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5	Role of competing ions in the mobilization of arsenic in groundwater of
6	Bengal Basin: Insight from surface complexation modeling
7	
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24 Abstract

This study assesses the role of competing ions in the mobilization of arsenic (As) by surface 25 26 complexation modeling of the temporal variability of As in groundwater. The potential use of two different surface complexation models (SCMs), developed for ferrihydrite and goethite, 27 has been explored to account for the temporal variation of As(III) and As(V) concentration, 28 monitored in shallow groundwater of Bengal Basin over a period of 20 months. The SCM for 29 ferrihydrite is the better predictor of the observed variation in both As(III) and As(V) 30 concentrations in the study sites. Among the competing ions, PO_4^{3-} was the major competitor 31 of As(III) and As(V) adsorption onto Fe oxyhydroxide, and the competition ability decreases 32 in the order $PO_4^{3-} >> Fe(II) > H_4SiO_4 = HCO_3^{-}$. It is further revealed that a small change in 33 pH can also have a significant effect on the mobility of As(III) and As(V) in the aquifers. A 34 decrease in pH increases the concentration of As(III), whereas it decreases the As(V) 35 concentration and vice versa. The present study suggests that the reductive dissolution of Fe 36 oxyhydroxide alone cannot explain the observed high As concentration in groundwater of the 37 sedimentary aquifers. This study supports the view that the reductive dissolution of Fe 38 39 oxyhydroxide followed by competitive sorption reactions with the aquifer sediment are the processes responsible for As enrichment in groundwater. 40

Keywords: Bengal Basin; Groundwater; Arsenic mobilization; Temporal variability;
Competing ions; Surface complexation modeling

44 **1. Introduction**

During the last decades, the occurrence of arsenic (As) in drinking water has become a major environmental concern in many regions of the world, even in the countries of North America and Europe (Nriagu et al., 2007). Nevertheless, the problem is most severe in Bangladesh and West Bengal (jointly represents Bengal Basin), where its extent has been termed as the largest mass poisoning in human history (Smith et al., 2000).

Currently, the reductive dissolution of Fe oxyhydroxide, coupled to the microbially 50 mediated oxidation of organic matter is the most widely accepted mechanism of As release in 51 groundwater of the Bengal Basin (Berg et al., 2008; Bhattacharya et al., 1997; Harvey et al., 52 2002; Islam et al., 2004; McArthur et al., 2004; Mukherjee et al., 2008; Nath et al., 2008; 53 Nickson et al., 1998; Polya and Charlet, 2009). Meanwhile, some studies have revealed that 54 once As is released into groundwater, its mobility is primarily regulated by the extent of re-55 sorption onto the residual Fe oxyhydroxide present in the aquifer materials through formation 56 of either inner-sphere or outer-sphere complexes (Wang and Mulligan, 2008), until adsorption 57 sites become saturated or solid sorbents are completely dissolved (Pedersen et al., 2006; von 58 Brömssen et al., 2008; Welch et al., 2000). In this context, competing ions such as phosphate 59 (PO₄³⁻), bicarbonate (HCO₃⁻) and silicic acid (H₄SiO₄) might play a significant role in the 60 mobilization of As by competing for similar adsorption sites of Fe oxyhydroxide (Sracek et 61 al., 2004; Stollenwerk, 2003; von Brömssen et al., 2008). Nevertheless, despite its importance 62 there is controversy regarding the relative roles of these components for As mobilization. For 63 example, it is reported that PO_4^{3-} has a very strong affinity for adsorption sites on Fe 64 oxyhydroxide and is a potential competitor for As adsorption in the natural environment 65 (Acharyya et al., 1999; Dixit and Hering, 2003; Gao and Mucci, 2001; Jain and Loeppert, 66 2000; Manning and Goldberg, 1996). For the aquifers of Bangladesh, van Geen et al. (2008) 67 have also found strong positive correlation between level of PO₄³⁻ exchangeable As in aquifer 68

