ORIGINAL ARTICLE

Impacts of culture‑wise shrimp farming activities on hydrogeochemistry: a case study from Chidambaram taluk, Cuddalore district, Tamil Nadu, India

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Abstract

Shrimp farming is one of the most important aquaculture practices in terms of area, production, employment and foreign exchange generation in India. In recent years, the growth and intensifcation of shrimp farms in the study area have been explosive, and setting up of new shrimp farms along the coastal areas has also become a matter of apprehension among the environmentalists. An extensive survey made by environmentalists elsewhere shows mixed opinion, but ascertains the real scenario as facts. A total of about 46 groundwater samples were collected in fve phases: pre-culture, summer culture, immediately after summer harvest (IASH), winter culture and immediately after winter culture, respectively. The results revealed that the high value of TDS, Na, Cl and Br is observed in IASH, and also, the spatial distribution map confrmed that higher concentration is observed near to the creek and sea. Moreover, the abundance of these ions is in the following order: $Na > Ca > Mg > k$ and $Cl > HCO₃ > SO₄ > CO₃ > NO₃ > Br$ for different culture periods, respectively. Piper diagram depicts that the groundwater was controlled by ion exchange reactions. Further, Chadha's classifcation revealed that the reverse ion exchange was the dominated feature, and it is supported by various ionic indices such as Na/Cl versus EC, $(Ca + Mg)$ versus (SO_4+HCO_3) , (Na–Cl) versus $Ca+Mg-HCO_3-SO_4$), (Ca+Mg) versus Cl and Na/Cl versus Cl, respectively. The result of factor analysis shows that most of the variations are elucidated by the seawater intrusion, rock–water interactions and anthropogenic activities during diferent culture periods. The spatial distribution map of factor scores clearly delineates that the positive values are observed near to the creek and sea and in that, shrimp farming area is not predominated. R-mode cluster analysis shows that groundwater quality does not vary extensively as a function of culture periods. Moreover, Q-mode classifcation consists of two clusters: the frst cluster has a high saline water concentration comprising samples location near to the creek and sea. The second cluster mainly depends upon rock–water interactions and the majority of shrimp farming area are grouped under these categories. The above statements clearly indicate that groundwater parameters mainly depend upon the geological process and that shrimp farming cannot be targeted as the root cause for groundwater salinization.

Keywords Hydrogeochemistry · Groundwater quality · Shrimp farming · Culture period

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Introduction

Aquaculture is one of the important coastal activities in developing countries regarding alleviating poverty and generation of wealth. World aquaculture production during 2013 was 97.2 million tonnes with an estimated total value of US\$157 billion (Rekha et al. [2017](#page-21-0)). In India, shrimp aquaculture has shown a rapid growth in the last decade and expanded from 65,100 ha in 1990 to 1, 91,074 ha in 2005–2006, and the average annual growth rate is about 10% since 1984. The overall export of shrimp farming in 2013–2014 was to the tune of 3, 01,435 MT worth of US\$ 3210.94 million (MPEDA [2014\)](#page-21-1). Thus, coastal shrimp

culture contributes signifcantly to the progress of country's economy as well as the economic well-being of the rural poor. It mainly depends on the availability of good quality of saline water from the sea or creek or backwaters. Beneft of aquaculture is more in a positive manner; many reviews lead one to conclude that aquaculture had only a positive impact on environments (Phillips et al. [1993](#page-21-2); Newport and Jawahar [1995\)](#page-21-3). However, there will be some negative impacts including salinization of drinking water and aquifers (Patil et al. [2002](#page-21-4)). Similarly, in the study area, the rapid development of shrimp culture has been accompanied by many controversies, resulting in a closer look at the environmental problems, but till now there is no accurate method to point out that shrimp farms are the main reason for infuencing the salinity of water in groundwater aquifers. The pollution caused by the water discharged from the shrimp farms is a big matter of concern, which is responsible for the conficts between shrimp farmers and environmentalists in the study area. Water with the required quality and quantity is required for diferent stages of shrimp farming. In the shrimp hatchery, unpolluted seawater is required for brood stock maintenance, spawning, larval rearing and culture of food organism. The grow-out farm ponds need sea/brackish water, free from agriculture, domestic and industrial pollution and also within the required salinities, pH and temperature ranges (Saraswathy et al. [2016\)](#page-21-5). The fact understood is that the effect of pollution from shrimp farm effluent is considerably less than that of domestic or industrial wastewater. However, the quality of water and even the impacts from external environmental changes pose a threat to the sustainability of shrimp culture. Therefore, environmentalist made an opinion that the deterioration of drinking water quality is due to shrimp culture in coastal habitats, but it is not true since seawater intrusion is also found to attribute salinization in the study area.

