) were performed to reveal the underlying structure of the dataset by means of distance between variables in a multi-dimensional space. Ward linkage with Euclidean distance was used for HCA. Principal component analysis (PCA) with Varimax rotation was used for extraction and deriving factor derivation in FA. The statistical processes and their applications are stated elsewhere (e.g., Singh et al. 2004).

## Results

### Spatio-temporal characteristics of hydrochemistry

A summary of the hydrochemistry of the study area is presented in Table 1. Hydro chemical parameters show

**Table 1** Summary hydrochemical composition of the Mayur River basin

Parameter	Pre-monsoon	Monsoon	Post-monsoon	Winter
DO	3.00 ± 1.28	4.44 ± 2.64	6.21 ± 0.70	4.93 ± 2.35
Water temperature	32.02 ± 2.31	33.71 ± 2.46	28.42 ± 0.77	19.96 ± 1.27
pH	6.78 ± 0.42	7.03 ± 0.27	6.87 ± 0.49	7.19 ± 0.17
Salinity	9.88 ± 3.33	1.11 ± 0.87	0.39 ± 0.05	0.60 ± 0.23
EC	987.50 ± 333.31	2352.54 ± 1965.08	721.92 ± 99.18	1290.58 ± 411.29
$\text{Na}^+$	575.06 ± 336.67	340.00 ± 422.20	240.14 ± 324.20	218.80 ± 90.87
$\text{K}^+$	164.27 ± 63.69	21.61 ± 12.79	21.23 ± 11.74	14.93 ± 5.56
$\text{Ca}^{2+}$	41.21 ± 13.64	73.81 ± 7.40	43.50 ± 4.54	50.26 ± 11.77
$\text{Mg}^{2+}$	74.35 ± 35.02	51.85 ± 44.63	15.85 ± 5.87	24.36 ± 9.04
$\text{Cl}^-$	330.87 ± 107.65	641.05 ± 683.81	124.69 ± 25.67	240.77 ± 101.13
$\text{HCO}_3^-$	350.32 ± 174.58	334.32 ± 101.53	204.04 ± 41.08	346.38 ± 121.50
$\text{SO}_4^{2-}$	307.12 ± 209.54	143.85 ± 84.44	22.66 ± 7.55	18.79 ± 7.45
$\text{NO}_3^-$	7.34 ± 4.63	2.55 ± 1.03	3.24 ± 2.63	4.70 ± 1.86
$\text{PO}_4^{3-}$	6.43 ± 6.79	0.33 ± 0.14	1.48 ± 0.76	4.45 ± 2.98
$\text{SiO}_2$	4.55 ± 1.23	8.27 ± 4.24	4.62 ± 1.23	31.98 ± 18.12
TDS	1861.51 ± 438.22	1617.65 ± 1068.51	681.45 ± 344.19	935.92 ± 322.64
TSS	9749.17 ± 4104.80	1781.67 ± 2284.14	118.33 ± 64.91	2267.08 ± 650.09

Values reported as average ± standard deviation in mg/L except for EC ( $\mu\text{S}/\text{cm}$ ), pH, salinity (ppt) and temperature ( $^\circ\text{C}$ )

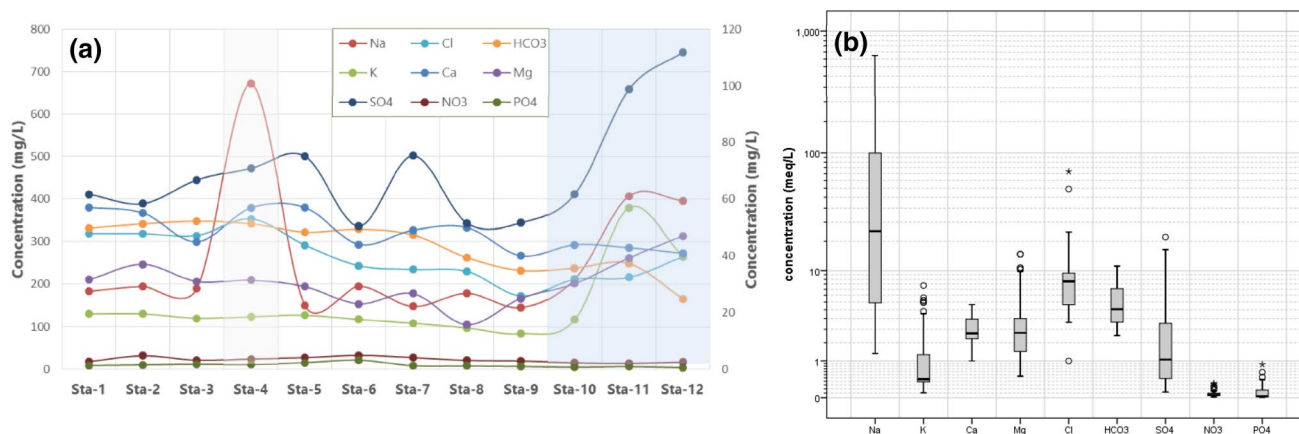
remarkable spatio-temporal differences ( $p < 0.05$ ). DO, Salinity, EC and TDS rise about two orders of magnitude from pre-monsoon to post-monsoon. Of the cation budget,  $\text{Na}^+$  shares the major load (69.7%, averaged over four seasons). Second to  $\text{Na}^+$ ,  $\text{K}^+$  shows highest load (21% of total cationic load) in pre-monsoon, while  $\text{Ca}^{2+}$  shares the second highest cationic load in every other season (29.63% in monsoon, 23.16% in post-monsoon and 14.40% in dry season).  $\text{Mg}^{2+}$  has been found as the least abundant cation. The cationic order was found as:  $\text{Na}^+ > \text{K}^+ > \text{Ca}^{2+} > \text{Mg}^{2+}$ .  $\text{Cl}^-$  dominates the anionic load (43.20%, averaged over four seasons) with an average of  $334.34 \pm 399.02$  mg/L followed by  $\text{HCO}_3^-$  (39.90%, average  $308.78 \pm 134.16$  mg/L). The mean values of  $\text{Cl}^-$  and  $\text{HCO}_3^-$  load are nearly equal.  $\text{HCO}_3^-$  load over total anions vary significantly over seasons, showing an increasing trend from pre-monsoon (33.58%, median value) towards dry season (59.40%, median value). Beside  $\text{Cl}^-$  and  $\text{HCO}_3^-$ , the other most abundant anion is  $\text{SO}_4^{2-}$  (avg.  $123.11 \pm 163.10$  mg/L) which also shows a marked temporal variation and decreasing trend on total anion load from pre-monsoon (30.93%, median value 287.79 mg/L) towards dry season (3.04%, median value 20.22 mg/L).  $\text{NO}_3^-$  and  $\text{PO}_4^{3-}$  are least abundant anions found ( $5.97 \pm 2.73$  and  $5.03 \pm 0.35$  mg/L, respectively). The anionic order was found as  $\text{Cl}^- > \text{HCO}_3^- > \text{SO}_4^{2-} > \text{NO}_3^- > \text{PO}_4^{3-}$ .