sediment and dissolved As concentration in groundwater, which led them to emphasize the 69 70 role of adsorptive equilibria in the As mobilization. Meanwhile, Kim et al. (2000), Appelo et al. (2002), and Anawar et al. (2004) claimed that the high concentration of HCO_3^- in 71 72 groundwater may be responsible for the mobilization of As in Bengal Basin aquifers; however, this was not experimentally supported by Meng et al. (2000), Radu et al. (2005) and 73 Stachowicz et al.(2007). Sometimes the adsorption of H₄SiO₄ has also been considered as a 74 competitor of As adsorption onto Fe oxyhydroxide (Meng et al., 2000; Swedlund and 75 76 Webster, 1999). Based on batch experiments involving multi-sorbate ions, Meng et al. (2002) showed that although PO_4^{3-} , HCO_3^{-} and H_4SiO_4 can compete with As(III) adsorption onto Fe 77 oxyhydroxide, their effect on As(V) adsorption is very small even at high concentration and 78 suggested that the high mobility of As in Bengal Basin aquifers is due to their combined 79 effect. Recently, by similar experiment and subsequent modeling, Stollenwerk et al. (2007) 80 and Stachowicz et al. (2008) again concluded that PO_4^{3-} is the major competitor for As 81 adsorption and in the presence of significant PO_4^{3-} the competition of HCO_3^{-} becomes 82 83 negligible. However, these contradictory conclusions are made mostly based on laboratory adsorption studies. Because of the complexity of the competitive adsorption equilibria 84 (Stachowicz et al., 2008), so far only a very few studies (for e.g. Jessen et al., 2012; Postma et 85 al., 2007; Swartz et al., 2004), have attempted to simulate the natural groundwater condition 86 to assess the role of adsorptive equilibria in the As mobilization. 87

The objective of the present study is to fill up the gap in existing knowledge with the assessment of relative roles of different competing ions in the As mobilization by means of surface complexation modeling of the naturally occurring As enriched groundwater in the aquifer of Bengal Basin. A total of 10 piezometers have been monitored for aqueous As and other important hydrogeochemical parameters including different competing ions, over a period of 20 months. Such monitoring has provided the opportunity to assess the role of 94 different competitive adsorption equilibria in the As mobilization processes by testing the 95 hypothesis that temporal variation of As in groundwater of Bengal Basin is governed by the 96 variation in concentration of competing ions. Two different surface complexation models 97 (SCMs) have been used to test this hypothesis. The relative roles of different competing ions 98 on the As mobilization is assessed by testing the sensitivity of the modeled aqueous As 99 concentration towards changes in the concentration of specific competing ion.

100 2. Materials and methods

101 2.1. Piezometers installation, groundwater sampling and laboratory analysis

Based on a survey at Chakdaha Block of Nadia District, West Bengal, two sites at the 102 village of Sahispur (Site 1; 23°04'15.5"N, 088°36'33.5"E) and Chakudanga (Site 2; 103 23º04'58"N, 088º38'13"E), where the concentration of As in groundwater was high and 104 relatively low respectively, were selected for piezometers installation. At each site over an 105 area of 25 m², five piezometers (well A, B, C, D and E) were installed with different screening 106 positions (Site 1 – A: 12-21 m, B: 22-25 m, C: 26-29 m, D: 30-33 m and E: 34-37 m; Site – 2: 107 108 A: 12-21 m, B: 24-27 m, C: 30-33 m, D: 36-39 m and E: 42-45 m) to collect multi depth groundwater samples (see Appendix for the picture of piezometer nests). Continuous 109 sediment cores were collected during drilling of deepest piezometer (well E) at each site, 110 using a split-spoon core barrel fitted to a PVC tube of 0.65 m length. Sediment samples were 111 preserved in the field by flushing with N₂, followed by rubber capping at both end of the 112 113 barrel.