However, the previous work indicates that groundwater quality in the study area is largely determined by natural processes such as groundwater velocity, dissolution and precipitation of minerals, quality of recharge waters, water–rock interaction and anthropogenic activities (Chidambaram et al. [2010;](#page-20-0) Prasanna et al. [2011](#page-21-6) and Rekha et al. [2013](#page-21-7)). A continuous monitoring of the groundwater in shrimp farming does not impact the groundwater quality, and it mainly depends upon the natural process (Rekha et al. [2015](#page-21-8); Gangadharan et al. [2016\)](#page-20-1). GIS and remote sensing offer a better option to evaluate the impact on both spatial and temporal variabilities in the study area for assessing the groundwater quality and land-use changes in and around shrimp farming area (Rekha et al. [2017](#page-21-0)). In coastal aquifer, the hydrogeochemistry of the groundwater varies seasonally and spatially, depending on the infuence of lithology, nature of geochemical reactions, velocity and quantity of groundwater flow, solubility of salts and human activities (Janardhana Raju [2006](#page-21-9)). In this

context, this study envisaged that the culture-wise evaluation of groundwater quality in shrimp farming area has not been studied in a great deal. Hence, it is apparent to characterize the hydrogeochemical processes that are responsible for groundwater geochemistry in the study area for diferent culture periods using Piper plot, ion exchange reactions, Chadha's classifcation and statistical analysis.

Study area

The area selected for this study is located in Chidambaram taluk, Cuddalore district, eastern part of Tamil Nadu, Southern India, and comprises sedimentary formation bounded by Bay of Bengal. This area occurs within the Survey of India toposheet no. 58 M/10, 58 M/11, 58 M/12, 58 M/13, 58 M/14, 58 M/15 in the scale: 1:50,000 and is located between 11°30′N to 11°20′N latitude and 79°38′E to 79°48′E longitude. The shrimp farming area is covered within three adjacent mini-watersheds with two in Lower Vellar subwatershed (4C1A1c4a4 and 4C1A1c3b1) and one in Colleroon watershed (4B1A5a1b1e). The watershed boundary has been delineated using toposheet and satellite data as well as with the help of mini- and micro-watershed boundary in the sub-basin collected from Agricultural Engineering Department, Tamil Nadu. The total extent of the study area is about 213.44 km^2 in which the water spread area of shrimp farms is approximately 4 km^2 (Fig. [1](#page-2-0)). The study area consists of sedimentary formations, which include sandstone, clay, alluvium and small patches of laterite soils of quaternary age.

Methodology

Field investigations were carried out from October 2011 to October 2013 by collecting the 46 groundwater samples from hand pumps representing the entire study area. The water samples were collected in pre-cleaned, sterilized polyethylene bottles of 1 litre capacity. Electrical conductivity (EC), pH and temperature were measured directly in the feld using portable multiparameter. Water concentrations such as sodium, potassium, calcium, magnesium, chloride, bicarbonate, carbonate, sulphate, nitrate, bromide and total dissolved solids (TDSs) were carried out by using standard procedures (APHA [2005\)](#page-20-2). The analytical precision for the measurements of cations and anions was indicated by the ionic balance error, which was computed on the basis of ions expressed in milliequivalent per litre. The values were observed to be within a standard limit of \pm 5% (Domenico and Schwartz [1998\)](#page-20-3). This study is mainly focussed on the impact of groundwater quality during diferent culture periods. According to Murugesan et al. [2009,](#page-21-10) the aquaculture experts' opinion and feld observation, there were two crops,