Significant spatial variations of major ions may indicate the origin of water chemistry at sub-watershed level (e.g., Chen et al. 2002). The distribution of physico-chemical parameters over high tide and low tide separated by head waters and tail waters may give better insight while investigating possible source of the ions. With temporal variation, the major ions also show significant spatial variation (Fig. 3). Of the major ions  $\text{Na}^+$ ,  $\text{K}^+$ ,  $\text{Mg}^{2+}$ ,  $\text{Cl}^-$ ,  $\text{SO}_4^{2-}$ ,  $\text{NO}_3^-$  and  $\text{PO}_4^{3-}$  show high spatial variation

over the full cycle of sampling (C.V.  $> 50$ ) in the order of  $\text{PO}_4^{3-} > \text{SO}_4^{2-} > \text{K}^+ > \text{Cl}^- > \text{Na}^+ > \text{Mg}^{2+} > \text{NO}_3^-$ . Generally abundance of major ions decreases from upper reach to lower reach. Except  $\text{HCO}_3^-$  all the major ions show rising trend towards the discharge point. This confirms the strong tidal influence in these sampling stations.

### Major ion composition and correlation

Pearson correlation was examined among the major ions and other physical parameters measured (Table 2). Significant ( $p < 0.05$ ) and strong ( $r \geq 0.80$ ) correlations have been found between salinity and  $\text{Na}^+$ ,  $\text{K}^+$ , TDS and TSS;  $\text{Na}^+$  and  $\text{K}^+$ , and TDS and TSS;  $\text{K}^+$ , and TDS and TSS; and TDS and TSS. Significant ( $p < 0.05$ ) and moderate ( $r \geq 0.60$  to  $< 0.80$ ) correlations have been found between DO and  $\text{HCO}_3^-$  (negative); temperature and  $\text{SiO}_2$  (negative); salinity and  $\text{SO}_4^{2-}$  and  $\text{Mg}^{2+}$ ; EC with  $\text{Cl}^-$ ;  $\text{Na}^+$  with  $\text{Mg}^{2+}$  and  $\text{SO}_4^{2-}$ ;  $\text{K}^+$  with  $\text{Mg}^{2+}$  and  $\text{SO}_4^{2-}$ ;  $\text{Mg}^{2+}$  and  $\text{Cl}^-$ ,  $\text{SO}_4^{2-}$ , TDS and TSS;  $\text{HCO}_3^-$  and  $\text{PO}_4^{3-}$ ; and  $\text{SO}_4^{2-}$  and TDS and TSS. While  $\text{Cl}^-$  shows very weak (0.088) and insignificant ( $p \gg 0.05$ ) correlation with salinity, strong to moderate correlation between salinity and  $\text{Na}^+$ ,  $\text{K}^+$ ,  $\text{Mg}^{2+}$  and  $\text{SO}_4^{2-}$  suggests that it may originate from the urban wastewater released in the head waters of the river. As  $\text{Na}^+$  significantly ( $p < 0.05$ ) and moderately ( $r \geq 0.60$  to  $< 0.80$ ) correlated with  $\text{Mg}^{2+}$  and  $\text{SO}_4^{2-}$ , while  $\text{Mg}^{2+}$  is further correlated with  $\text{Cl}^-$  and  $\text{SO}_4^{2-}$ , it is most likely that  $\text{Na}^+$ ,  $\text{Mg}^{2+}$ ,  $\text{Cl}^-$  and  $\text{SO}_4^{2-}$  may share the same origin. The significant association of  $\text{HCO}_3^-$  and  $\text{PO}_4^{3-}$  ( $p < 0.01$ ,  $r = 0.627$ ),  $\text{NO}_3^-$  and  $\text{HCO}_3^-$  ( $p < 0.01$ ,  $r = 0.458$ ) and  $\text{NO}_3^-$  and  $\text{PO}_4^{3-}$  ( $p < 0.01$ ,  $r = 0.407$ ) also indicative soil leaching and agricultural runoff.



**Fig. 3** Distribution of major ions in Mayur River basin: **a** spatial distribution from north to south; **b** overall variations in Box-Whisker's plot. The figure does not include samples from the adjoining canals

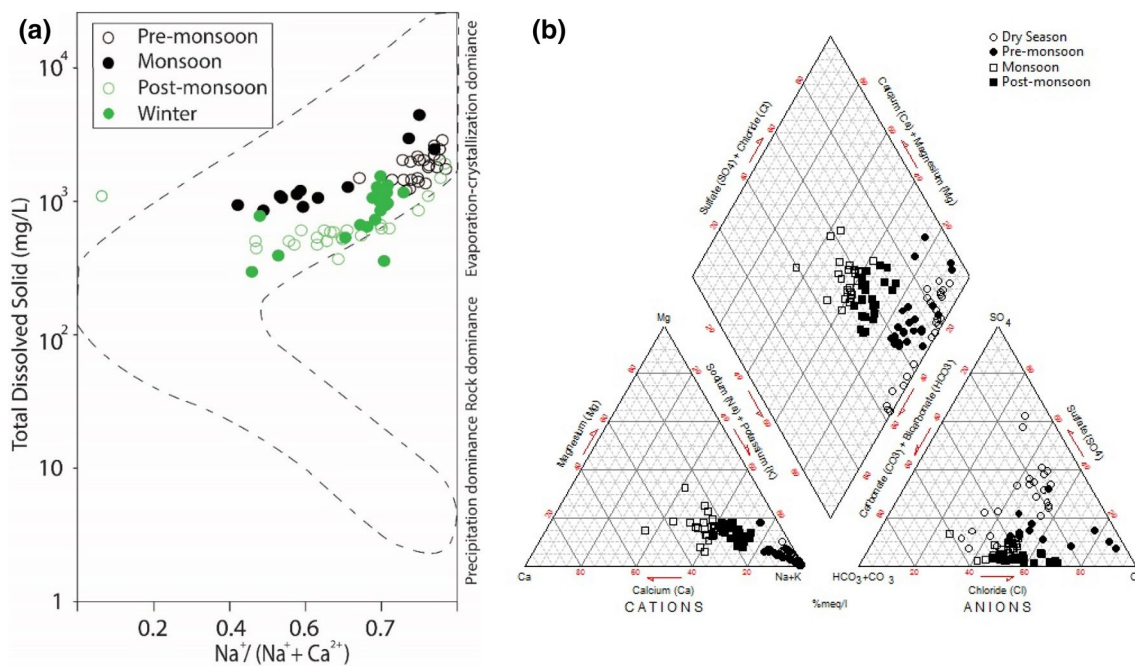
**Table 2** Pearson correlation matrix for major ion chemical composition and physical parameters in the Mayur River, Khulna, Bangladesh ( $n = 96$ )