The piezometers were sampled in 15 days intervals over a period of 20 months (December 2008 – July 2010). The regular sampling interval at both sites was interrupted once, in the month December 2009, when pumping and in-situ bio-stimulation experiments were conducted at site 1 and 2 respectively (details of the experiments and results have been

presented in Neidhardt et al. 2013a and Neidhardt et al., 2014). The sampling was resumed 118 again from January 2010. Groundwater was sampled for the analysis of major anions, major 119 cations and trace elements (including As), As speciation and Fe speciation with the field 120 measurements of alkalinity (in the form of HCO₃), pH, redox potential (Eh), electrical 121 conductivity (EC) and temperature (T). All the samples were filtered through 0.45 µm 122 membrane filter (Axiva). The samples for major cations and trace elements and Fe speciation 123 were preserved on-site with HNO₃ (1% v/v, Suprapur Merck) and HCl (12N, Suprapur 124 125 Merck) respectively. The samples for the analysis of major anions were left unacidified. During sampling, the samples for As speciation were additionally passed through an cartridge 126 (Metal Soft Centre, Highland Park, USA, Meng et al., 2001), which selectively adsorbs As(V) 127 and the filtrate was preserved with HNO₃ for the analysis of As that represents As(III). The 128 concentration of As(V) in the samples was determined by subtracting this As(III) from the 129 130 total As. The samples for anions and Fe speciation were analyzed overnight of sampling. The anions were analyzed by a Metrohm Ion Chromatography (761 Compact IC), equipped with 131 132 Metrosep Anion 1 column (No. 12007935). The percentage of Fe(II) was measured 133 spectrophotometrically by the O-phenanthroline method (APHA, 1998). The samples for major cations and trace elements and As speciation were stored at 4 °C until shipped (once in 134 8 weeks) to the Institute of Mineralogy and Geochemistry, Karlsruhe Institute of Technology 135 136 for the analysis by HR-ICP-MS (VG AXIOM, VG Elemental). The analytical precision was estimated by triplicate measurements, yielding an average precision of 1.71% for As. 137 Accuracy in the measurement was assessed by regular analysis of a certified reference 138 solution (Trace Metals In Drinking Water, HPS), reaching to an average accuracy of 1.81% 139 for As. The concentration of PO_4^{3-} in the samples was obtained from the elemental P 140 141 concentration, as determined by HR-ICP-MS. The exact concentrations of Fe(II) and Fe(III) in the samples were calculated by multiplying total Fe concentration measured with HR-ICP-142

MS, with percentage of Fe(II) and subtracting the calculated Fe(II) concentration from total 143 144 Fe concentration respectively. For the samples, where percentage of Fe(II) was not measured, median percentage of Fe(II) for other samples of the corresponding well was used for the 145 146 calculation of concentrations. Furthermore, the concentration of H_4SiO_4 was not measured for the monitoring samples but was measured during pumping and bio-stimulation experiment at 147 site 1 and 2 respectively. Tto incorporate the competition effect of H₄SiO₄ on As adsorption in 148 the simulations, the baseline value for each well, determined just before these experiments 149 was considered for all samples of the corresponding wells. 150

151 2.2. Modeling approach

One key step during the setup of different SCMs is the selection of sorbent phase(s) to be 152 153 used during simulation. An operationally defined seven-step sequential extraction of As from 154 aquifer sediments (n = 13) together with the association of As and Fe in sediment column at both the study sites have indicated that As is mainly present in the specifically adsorbed 155 fraction, bound to amorphous to crystalline Fe oxides (Biswas et al., submitted for 156 publication; Neidhardt et al., 2013a, b). Similar findings have been also reported from other 157 parts of the study area (Métral et al., 2008), Bangladesh (Swartz et al., 2004; van Geen et al., 158 159 2008), and Vietnam (Berg et al., 2008). Ferrihydrite, the major Fe oxyhydroxide mineral in oxic and slightly anoxic sediment (Stachowicz et al., 2007), has been used extensively for 160 previous adsorption studies. Additionally, the investigations of Fe mineralogy in the reduced 161 sediment, collected from the As-rich aquifers of Meghna and Red River flood plain have also 162 163 indicated the presence of relatively crystalline goethite (Datta et al., 2009; Postma et al., 2010), which has strong affinity for As(III) and As(V) adsorption (Dixit and Hering, 2003). 164 165 Recently, Jessen et al. (2012) have also pointed out that for the reduced aquifer sediment the use of SCM for goethite may be more appropriate. Thus in our simulations, we studied the 166 SCMs for both ferrihydrite and goethite. For ferrihydrite, we used 2-pK diffuse layer SCM, as 167