such as summer crop and winter crop, being undertaken in the study area by the shrimp farmers (Table [1\)](#page-2-1). Accordingly, fve classifcations such as pre-culture (PC), summer culture (SC), immediately after summer harvest (IASH), winter culture (WC) and immediately after winter culture (IAWH) have been made, and analysis was carried out. MS Excel spreadsheet was used to create the Chadha's classifcation, Na/Cl versus EC, $(Ca+Mg)$ versus $(SO₄+HCO₃)$, (Na–Cl) versus (Ca + Mg–HCO₃–SO₄), (Ca + Mg) versus Cl and Na/ Cl versus Cl, respectively, while Piper diagram was plotted using AquaChem V4 software package. Factor and cluster analyses were applied to interpret the geochemical data using SPSS 16 statistics software.

Results and discussion

The groundwater samples collected in different culture periods are listed in Table [2](#page-3-0) showing the results of physicochemical parameters found in descriptive statistics such as maximum, minimum, mean and standard deviation. In culture-wise analysis, little higher pH value is observed in PC period with the mean value of 8.51 and the values ranging from 8.11 to 8.85. pH value ranges from 7.51 to 8.77, 7.07 to 8.77, 7.63 to 8.35 and 7.37 to 8.77 with the mean value of 7.96, 7.95, 7.95 and 7.88 during SC, IASH, WC and IAWH, respectively. Culture-wise analysis shows that all the samples have pH values more than 7, indicating alkaline nature of the samples, and it was controlled by the amount of dissolved $CO₂$, carbonate and bicarbonate in groundwater (Senthilkumar et al. [2017\)](#page-21-11). Culture-wise analysis shows that the higher concentration of EC values was noted during IAWH period with a mean value of 2180 μs/cm and the value ranges from 462 to 7425 μs/cm. During IASH, SC, WC and PC periods, the value ranges from 376 to 6320, 512 to 7350, 705 to 4486 and 396 to 7360 μs/cm with the mean value of 2175 μs/cm, 2159 μs/cm, 1964 μs/cm and 1938 μs/ cm, respectively. The spatial distribution map (Fig. [2\)](#page-4-0) was drawn as per the classifcation used by Subramani et al. [2005,](#page-21-12) and the higher concentration was noted in the study area indicating efective leaching of ions into the groundwater system recharge (Singaraja et al. [2013\)](#page-21-13). The unsuitable limit was observed in a specifc location near to the creek of south-eastern and central-north, few parts near to the sea

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 (b) SC

 (c) IASH

 (d) WC

 (e) IAWH

Fig. 2 Spatial distribution map for EC

Fig. 3 Spatial distribution map for TDS

Table 3 Characteristics of Chadha's classifcation for diferent culture periods

Groundwater types	Samples in the PC category		Samples in the SC category		Samples in the IASH category		Samples in the WC category		Samples in the IAWH category	
	No. of samples	%	No. of samples	$\%$	No. of samples	%	No. of samples	%	No. of samples	%
Ca-Mg-Cl type	35	76	34	74	28	61	41	89	40	87
Na–Cl type	6	13	7	15	13	28	5	11	3	
$Ca-HCO3$ type	$\overline{4}$	9	3	7	2	$\overline{4}$			2	4
$Ca-Na-HCO3$ type	1	\mathfrak{D}		$\mathfrak{D}_{\mathfrak{p}}$	\mathcal{L}	4				

Fig. 4 Major facies representations in diferent culture periods

Fig. 5 Na/Cl versus EC relationship

of north-eastern side and central-eastern parts of the study area. It could also be observed that shrimp farming is less in that area.