	DO	pH	Salinity	EC	Na	K	Ca	Mg	Cl	HCO <sub>3</sub>	SO <sub>4</sub>	NO <sub>3</sub>	PO <sub>4</sub>	H <sub>2</sub> SiO <sub>4</sub>	TDS	TSS
DO	1															
pH	.335**	1														
Salinity	-.334**	-.092	1													
EC	.028	.351**	.014	1												
Na <sup>+</sup>	-.260*	-.028	.936**	-.047	1											
K <sup>+</sup>	-.323**	-.145	.920**	-.069	.847**	1										
Ca <sup>2+</sup>	.006	.171	-.220*	.547**	-.210*	-.200	1									
Mg <sup>2+</sup>	-.134	.124	.694**	.402**	.682**	.626**	.257*	1								
Cl <sup>-</sup>	.029	.107	.088	.600**	.048	.103	.546**	.714**	1							
HCO <sub>3</sub> <sup>-</sup>	-.702**	-.341**	-.048	-.026	-.153	.000	.095	-.188	-.029	1						
SO <sub>4</sub> <sup>2-</sup>	-.239*	-.002	.781**	.172	.711**	.715**	.107	.746**	.371**	-.118	1					
NO <sub>3</sub> <sup>-</sup>	-.391**	-.311**	.287**	-.229*	.278**	.389**	-.279**	-.005	-.159	.458**	.053	1				
PO <sub>4</sub> <sup>3-</sup>	-.494**	-.394**	.162	-.191	.057	.166	-.396**	-.097	-.110	.627**	-.063	.407**	1			
H <sub>2</sub> SiO <sub>4</sub>	-.154	.224*	-.279**	.014	-.250*	-.287**	.065	-.205*	-.086	.321**	-.289**	.100	.175	1		
TDS	-.288**	-.028	.942**	.045	.986**	.861**	-.114	.778**	.202*	-.110	.775**	.268**	.065	-.249*	1	
TSS	-.310**	.021	.942**	.077	.911**	.861**	-.118	.696**	.102	-.039	.720**	.287**	.117	-.135	.917**	1

Data set includes tidal cycles and seasonal variations over 12 stations

\*Correlation is significant at the 0.05 level (2-tailed)

\*\*Correlation is significant at the 0.01 level (2-tailed)



**Fig. 4** **a**  $\text{Na}^+(\text{Na}^+ + \text{Ca}^{2+})$  versus total dissolved solids (TDS), after Gibbs (1970); **b** Piper trilinear diagram (Piper 1944) showing ion composition over the sampling period

## Water types

Plotting of TDS concentrations against the weight ratios of  $\text{Na}/(\text{Na} + \text{Ca})$  for the upper Mayur river revealed (Gibbs 1970) that the river water is characterized by a very high ratio of  $\text{Na}/(\text{Na} + \text{Ca})$  and a high TDS concentration (mostly  $> 1000$  mg/L during winter, pre-monsoon and monsoon) (Fig. 4a), typical of evaporation–crystallization dominated rivers. To be further in depth, Piper trilinear diagram (Piper 1944) of major ion compositions was constructed (Fig. 4b). The plot shows a cyclic pattern of data association. In pre-monsoon the data points cluster around the salinity apex with some exceptions, which are clustered towards high-alkali apex. The data points that cluster around the alkali apex are found as headwater samples. This confirms presence of high alkali in the headwaters during the season which causes the excessive salinity as inferred from Pearson correlation (Table 2). In monsoon most of the data points move towards the upper mid of the diamond plot indicating a dilution effect and improving water quality. The cation plot suggests a reduction of  $\text{Na}^+$  and  $\text{K}^+$  takes while calcium enrichment is taking place. The anion plot also suggests a marked reduction in  $\text{SO}_4^{2-}$  with  $\text{HCO}_3^-$  enrichment. In post-monsoon the data points further move down to the mid of the diamond plot with wide distribution with further addition of  $\text{HCO}_3^-$  and further reduction of  $\text{SO}_4^{2-}$ . Although the cations are found widely distributed, it still indicates a slight reduction of both  $\text{Ca}^{2+}$  and  $\text{Mg}^{2+}$  and addition of  $\text{Na}^+$

and  $\text{K}^+$ . In winter, data points tend to move slightly towards the salinity apex with additional  $\text{Na}^+$ ,  $\text{K}^+$  and  $\text{HCO}_3^-$  input and further reduction of  $\text{Ca}^{2+}$  and  $\text{SO}_4^{2-}$ .

## Discussion

### Mechanisms controlling the major ion chemistry

#### Cyclic salts

Rainwater runoff and ground water discharge are the major sources of base flow in the Mayur River. Therefore, cyclic sea salts in the dissolved load of the river is expected to carry the signatures of rainfall and groundwater in the region. Generally, the contribution of cyclic salts to riverine dissolved salt loads is expected to decrease with increasing distance from the sea. It has been long established that,  $\text{Cl}^-$  in river waters with no terrestrial sources of the element declines systematically as a function of increasing distance from the sea (Stallard and Edmond 1981). The reverse has been found in the Mayur River. Although the basin of Mayur is small ( $\sim 11$  km long river with  $52$  km<sup>2</sup> basin area) increasing amount of  $\text{Cl}^-$  towards the upper reaches is noticeable. While  $\text{Cl}^-$  was found as 217 mg/L in the lower reaches of the river (average value of four most downstream stations), upper reaches show 326.8 mg/L of  $\text{Cl}^-$  (average value of four most upstream stations). This indicates the high



concentration of  $\text{Cl}^-$  in the Mayur River likely to be originated from either weathering of evaporites or anthropogenic inputs. However, The 22 drains discharging urban effluents into the river cancels out the possibility of evaporites being the major contributing source of  $\text{Cl}^-$  in the river and indicates that the source of water in river Mayur is mostly urban waste rather than rainfall and groundwater discharge.