proposed by Dzombak and Morel, (1990) (hereafter referred to as D&M SCM). For goethite, 168 169 the 3-plane CD-MUSIC SCM, developed by Hiemstra and van Riemsdijk, (1996) was used. Considering the fact that the purpose of the present study was not to compare between the two 170 171 model parameterizations, these two different SCMs were chosen as they are thermodynamically most developed and frequently used for simulations of ion adsorption 172 onto ferrihydrite- or goethite-containing materials. Furthermore, an underlying assumption 173 with the selection of sorbent phases for the two models was that the adsorbing behavior of the 174 175 Fe oxyhydroxides present in the aquifer sediment is well approximated by their pure synthetic analogs (Davis et al., 1998). However, it should be mentioned here that in natural reduced 176 177 aquifer sediment these sorbent phases are more heterogeneous, often the complex mixture of multiple impure phases and further interact with other metal oxyhydroxides (for e.g. Mn and 178 Al oxyhydroxides), clay minerals and organics (Hiemstra et al., 2010; Jessen et al., 2012). 179 180 Thus in the aquifer the mobilization and transport behavior of As may be more complex compared to the assumption made. However, the simulation of such complexity demands 181 182 further development of thermodynamic database for the surface complexation reactions of As to the natural aquifer sediment. 183

The sorbent contents in the two SCMs were normalized for the individual well by 184 equilibrating the first monitoring sample of specific well, following the approach of Postma et 185 al. (2007) (Appendix Table A.1). The sorbent content was varied until the modeled aqueous 186 As(III) and As(V) agreed with their measured concentrations. We hypothesized that the 187 amount of sorbent content in the sediment and total As content in the system (As adsorbed + As 188 189 dissolved) for a particular well remained the same over the monitoring period; only the variation in pH and concentrations of competing ions determined the extent of partitioning of As 190 between sorbent and aqueous phase and thus the temporal variation of As in groundwater. 191 192 Consequently, the sorbent content in the specific SCM and total As content in the system for a

particular well were kept constant during the equilibration of all groundwater samples, 193 collected from the same well. The total As content in the system for a particular well was 194 calculated by adding the readily mobilizable and specifically adsorbed As content in the 195 sediment of screen position [converted to g/L assuming the porosity and grain density of 196 aquifer sediment as 0.3 and 2.65 g/cm³ respectively (Jessen et al., 2012)] to the average 197 dissolved As content in groundwater of the respective well. The readily mobilizable and 198 specifically adsorbed pools of As in the sediment samples were extracted in the first two steps 199 200 of sequentially extractions with 0.05 M (NH₄)₂SO₄ and 0.5 M NaH₂PO₄ respectively (Eiche et al., 2008). 201

The geochemical code Visual MINTEQ ver. 3.0 was used for all the simulations 202 203 (Gustafsson, 2011). For the D&M SCM of ferrihydrite, the parameters were set to the default values of Visual MINTEQ, whereas the CD-MUSIC SCM for goethite was parameterized 204 according to Jessen et al. (2012). The input concentrations for the measured groundwater 205 206 components (except As) were specified as 'Total Dissolved' in the simulations. For all groundwater samples, the value of Eh corresponding to H₃AsO₃/AsO₄ redox couple was 207 calculated from the measured concentration of As(III) and As(V) in a separate speciation 208 209 modeling exercise. Instead of field measured Eh value, this calculated Eh value was specified during simulations of both SCMs for the corresponding groundwater sample so that the ratio 210 of modeled aqueous As(III) to As(V) would become similar to the measured value and thus 211 the exact influence of As speciation into surface complexation reactions could be accounted. 212 In all simulations, ferrihydrite was allowed to precipitate with log $*K_s$ of 3.2 at 25°C (where 213 $K_s = {Fe^{3+}}/{H^+}^3$). For simulations with the D&M SCM, we used the default database in 214 Visual MINTEQ, feo-dlm 2008.vdb. This is based on the database of Dzombak and Morel, 215 (1990) but with the extension of surface species for HCO_3^- (Appelo et al., 2002), H_4SiO_4 216 (Swedlund and Webster, 1999), and Fe(II) (Appelo et al., 2002; Liger et al., 1999) and 217

modification of equilibrium constants for the surface reactions of PO_4^{3-} (Gustafsson, 2003) As(III) and As(V) (Gustafsson and Bhattacharya, 2007) (Appendix Table A.2). For the simulation of CD-MUSIC SCM, all the surface complexation reactions and the corresponding equilibrium constants were taken from the database prepared by Jessen et al. (2012) (for details see their Electronic Annex Table EA-1).