The culture-wise TDS concentration in groundwater indicates that high values were observed during IASH season, and the value ranges from 200 to 4000 mg/l with the mean value of 1407 mg/l. During IAWH, WC, PC and SC, the values range from 462 to 7425 mg/l, 293 to 3514 mg/l, 350 to 4750 mg/l and 286 to 4845 mg/l with the mean value of 1403 mg/l, 1403 mg/l, 1388 mg/l and 1351 mg/l, respectively. According to WHO 2004 and ISI 1983, TDS above the 2000 mg/l is considered as the unsuitable, and the presence of TDS above this limit in groundwater would cause

Fig. 6 $Ca + Mg$ versus $SO_4 + HCO_3$ ionic relationship

an undesirable taste and gastrointestinal irritation (Shigut et al. [2017](#page-21-14)). The spatial distribution (Fig. [3](#page-5-0)) clearly shows that there is no signifcant diference between diferent culture periods with respect to the TDS concentration of the groundwater quality. Also, it could be noted that the high content of TDS may be due to improper sewage disposal, lesser pH with higher mineral dissolution and seawater intrusion (Singaraja et al. [2014\)](#page-21-15). The abundance of major ions in the groundwater was in the order of $Na > Ca > Mg > K$ for cations and for that of anions $Cl > HCO₃ > SO₄ > CO₃$ $> NO₃$ $> Br$ during different culture periods following the same trends.

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KACST العلوم والتقنية KACST **Fig. 7** Na–Cl versus $Ca + Mg - HCO₃ – SO₄ ionic relationship$

Fig. 8 $(Ca + Mg)$ versus Cl ionic relationship

Fig. 9 Na/Cl versus Cl ionic relationship

Hydrogeochemical trends

process

The Piper plot in the hydrogeochemical facies is sufficient and elaborated studies in groundwater and it is the fundamental interpretation for understanding chemical nature of water quality (Subramani et al. [2005;](#page-21-12) Senthilkumar et al. [2017](#page-21-11)). The results of Piper plot (Table [3](#page-6-0)) show that most of the groundwater samples during diferent culture periods fall in the feld of mixed Ca–Mg–Cl type of water (Fig. [4\)](#page-6-1). The plot shows that during PC period, groundwater quality is mixed Ca–Mg–Cl type with 76% (*n*=35) of samples falling under this category. It is then followed by Na–Cl type with 13% $(n=6)$, Ca–HCO₃ type with 9% $(n=4)$ and Ca–Na–HCO₃ type with 2% $(n=1)$, respectively. Similarly during SC period, the groundwater quality shows mixed Ca–Mg–Cl type with 74% (*n*=34), Na–Cl type with 15% $(n=7)$, Ca–HCO₃ type with 7% $(n=1)$ and mixed Ca–Na–HCO₃ with 2% $(n=1)$, respectively. During IASH period, the analysis shows mixed Ca–Mg–Cl type with 61% $(n=18)$ of samples falling under this category, followed by Na–Cl type with 28% ($n=13$). The remaining samples were equally distributed as mixed $Ca-Na-HCO₃$ type with 4% $(n=2)$ and Ca–HCO₃ type with 4% $(n=2)$. During WC period, the result shows that the groundwater samples fall under mixed Ca–Mg–Cl type with 89% (*n*=41), followed by Na–Cl type with 11% ($n = 5$). During IAWH period, the sample represented mixed Ca–Mg–Cl type with 87% $(n=40)$, followed by Na–Cl type with 7% $(n=1, Ca-HCO₃)$ with 4% $(n=1)$ and Ca–Na–HCO₃ with 2% $(n=1)$. The Piper plot revealed that there is no signifcant change in the hydrogeochemical facies during diferent culture periods. The analysis of ionic distribution in the study area shows that alkaline earths (Ca and Mg) signifcantly exceed the alkalis (Na and K) so as the strong acids (Cl and SO_4) exceed the weak acids $(HCO₃$ and $CO₃)$. Moreover, Piper diagram depicts that strong acids are more dominant, explaining that chemical composition of the groundwater is controlled by ion exchange reactions.