## Weathering

The Piper trilinear plot (Fig. 4b) demonstrates significant variation in water types over the year. From winter towards pre-monsoon data points cluster more towards the salinity apex (Na- $\text{SO}_4$  type), while  $\text{Na}^+$  and  $\text{Cl}^-$  remain more or less same for the both cases but  $\text{SO}_4^{2-}$  increases in the pre-monsoon compared to the winter samples. In the cations trilinear plot, data points move more towards the Na apex from winter to pre-monsoon suggesting additional  $\text{Na}^+$  discharge to the dissolved load. In the anion plot, while data points cluster around high  $\text{HCO}_3^-$  and low  $\text{SO}_4^{2-}$  in winter, pre-monsoon is marked with  $\text{SO}_4^{2-}$  enrichment replacing  $\text{HCO}_3^-$ . This exhibits the effect of lack of rainfall in winter followed by pre-monsoon, consequently increasing the pollution effect, as  $\text{HCO}_3^-$  concentration does not change much (med. value 394 mg/L in winter and 312 mg/L in pre-monsoon) but  $\text{SO}_4^{2-}$  concentration increases from 20.22 mg/L in winter (median value) to 287.78 mg/L in pre-monsoon (median value). In monsoon and post-monsoon, in contrast to that of winter and pre-monsoon, data points float widely in the middle of the diamond plot. However, in monsoon, a reduction of  $\text{Na}^+$  and enrichment of  $\text{Ca}^{2+}$  is noticed, indicating a dilution effect. Post-monsoon data points show wide and variant combination of  $\text{Na}^+$ ,  $\text{Ca}^{2+}$  and  $\text{SO}_4^{2-}$  suggesting infrequent freshwater mixing with pollution caused by irregular and but intense rainfall.

Wide distribution of data points in the trilinear plot indicates the influence of anthropogenic activities in the dissolved load rather than weathering effects. The concentration ratio of  $\text{HCO}_3^-/\text{Cl} + \text{SO}_4/\text{SiO}_2$  has been found as 31:36:1 in the dissolved load and the correlation between  $\text{SiO}_2$  and  $\text{Ca}^{2+}$ ,  $\text{K}^+$ ,  $\text{HCO}_3^-$  and  $\text{SO}_4^{2-}$  are negative and very weak ( $< 0.31$ ) but significant (Table 2). This suggests that silicate weathering plays a less important role in determining major ions for the whole basin. Again, most of the data point fall below the equiline of  $\text{HCO}_3^-/\text{Cl} + \text{SO}_4$  (Fig. 5a) and  $\text{HCO}_3^-/\text{Na} + \text{K}$  (Fig. 5b) and cluster around the equiline of  $\text{HCO}_3^-/\text{Ca} + \text{Mg}$  (Fig. 5c) indicating that the weathering of carbonates and/or evaporites cannot explain the whole composition of  $\text{Ca}^{2+}$  and  $\text{Mg}^{2+}$  in the water. While most of the data points fall below the isometric line of  $\text{Ca} + \text{Mg}/\text{Na} + \text{K}$  (Fig. 5d) and  $\text{Cl} + \text{SO}_4/\text{Na} + \text{K}$  (Fig. 5e), almost all data points clustering above the  $\text{Cl} + \text{SO}_4 = \text{Ca} + \text{Mg}$  line (Fig. 5f) indicate that

neither evaporite weathering nor the carbonate weathering is the dominant process in the basin.

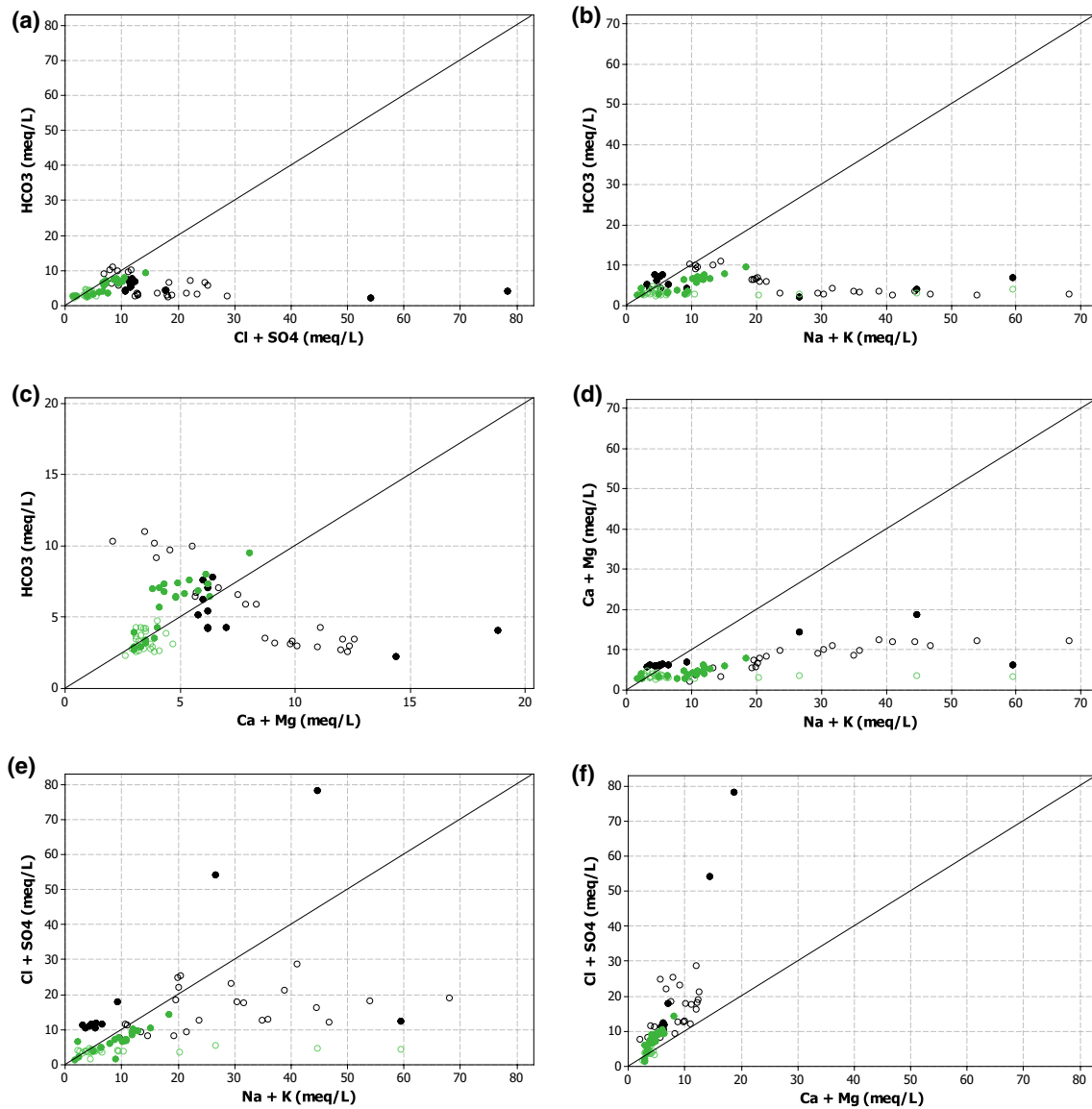
High concentration of  $\text{Na}^+$  and  $\text{Cl}^-$  in natural waters usually indicates halite dissolution which may not be case in this river basin. In majority of the cases (~66%)  $\text{Na}^+$  has been found comparatively lot higher than  $\text{Cl}^-$  as the  $\text{Na}^+/\text{Cl}^-$  ratio shows an average of 2.71. This cancels out the dominance of halite dissolution and suggests possible ion-exchange process, if not the presence of silicate weathering, which in this case has been proved as less dominant earlier. This cation exchange process involves excess  $\text{Na}^+$  input by the city wastewater lines.