223 3. Results and discussion

3.1. General hydrogeochemistry in the aquifer at two sites

As the present study does not focus on the discussion of the detailed hydrogeochemical 225 evolution of the aquifer, here we present only the generic overview of groundwater 226 composition at the two sites. In the groundwater at both sites, Ca^{2+} is the predominating cation 227 followed by Mg^{2+} , Na^+ and K^+ and HCO_3^- is the major anion followed by Cl⁻. Consequently, 228 the groundwater at both sites is Ca-Mg-HCO₃-type to Ca-HCO₃ type with circumneutral pH 229 (Appendix Fig. A.1). The concentration of SO_4^{2-} is mostly below the detection limit (BDL) 230 over the monitoring period, except in the well A & B at site 1. Similarly, the concentration of 231 NO₃⁻ is also mostly BDL in all the wells at both sites. The concentration of most of the ionic 232 constituents is higher at site 1 compared to site 2. The EC in groundwater follows a similar 233 trend, being higher at site 1 (Appendix Fig. A.1). In all the wells at both sites, the 234 235 concentrations of dissolved As exceeds the WHO provisional drinking guideline of 10 µg/L. Arsenic shows the highest enrichment in well C and well B at site 1 and site 2 respectively 236 (Appendix Fig. A.2). The aquifer at both sites is reducing in nature, where the lower oxidation 237 state of As and Fe predominates over the corresponding higher oxidation sate. In all the wells, 238 the concentration of PO_4^{3-} shows a strong positive correlation to As (Biswas et al., submitted 239 for publication). The hydrogeochemical evolution of the groundwater composition at the two 240 sites has been discussed in detail elsewhere (Biswas et al., submitted for publication). The 241

groundwater composition presented here is representative for the shallow aquifers of whole
Bengal Basin (Bhattacharta et al., 2002; Biswas et al., 2012; Charlet et al., 2007; Harvey et
al., 2002; Mukherjee et al., 2008; Nath et al., 2008; Zheng et al., 2004).

245 3.2. Temporal variations of As(III) and As(V) in groundwater

The temporal variations of As(III) and As(V) over the monitoring period are displayed in Fig. 1 and 2 respectively. Additionally, the extent of variability is statistically estimated by calculating the standard deviation of As(III) and As(V) concentration (Appendix Table A.3). In all the piezometers of both sites, the standard deviation of As(III) concentration is \geq 10 μ g/L (Appendix Table A.3), reflecting strong temporal variation.

In site 1, a general trend of As(III) enrichment was observed for well A over the monitoring 251 period (Fig. 1). A very strong temporal variation in As(III) concentration was observed for 252 well B and C, where the concentration respectively varied between $70.1 - 393 \,\mu$ g/L and 20.6253 254 $-317 \mu g/L$, with a standard deviation of 103 $\mu g/L$ and 63.0 $\mu g/L$ respectively (Appendix 255 Table A.3). In both wells, the variation followed a cyclic trend over the monitoring period (Fig. 1). In well B, starting from the monitoring in December 2008, the As(III) concentration 256 257 had been decreasing over the dry season until the end of April 2009. No considerable variation was observed in the following 7 month period up to November 2009, when regular 258 259 sampling was stopped for one month for the pumping experiment (Fig. 1). When sampling was started again in January 2010, the As(III) concentration increased to close the value 260 recorded at the beginning of monitoring in December 2008 (Fig. 1). In the following dry 261 262 season period, the variation pattern was similar to the previous year. However, this time the 263 As(III) concentration increased instantly after approaching the minimum value in May 2010 264 (Fig. 1). In well C, a small decrease in the As(III) concentration was also observed at the end 265 of April 2009 (Fig. 1). However in contrast to well B, after an initial decrease,, the