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Na/Cl versus EC plot

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The Na/Cl versus EC plot (Fig. [5\)](#page-6-2) clearly indicates that the ratio of Na/Cl increases with a decreasing EC value during diferent culture periods. A high sodium chloride ratio was observed at low EC value $(2000) during the winter season$ and pre-culture periods. The Na/Cl molar ratio should be approximately equal to one, whereas a ratio greater than one is typically interpreted as Na released from a silicate weathering reaction (Meybeck [1987\)](#page-21-16). Samples having a Na/Cl ratio greater than one indicate excess sodium, which might have come from silicate weathering or seawater intrusion. If silicate weathering is a probable source of sodium, the water samples would have $HCO₃$ as the most abundant anion (Rogers [1989\)](#page-21-17). This is because of the reaction of the feldspar minerals with the carbonic acid in the presence of water, which releases $HCO₃$. $HCO₃$ is not the dominant anion in groundwater (Elango et al. [2003\)](#page-20-4). Culture-wise analysis shows that only one sample (>1) was observed during PC period, and the values range from 0.29 to 1.09 (meq/l) with the mean value of 0.51 meq/l. The remaining

samples in different culture periods $(< 1$) indicate the possibility of some other chemical processes, such as reverse ion exchange. During SC, IASH, WC and IAWH, the values range from 0.23 to 0.93 (meq/l), 0.26 to 0.86 (meq/l), 0.23 to 0.83 (meq/l), 0.23 to 0.77 (meq/l) with the mean value of 0.54 (meq/l), 0.50 (meq/l), 0.50 (meq/l) and 0.41 (meq/l), respectively.

Reverse ion exchange

Reverse ion exchange is one of the important processes responsible for the concentration of ions in groundwater. The influence of saline water bodies contributes to the parameters such as reverse ion exchange and high salinity (Seshadri et al. [2013](#page-21-18)). Ion exchange tends to shift the points to the right due to an excess of $SO_4 + HCO_3$ (Fisher and Mulican [1997\)](#page-20-5). If reverse ion exchange is the process, it will shift the points to the left due to a large excess of $Ca + Mg$ over SO_4 + HCO₃, which can be explained by the following reaction:

Fig. 11 Spatial distribution map of factor score for PC period

Fig. 12 Spatial distribution map of factor score for SC period

 $Na^{+} + Ca(Mg)clay \ll Na - clay + Ca^{2+}(Mg^{2+})$

In Ca + Mg versus SO_4 + HCO₃ scatter diagram, the points falling along the equiline $(Ca + Mg = SO_4 + HCO_3)$ suggest that these ions have resulted from weathering of carbonates and sulphate minerals (Datta et al. [1996\)](#page-20-6) and may be due to dissolutions of calcite, dolomite and gypsum, which are the dominant reactions in a system (Rajmohan and Elango [2001\)](#page-21-19). Moreover, if the Ca and Mg solely originated from carbonate and silicate weathering, these should be balanced by the alkalinity alone. The result in the present study (Fig. [6](#page-7-0)) shows that most of the groundwater samples from diferent culture periods were clustered around and above the 1:1 line. Culture-wise analysis shows that the percentage of samples present above the 1:1 lines was 95.65%, 91.30%, 89.13%, 97.83% and 97.83% for PC, SC, IASH, WC and IAWH, respectively. It indicates that all samples during different culture periods represented the reverse ion exchange process.

The plot of Na–Cl versus $Ca + Mg - HCO₃$ – $SO₄$ also supports the hypothesized reverse ion exchange process. If ion

exchange is the dominant process in the present system, the water should form a line with a slope of -1 . From Fig. 7, it can be observed that during PC, SC, IASH, WC and IAWH the slope values are 0.76, 0.69, 0.81, 0.68 and 0.76, respectively. This confrms that Ca, Mg and Na concentrations are interrelated through reverse ion exchange. An excess of calcium and magnesium in the groundwater of sedimentary formations may be due to the exchange of sodium in the water by calcium and magnesium in clay material. The plot of $(Ca+Mg)$ versus Cl (Fig. [8\)](#page-8-0) indicates that Ca and Mg increase with increasing salinity in the diferent culture periods. The plots of Na/Cl versus Cl (Fig. [9\)](#page-8-1) also clearly indicate that salinity increases with the decrease in Na/Cl during all culture periods. It indicates the increase in $Ca + Mg$ and decrease in Na/Cl, which may be due to reverse ion exchange in the clay/weathered layer.