## Ion exchange

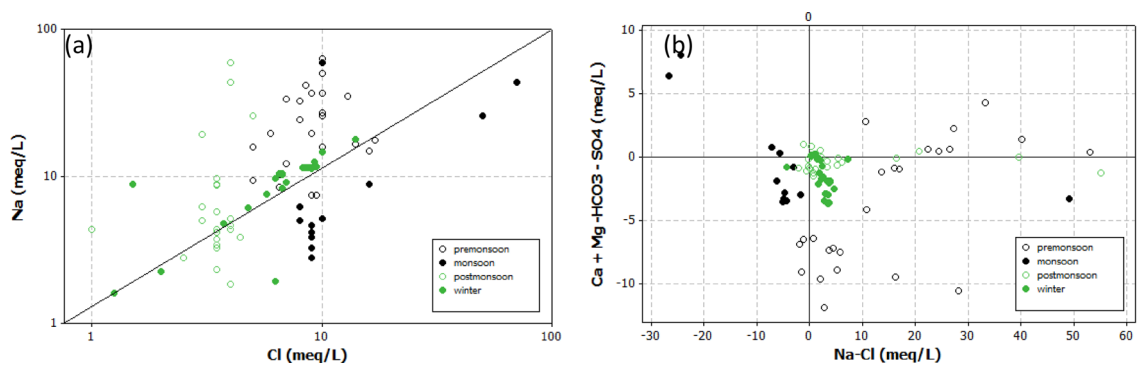
As depicted in Fig. 6a, the  $\text{Na}^+$  concentration of most the samples (66.66% of total) scattered above the seawater line, which suggests excess  $\text{Na}^+$  enrichment in the Mayur waters except in monsoon ( $\text{Na}^+/\text{Cl}^- = 0.96$ ). This excess  $\text{Na}^+$  might be influenced by cation exchange process. To further investigate the occurrence of cation exchange reactions in the studied waters, a Na-Cl versus  $\text{Ca} + \text{Mg} - (\text{HCO}_3^- + \text{SO}_4)$  plot was constructed (Fig. 6b). Apart from cation exchange the most likely additional sources of  $\text{Ca}^{2+}$  and  $\text{Mg}^{2+}$  in natural waters are Calcite, dolomite, gypsum and anhydrite weathering. While plotting the diagram, the lithogenic  $\text{Na}^+$  available for exchange is calculated from  $\text{Na}^+$  to  $\text{Cl}^-$  as it is assumed that the meteoric  $\text{Na}^+$  should be balanced by equivalent concentration of  $\text{Cl}^-$  (Nkotagu 1996). Again, possible contribution of  $\text{Ca}^{2+}$  and  $\text{Mg}^{2+}$  from Calcite, dolomite, gypsum and anhydrite dissolution to lithogenic  $\text{Ca}^{2+}$  and  $\text{Mg}^{2+}$  are accounted for by subtracting the equivalent concentrations of  $\text{HCO}_3^-$  and  $\text{SO}_4^{2-}$  (Nkotagu 1996). Figure 6b suggests the excess  $\text{Na}^+$  in pre-monsoon and winter season may be due to cation exchange of  $\text{Na}^+$  replacing  $\text{Ca}^{2+}$  and/or  $\text{Mg}^{2+}$ .

## Water quality

The TDS-TH ratios indicate water quality changes over time from hard brackish water in pre-monsoon to mostly hard fresh water in all other seasons confirming dilution effect in wet period. If only TDS is accounted for 58.33% of the samples fall in permissible limit for drinking water, all of which are found in monsoon and post-monsoon season (Table 3). According to the irrigation water classification based on the Sodium Absorption Ratio (SAR), most of the samples (64.58%) fall in poor category indicating poor water quality along the river. However, ~66% of the samples in monsoon fall in excellent to good category suggesting improvement in water quality in the monsoon. The EC-based classification further show that 93.75% samples fall in good to permissible category during monsoon. No sample was found as excellent quality.



**Fig. 5** Proportion of the major ions in the waters of Mayur River. The black blank circles denote pre-monsoon, black filled circles denote monsoon, green blank circles denote post-monsoon and green filled circles denote winter



**Fig. 6** Bivariate plots of the studied samples showing relationship between **a** Cl versus Na and **b** Na–Cl versus Ca + Mg – (HCO<sub>3</sub> + SO<sub>4</sub>)

**Table 3** Drinking water and irrigation water quality of Mayur River basin

Category	Grade	Samples (%)
Sodium absorption ratio (SAR) (meq/L) (Richards 1954)		
Excellent	< 10	6.2
Good	10–18	20.8
Fair	19–26	8.4
Poor	> 26	64.6
Total dissolved solid (TDS) (mg/L) (Davis and DeWiest 1966)		
Desirable for drinking	< 500	7.2
Permissible for drinking	500–1000	51.1
Useful for irrigation	1000–3000	39.6
Unfit for drinking and irrigation	> 3000	2.1
Electrical conductivity (EC) (µS/cm) (Raghunath 1987)		
Excellent	< 250	0
Good	250–750	24
Permissible	750–2000	69.8
Doubtful	2000–3000	1
Unsuitable	> 3000	5.2