Chadha's classifcation

According to Vandenbohede et al. [2010](#page-21-20), the hydrogeochemical processes for a coastal aquifer occurring in the

Fig. 13 Spatial distribution map of factor score for IASH period

study area clearly bring out the Chadha's classifcation. The groundwater quality data are converted to percentage reaction values (milliequivalent percentages) and expressed as the difference between the alkaline earths $(Ca + Mg)$ and alkali metals $(Na + K)$ for cations, and the difference between the weak acidic anions $(HCO₃+CO₃)$ and strong acidic anions $(Cl + SO₄)$ (Karmegam et al. [2010\)](#page-21-21). The hydrogeochemical processes suggested by Chadha's classifcation are indicated in each of the four quadrants of the graph (Fig. [10\)](#page-8-2). These are broadly summarized as recharging water (Ca–HCO₃), reverse ion exchange water (Ca–Mg–Cl), seawater/end-member water (Na–Cl) and base ion exchange water (Na–HCO₃). Field-1 represents the recharging water, and it indicates the formation of geochemically mobile calcium as a result of dissolved carbonate. Only few samples were observed in this feld during diferent culture periods. Field-2 represents the reverse ion exchange process. This indicates that the groundwater representing $Ca + Mg$ is in excess of $Na + K$ due to reverse base exchange reactions of $Ca+Mg$ in solution and subsequent adsorption of Na onto mineral surfaces. It could be seen from the plot that feld 2 was the predominate feature in the study area during different culture-wise analyses, implying that the groundwater quality is dictated by the reverse ion exchange process rather than the shrimp culture. Field-3 represents Na–Cl type, which indicates that the groundwater water is typical of a coastal aquifer wherein salinity is expected in the groundwater. It could be seen that less than 20% of groundwater sample fall in this feld during diferent culture periods. Field-4 represents waters belonging to $Na-HCO₃$ type. Only one sample falls in this feld, and it clearly indicates that base ion exchange was not the preferred process for the groundwater in the study area.

Factor analysis

As per Mor et al. [2006,](#page-21-22) the factor loading is classified into three categories in which a high loading was defned

Fig. 14 Spatial distribution map of factor score for WC period

as greater than 0.75, moderate loading was defined as 0.40–0.75 and loading of less than 0.4 was considered insignifcant. Factor score which gives values '0' represents average impact, '−1' scores refect areas essentially unafected by that particular factors and $+1$ ' scores reflect the area's most afected (Giridharan et al. [2009](#page-21-23)). A total culture-wise analysis (Table [4](#page-9-0)) shows that four factors were identifed which control the groundwater quality. During PC period (Fig. [11](#page-10-0)), factor 1 is infuenced by Na, Cl, Br, EC and TDS with 39.5% of variance indicating the intrusion of seawater into the aquifer system, which increases the concentrations of these ions (Prasanna et al. [2011\)](#page-21-6), and the areal distribution map shows that the positive values are observed in the north-eastern, south-eastern and central-eastern sides of the study area and in that, shrimp farm area is very less (0.20 $km²$). Factor 2, which accounts for approximately 17.9% of variance, has a high loading of K and $NO₃$ indicating the anthropogenic impact from the agricultural practices like fertilizers (Vengosh et al. [2002\)](#page-21-24). The spatial distribution map of factor 2 represented that the positive loading is observed along south-eastern, south-western, north-eastern

and central-eastern sides of the study area. Factor 3, which explains 10.7% of variance, has moderate loading of pH and $CO₃$, and the spatial map represents the positive loading in north-eastern, central and central-eastern of the study area. Factor 4 is represented by $HCO₃$, which account for 8.8% indicating the natural water recharge and rock–water interaction. The areal distribution map shows a positive loading in entire south-western side of the study area. In SC period (Fig. [12](#page-11-0)), factor 1, which explains 42.8% of variance, has a high loading of the ions such as Ca, Cl, Br, EC and TDS, indicating leaching of secondary salts, and the spatial distribution shows the similar position of PC period. Factor 2 enriched with the $NO₃$ with 14.2% of variance indicates the anthropogenic impact from the leaching of landflls (Ghabayen et al. [2006](#page-21-25)). Some of the wells in the northeastern, south-eastern, south and western sides are found to exhibit highly signifcant factor scores. Factor 3 with a variance of 9.6% represents the high loading in negative value of pH, and the factor score spatial distribution map shows that the positive loading is found in the western and southeastern sides of the study area. Factor 4 is influenced by $CO₃$

Fig. 15 Spatial distribution map of factor score for IAWH period

with 9.6% of variance, and the areal distribution map shows that the positive score is observed along the south-western side of the study area.

Factor 1 during IASH period (Fig. [13\)](#page-12-0) explains 33.4% of the variance, and it has high loading of Na, Cl, Br, EC and TDS. The spatial distribution map shows that high positive factor scores are observed in north-eastern, southeastern and central parts of the study area with 0.28 km^2 of shrimp farming area which is apparently unafected by shrimp farming activities. There is no high loading observed in factor 2, and the areal map suggests that the wells in the south-western, south-eastern, north-eastern, northern and central parts show high positive scores. Factor 3 is represented by pH with 10.6% of variance showing the dominance of the base ion exchange, and the factor score distribution map implies that positive values are observed in north-eastern and central parts of the study area. Factor 4, which explains 10.1% of variance, has high loading of K indicating the anthropogenic impact, and high signifcant scores are observed in eastern and central parts of the study area. In WC period (Fig. [14](#page-13-0)), factor 1 with a variance of 4.1% represents the domination of Na, Cl, Br and EC. The areal distribution map shows that wells located in the central-eastern, north-eastern and south-eastern sides are dominated by the positive factor scores with shrimp farming area of 0.79 km^2 . It has been observed that no high loading is being carried out in the factor 2 and factor 3. However, the areal distribution map of factor 2 shows that the positive value is noted in northeastern, south-eastern, south-western, western and central parts of the study area. In factor 3, dominant positive value is represented in south-eastern, western and central parts of the study area. Factor 4 is influenced by $CO₃$ with 11.8% of variance, and the factor score spatial distribution map shows that the positive loading is found in central, eastern and southern sides of the study area. Factor 1 of IAWH (Fig. [15\)](#page-14-0) accounting for about 37.5% of the variance is explicitly showing high loadings on the ions of Na, Ca, Cl, EC and TDS, and the areal distribution map shows that the south-eastern, north-eastern and central-eastern parts are afected with regard to the positive score and in that, shrimp farming area is 0.34 km^2 . Factor 2 represented by

Fig. 16 Dendrogram of Q- and R-mode hierarchical cluster analysis (PC)

 $CO₃$ and the factor score of spatial distribution map shows that the positive loading is found in south-western and north-eastern sides of the study area. Factor 3 indicates the enrichments of $HCO₃$, and areal distribution map shows high positive scores at the south-western and north-eastern sides of the study area. There is no high loading observed in factor 4, and the areal map suggests that the wells in the south-eastern sides are dominated in high positive scores.

Hierarchical cluster analysis

In this study, hierarchical cluster analysis (HCA) was used to determine the association between sampling sites, because it provides an indication of similarities/dissimilarities between the water quality parameters (Das and Nag [2017\)](#page-20-7). Recent studies have been focused on both Q-mode and R-mode, which were performed for hydrogeochemical parameters. The Q-mode HCA was used to classify the samples into distinct hydrogeochemical groups, while R-mode HCA

Fig. 18 Dendrogram of Q- and R-mode hierarchical cluster analysis (IASH)

linking the variables (Loganathan and Jafar Ahamed [2017](#page-21-26)). In this study, Q-mode and R-mode produced a dendrogram chart obtained from Ward's linkage method for grouping the groundwater samples. Figures [16](#page-15-0)a, [17a](#page-16-0), [18a](#page-17-0), [19](#page-18-0)a and [20a](#page-19-0) show that the similar result is obtained in diferent culture periods with a very little variation among samples in second sub-cluster of R-mode hierarchical cluster analysis. Based on the fgures, two main clusters can be identifed among physicochemical variables for diferent culture periods. The frst cluster is accompanied by EC and TDS. These variables are

afected mainly by salinity factor due to seawater intrusion into coastal aquifer (Venkatramanan et al. [2017](#page-21-27)). The second cluster consists of 11 variables, and it is further classifed into two more clusters. $HCO₃$ and Cl make the first subcluster, and Ca, Mg, K, Na, CO_3 , SO_4 , NO₃, Br and pH make the second sub-cluster. Second cluster is not homogenous