**Land use signatures on water**

Multivariate techniques were applied to investigate the major land use sources of ion chemistry in the river. For this analysis, only river water samples were considered, since the adjoining canals bring area specific discharges to the river. The results of Factor Analysis (FA) are presented in

Table 4. Four factors were extracted using Principal Component Analysis (PCA) based on the condition “eigenvalue > 1” explaining 79.99% of the total variation. Factor 1 explains 38.10% of the variation and has strong loading ( $\geq 0.75$ ) on Salinity, TDS, TSS, Na<sup>+</sup>, K<sup>+</sup>, Mg<sup>2+</sup> and SO<sub>4</sub><sup>2-</sup>. Since weathering effects are not strong in the river basin except land runoff and the river is dead at its source, this factor

**Table 4** Varimax rotated factor loading matrix from principal component analysis of physical parameters and major ions (n = 96)

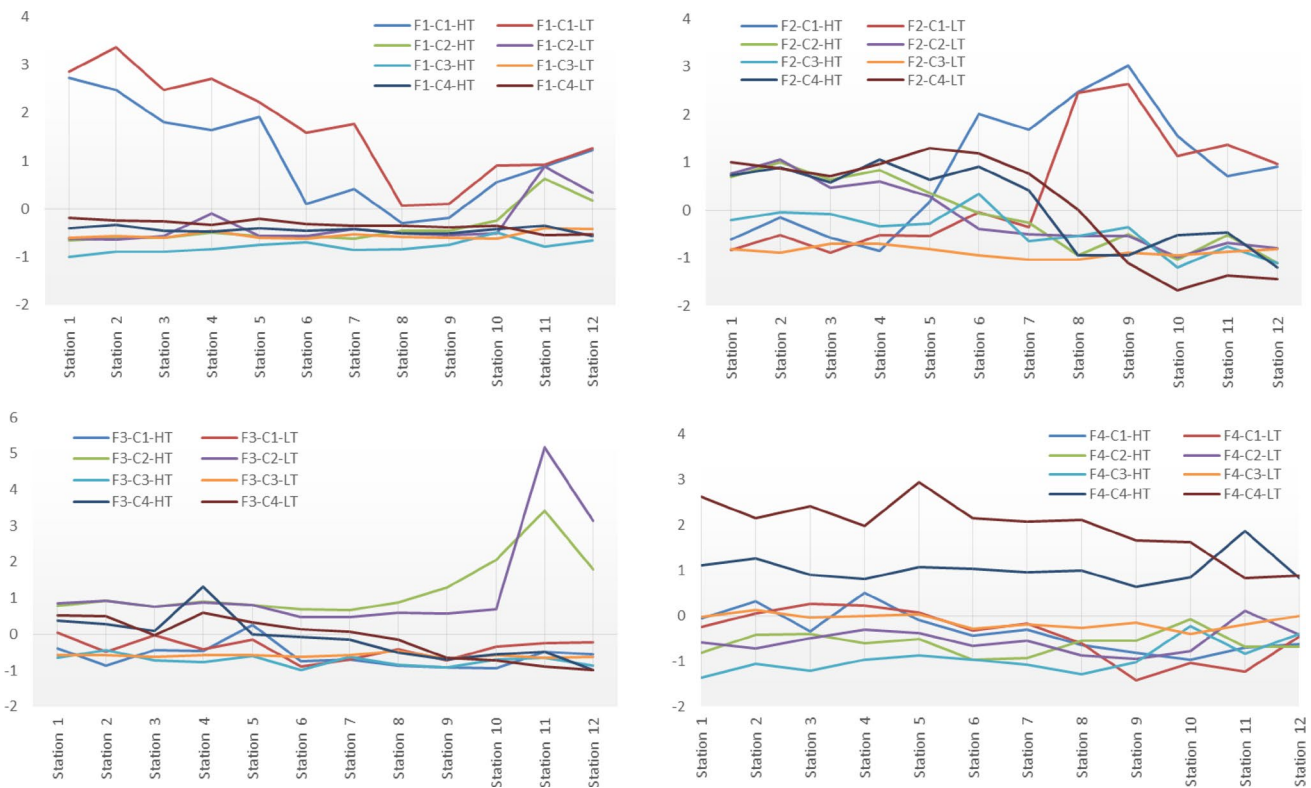
	Factors				Communality
	Factor 1	Factor 2	Factor 3	Factor 4	
DO	-.244	-. <b>.810</b>	-.094	.014	.725
Water temperature	.329	-.055	.317	-. <b>.781</b>	.821
pH	.074	-.562	.253	.558	.697
Salinity	<b>.963</b>	.126	-.061	-.138	.966
EC	.051	-.114	<b>.816</b>	.076	.687
Na <sup>+</sup>	<b>.960</b>	.019	-.108	-.086	.940
K <sup>+</sup>	<b>.898</b>	.179	-.092	-.166	.874
Ca <sup>2+</sup>	-.170	-.063	<b>.832</b>	-.054	.728
Mg <sup>2+</sup>	<b>.772</b>	-.082	.528	-.083	.888
Cl <sup>-</sup>	.174	-.034	<b>.833</b>	-.082	.732
HCO <sub>3</sub> <sup>-</sup>	-.160	<b>.912</b>	.120	.110	.883
SO <sub>4</sub> <sup>2-</sup>	<b>.800</b>	-.009	.272	-.228	.766
NO <sub>3</sub> <sup>-</sup>	.263	.606	-.279	.065	.519
PO <sub>4</sub> <sup>3-</sup>	.053	<b>.764</b>	-.231	.107	.651
SiO <sub>2</sub>	-.193	.244	.060	<b>.861</b>	.841
TDS	<b>.972</b>	.056	.032	-.100	.959
TSS	<b>.953</b>	.101	.004	.037	.919
Variance explained (%)	38.109	20.064	12.710	9.103	
Total variance explained (%)	79.985				