Fig. 20 Dendrogram of Q- and R-mode hierarchical cluster analysis (IAWH)

(b) Q mode

and infuenced by multiple factors which are infuencing the geochemistry of groundwater (Rekha et al. [2013](#page-21-7)). In Q-mode analysis, all the culture periods are classifed into

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two major groups. The results of PC (Fig. [16](#page-15-0)b) show that the frst cluster comprises three samples (G11, G20 and G39) with the mean value of TDS 4200 mg/l and occupies 6.5%

of the groundwater samples. This cluster is characterized as high saline water intrusion, and sampling of this cluster was not located together, but it lies near to the creek. The second cluster is concerned with 93.5% and 43 samples, which indicate fresh groundwater with a mean TDS value of 1191.28 mg/l due to surface water recharge and water–rock interaction. Groundwater sample wells (G6, G9, G12, G22, G26, G32, G33, G40 and G42) are observed near to the shrimp farming area. A similar pattern is observed in the study area during SC, IASH, WC and IAWH culture periods (Figs. [17](#page-16-0)b, [18](#page-17-0)b, [19b](#page-18-0), [20b](#page-19-0)) with a slight variation. It concludes that the majority of shrimp farming area are located in the second cluster.

Conclusion

The present study explains about integrated hydrogeochemical characterization and multivariate statistical methods to examine the groundwater quality in shrimp farming area. From the above statement, it is inferred that the abundance of cations and anions was in the order of $Na > Ca > Mg > k$ and $Cl > HCO₃ > SO₄ > CO₃ > NO₃ > Br$ during different culture periods, respectively. The spatial distribution map of EC and TDS values for diferent culture periods shows that the higher concentration was noted near to the creek and along the coastal region suggesting the signifcant intrusion of seawater into the aquifer system. The Piper plot revealed that there is no signifcant change in the hydrogeochemical facies during diferent culture periods, and the chemical composition of the groundwater was controlled by ion exchange reactions. Moreover, Chadha's classifcation revealed that the reverse ion exchange was the dominant feature, and it is supported by various ionic indices such as Na/Cl versus EC, $(Ca+Mg)$ versus $(SO₄+HCO₃)$, (Na–Cl) versus (Ca+Mg–HCO₃–SO₄), (Ca+Mg) versus Cl and Na/Cl versus Cl, respectively. Based on the results obtained from the factor analysis, it clearly illustrates the multiple factors responsible for groundwater quality. During diferent culture periods, factor 1 is dominated by high loading of Na, Cl, Br, EC and TDS of variance indicating the intrusion of seawater into the aquifer system. The spatial distribution map of factor scores clearly delineates that the positive values are observed near to the creek and sea, which are in the north-eastern, south-eastern and centraleastern parts of the study area and in that, shrimp farm area is very less. Cluster analysis also highlights that there is petite culture variation among the samples and variables. The result of R-mode analysis consists of two clusters for diferent culture periods: the frst cluster consists of EC and TDS, and the second cluster is accompanied by 11 variables; it shows multiple factors which are infuencing the geochemistry of groundwater. Q-mode analysis shows that all the culture periods are classifed into two major clusters: the frst cluster is characterized as high saline water intrusion, and sampling of this cluster was not located together, but it lies near to the creek. The second cluster associated with water–rock interaction and anthropogenic resources comprises that samples, namely G6, G9, G12, G22, G26, G32, G33, G40 and G42, were observed near to the shrimp farming area with slight variations. The above methods revealed that there is no signifcance change between the culture periods, and it mainly depends upon the geological process.

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