Four components were extracted using Eigenvalue > 1. Bold type face indicates strong loading ( $\geq 0.75$ ) and italic type face indicate moderate loadings ( $0.50 \geq \lambda \geq 0.75$ )

can be explained as the anthropogenic factor, most likely the urban influence. Figure 6 presents a spatial distribution of the factor coefficients along the river. This distribution suggests head waters of the river show high factor 1 coefficients which is most populous part of basin. The second factor explains 20.06% variation in the data and exhibits strong positive loading on  $\text{HCO}_3^-$  and  $\text{PO}_4^{3-}$  and strong negative loading on DO and moderate ( $\geq 0.50 \sim \leq 0.75$ ) positive loading on  $\text{NO}_3^-$  and moderate negative loading on pH. This may represent the agricultural/soil runoff signature. Agricultural activities are known to have a major impact on hydrochemistry of streams. The use of N and P fertilizer is common in the Mayur river basin as more than 60% of the total basin area falls under agricultural land use.  $\text{NO}_3^-$  was found as high as 5.97 and 5.05 mg/L (median value) in pre-monsoon and winter, respectively.  $\text{PO}_4^{3-}$  was found as 5.02 and 4.94 mg/L (median value) in the same seasons reported earlier compared to 0.35 and 1.04 mg/L in monsoon and post-monsoon, respectively. This indicates the seasonality of the agricultural practices in the basin, as the winter rice called *Boro* is cultivated around these seasons. Figure 7 reveals a peak of factor 2 in the middle reaches of the river where agricultural activities are concentrated. A third factor explains 12.70% of the data variation and has a

strong positive loading on EC,  $\text{Ca}^{2+}$  and  $\text{Cl}^-$  with moderate positive loading on  $\text{Mg}^{2+}$ . This is likely to be the effect of tidal influence in river during the wet season (Fig. 7). The fourth factor has a strong negative loading on water temperature and strong positive loading on  $\text{SiO}_2$  with moderate positive loading on pH explaining 9.10% of the total variation explained. Naturally pH is inversely related with  $\text{SiO}_2$  which has been found reverse in this case. Therefore, it can be assumed that, this factor explains the massive construction works involving the use of silica that is taking place alongside the river mostly during winter (or dry season). The values of  $\text{SiO}_2$  found in the river over the seasons support this theory as in winter  $\text{SiO}_2$  in the water samples are found as 23.55 mg/L (median value) while in pre-monsoon, monsoon and post-monsoon corresponding avg. values are 4.18, 7.3 and 4.32 mg/L, respectively (Fig. 7).

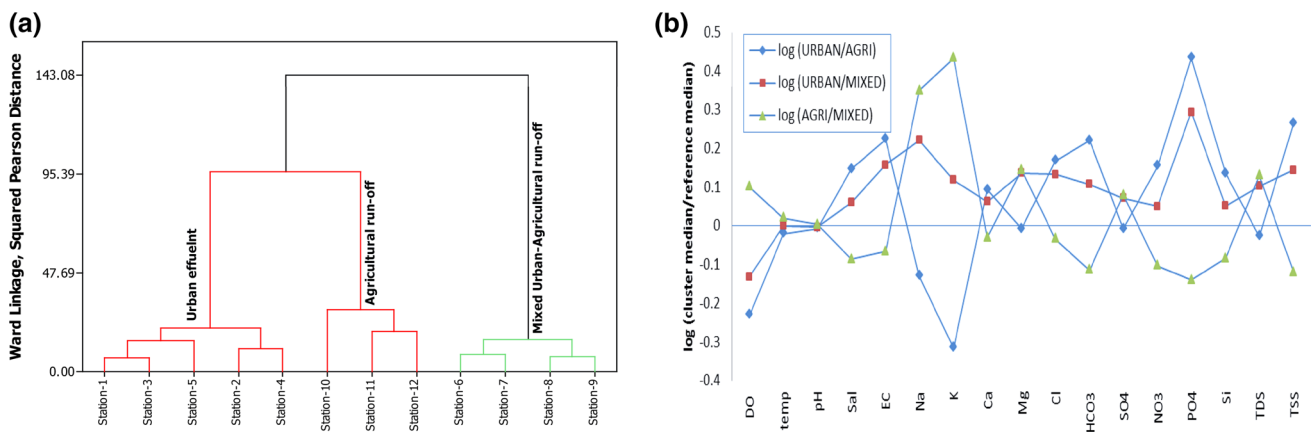
The HCA was performed based on the major cations, major anions and the physical parameters, which produced three main clusters (Fig. 8a). Interestingly, the clusters give a clear indication of changing water quality and dominant land use types running along the river. First five sampling stations fall in cluster 1 which are located in the upstream and dominated by urban land use. The last three stations at the downstream are clustered together and are dominated



**Fig. 7** Spatial distribution of the factors extracted from factor analysis (FA). *F1–F4* denote the four factors extracted, *C1–C4* denote sampling cycles where *C1* pre-monsoon, *C2*-monsoon, *C3* post-monsoon,

*C4* winter, *HT* high tide, and *LT* low tide. Station 1 represent head waters while station 12 indicate tail waters with tidal influence





**Fig. 8** Land use signature in Mayur river water: **a** dendrogram produced from hierarchical cluster analysis (HCA) showing distinct and dominant land use sites; **b** Spider diagram showing biogeochemical fingerprints (log normalized to different land uses) of anthropogenic

by agriculture. The third cluster represents four sampling stations located in the middle reach of the river organized among two sub-clusters indicating a mix of the two dominant land use types, urban and agriculture. However, interestingly, the major two land use dominated clusters (agriculture and urban) are grouped in one mother cluster while the mixed land use show a very different mother cluster. Thus it illustrates how characteristically distinct an agricultural runoff and urban wastewater might be, but the mixture of two can be far different from their original characters.

The behavior of the hydrochemical variables of each of these clusters is further investigated by developing biogeochemical fingerprints (Fig. 8b). For each cluster, values of the variables are averaged over sites that fall within the cluster and then fingerprints are developed by plotting spider diagrams with the log of the ratio of the median value for each variable in the cluster of interest to the median value for sites in the reference cluster (Wayland et al. 2003). In this spider diagram, points derived from cluster of interest that are plotted on the *x*-axis (where *y*=0) refer to no difference from the reference cluster. The points that plotted over the *x*-axis (*y*>0) indicate higher concentration in the ‘interest cluster’ than that of the ‘reference cluster’ and vice versa.

First, urban cluster was investigated using the agricultural cluster as reference. DO, Na<sup>+</sup> and K<sup>+</sup> is found as low in the urban cluster while Salinity, EC, Ca<sup>2+</sup>, Cl<sup>-</sup>, HCO<sub>3</sub><sup>-</sup>, NO<sub>3</sub><sup>-</sup>, PO<sub>4</sub><sup>3-</sup>, SiO<sub>2</sub> and TSS is found as high in concentration. These findings are not consistent with available previous researches (e.g., Wayland et al. 2003; Fitzpatrick and Long 2007) as they found higher amount of Na<sup>+</sup>, K<sup>+</sup> and SO<sub>4</sub><sup>2-</sup> in urban streams compared to the agricultural streams. The log of urban cluster *versus* mixed cluster suggests, most of parameters have higher concentration in the urban cluster except DO. Again, the log of the ratio of

land use. Elements that plot above the *x*-axis have higher concentrations while elements that plot below the *x*-axis have lower concentrations in the cluster sites than in the reference sites

agriculture *versus* mixed cluster shows higher concentration (*y*>0) of DO, Na<sup>+</sup>, K<sup>+</sup>, Mg<sup>2+</sup> and TDS and lower concentration (*y*<0) of salinity, EC, Cl<sup>-</sup>, NO<sub>3</sub><sup>-</sup>, PO<sub>4</sub><sup>3-</sup>, SiO<sub>2</sub> and TSS.

The spider diagram reveals that mixing of urban wastewater leads to higher rate of decreasing DO in streams compared to the agricultural environment. Also, it is clear that urban waste water tends to increase salinity and conductivity in stream water than that of agricultural environment. Agricultural runoff is expected to naturally produce more N and P products along with lesser amount of sodium and potassium compared to the urban streams. This study shows the other way around. Possible explanation for this reverse result can be the influence of shrimp farm end-products in the agricultural sites. There are several shrimp production ponds around the agricultural sites that discharge their waste directly into the river. Shrimp farms are well known for using NaCl and KCl to reduce crop mortality, thus enriching wastewater with Na<sup>+</sup>, K<sup>+</sup> and Cl<sup>-</sup>. In this case, the agriculture dominated sites of the Mayur River are also rich in Na<sup>+</sup>, K<sup>+</sup> and Cl<sup>-</sup> and show higher concentration of these ions compared to the mixed water zone (sampling station 6, 7, 8 and 9). This explanation is supported by the fact that the average concentration of Na<sup>+</sup> and K<sup>+</sup> at the urban, mixed and agricultural sites in the river are 278.04 and 18.96, 166.73 and 15.22, 339.17 and 38.24 mg/L, respectively. The sharp increase of average Na<sup>+</sup> and K<sup>+</sup> in the agricultural sites indicates the strong influence of shrimp waste in the river. Increase of Ca<sup>2+</sup>, Mg<sup>2+</sup>, Cl<sup>-</sup> and SO<sub>4</sub><sup>2-</sup> towards the tail waters of the river where the agricultural sites are found, also are indications of the presence of shrimp farm end-products in water.

## Conclusions

The tidal and ephemeral nature of the Mayur river shows significant physico-chemical and spatio-temporal variations and characterized with excessive amount of TDS,  $\text{Na}^+$ ,  $\text{Cl}^-$  and  $\text{SO}_4^{2-}$  during winter and pre-monsoon but shows dilution effect during the rainy season. Major ion composition is mainly controlled by two types of anthropogenic activities: urban wastewater production and agricultural activities. Weathering effects are weak in the stream, although effects of soil leaching and runoff are evident. Evidences suggest water quality of the river greatly improves during monsoon and post-monsoon and become favorable for irrigation purposes. The piper trilinear diagram also indicates that with rainfall, pollution effects are diluted and the river water becomes more usable (e.g., for irrigation purpose). HCA and FA performed on the river water samples depicted three distinct water groups based on major ion composition; urban wastewater, agricultural runoff and mixed water. However, compared to the previous researches (e.g., Wayland et al. 2003; Fitzpatrick et al. 2007; Yu et al. 2016), these urban waste water and agricultural runoffs showed a little difference in ion composition. Unusual high concentration of  $\text{Na}^+$  and  $\text{K}^+$  and low concentration of  $\text{NO}_3^-$  and  $\text{PO}_4^{3-}$  in the agricultural stream compared with the urban wastewater reflects the presence of shrimp farm end-products in the agricultural sites. Except this, a decrease of DO and increase in salinity, EC and TSS is noticed in the urban streams. Drawing from the analysis and interpretation of major ion chemistry, land use is likely to be the key factor in controlling the water quality of the studied river where amount of rainfall on the basin is a determinant of “improvement”.

Despite some tidal influences at the lower reaches, the river is considered dead for last few decades and now serves as a major supplement for the city drainage system. The southwest region, especially Khulna, the third largest metropolitan city of Bangladesh, is suffering from a sharp decline in dry season ground water table (Fig. 1) for last couple of decades (Roy et al. 2017). Since the river’s water quality gets usable during the rains, it is possible that through restricting municipal and industrial wastewater discharge and adapting proper Integrated Water Resource Management (IWRM) system addressing land use management system, river Mayur can be used as surface water reservoir for the city. Our bathy survey showed that Mayur can retain ~725 million gallon water with its current capacity, which would extend to least 2.5 times after excavation and restoration. By 2030 with an estimated 1.62 million people residing in Khulna city would demand 112 million gallons of supply water per day. The present water supply capacity of Khulna Water

Supply and Sewerage Authority (KWASA) is only limited to 14 million gallons per day based on groundwater extraction only. A sharp decline of groundwater table in dry season during recent years is contributing a large cut-off in this water supply. Currently KWASA supplements supply water from a small open lake after treatment. If river Mayur is properly restored through excavation and implementation of IWRM policies adopted by Bangladesh government (see Dewan et al. 2015; Gain et al. 2017; Roy et al. 2017 for a comprehensive review and adoption of the current IWRM policies), a 5% withdrawal of the river water per day (~35–40 million gallons) may contribute to reduce the current and future gap between supply and water demand in the region. Although a deeper insight to the groundwater-surface water recharge and interaction is required before making such decisions, the recent increase of annualized precipitation trends in the region (Hossain et al. 2014) presents an opportunity to consider this ephemeral embanked river as a water reservoir in future. The Government of Bangladesh (GoB) has recently (year 2017) adopted the Bangladesh Delta Plan 2100 (draft) that addresses the nation-wide water challenges through a “hot-spot specific” issues and strategies (Bangladesh Delta Plan 2017). These issues include coastal flooding and salinity problem and water shortage, drainage and sanitation problem in urban areas. This study is expected to feed the information channel for the scientific, political and other concerned communities to consider possible opportunities of using the river as source of water supply for the city thus contribute to strategic interventions in the coastal urban regions planned by the Bangladesh Delta Plan (BDP).

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**Author contributions** KR: Planned and managed the study, made interpretations and authored the manuscript; MRK, FA, MSI and KA: Took part in planning process, did field work and laboratory analysis, assisted in writing manuscript; MMR, DKD and MSAK: Involved in planning process, reviewed and commented on manuscript.

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