concentration increased back to the original value instantaneously and was then quite stable 266 267 throughout the rest of the year. When the well was first sampled in 2010 after the pumping experiment, the As(III) concentration was roughly the same (Fig. 1). In the following dry 268 269 period of 2010, the variation pattern was similar to that in the previous year. However, this time the decrease in concentration was very large, resulting in the lowest value observed 270 during the whole monitoring period considering all the piezometers of site 1 (Fig. 1). The 271 temporal variation in As(III) concentration for well D and E of site 1 did not show any 272 specific trend (Fig. 1). Except for well A, the standard deviation of As(V) in all other wells 273 was $\geq 10 \ \mu g/L$, being the highest for well C (Appendix Table A.3). However, the temporal 274 275 variation did not show any specific trend over the monitoring period for any well (Fig. 2).

276 In site 2, the highest temporal variation was observed in well A (Fig. 1), where the As(III) concentration varied between 16.8 and 127 µg/L with a standard deviation of 29.6 µg/L 277 (Appendix Table A.3). In contrast to the variation observed in site 1, the dissolved As(III) 278 279 concentration increased at the beginning of dry period, both in 2009 and 2010 and the relative enrichment in 2010 was slightly higher than in 2009. After passing through the maximum 280 value, the concentration decreased to the lowest value around the end of the dry season and no 281 significant variation was observed in the following monsoon period (Fig. 1). The temporal 282 variation in As(III) concentration for other wells of site 2 did not show any specific trend over 283 the monitoring period (Fig. 1). The standard deviation of the As(V) concentration was 284 throughout <10 µg/L for all wells (Appendix Table A.3) and no specific trend was observed 285 in the temporal variation also (Fig. 2). The temporal variations of total As and other aqueous 286 287 parameters at the two sites over the monitoring period have been reported in Biswas et al. (submitted for publication). 288

289 **3.3.** Application of SCMs in predicting temporal variability of As

To investigate the role of different surface complexation reactions onto aquifer materials in 290 291 the As mobilization in groundwater, we attempted to model the temporal variability in As(III) and As(V) concentrations by use of the D&M and CD-MUSIC SCMs (Fig. 1 and 2). The 292 293 comparison of the model-predicted concentration with the measured value indicates that though the performance of the CD-MUSIC SCM in predicting As(III) concentration in the 294 wells of site 1 is fairly good, the predictions of the D&M SCM are even closer to the 295 measured trends (Fig. 1). In site 2, the As(III) concentration predicted by both D&M and CD-296 297 MUSIC SCMs closely follows the measured concentration until the end of November 2009, when the sampling was stopped for one month for the bio-stimulation experiment (Fig. 1). In 298 the post-experiment period, the CD-MUSIC SCM largely under-predicts the As(III) 299 concentration, whereas the concentration predicted by the D&M SCM quite closely follows 300 301 the measured value to the end of the monitoring (Fig. 1).

302 Estimation of root mean square error (RMSE) of the logarithm of dissolved As(III) 303 concentration was used as an indicator of the accuracy of the models. This analysis supports the above inferences. In site 1 except for well B, the values of RMSE for the D&M SCM are 304 ≤ 0.10 , while the values for the CD-MUSIC SCM in all the wells are > 0.10 (Appendix Table 305 A.4), indicating the better performance of the D&M SCM over the CD-MUSIC SCM in 306 predicting the variability of As(III) concentration at our study site. Similarly in site 2, except 307 for well A the values of RMSE for the D&M SCM are <0.10. For the CD-MUSIC SCM, the 308 RMSE was estimated for the pre- and post-experiment period separately, to evaluate the effect 309 310 of bio-stimulation experiment on the model performance. In the pre-experiment period, the 311 RMSE values are close to that calculated for D&M SCM; however, they have increased largely in the post-experiment period (Appendix Table A.4). The poor performance of both 312 SCMs in predicting As(III) concentration for the well B and well A of site 1 and 2 313 314 respectively (Fig. 1), might be due to the fact that for these wells the total As content in the 315 system did not remain constant over the monitoring period as our hypothesis. The 316 investigations by Neidhardt et al. (2014) and Neidhardt et al. (2013a) have already pointed out 317 the possibility of seasonal vertical mixing of groundwaters with distinct As concentrations 318 from different depths in these two wells.

For As(V), the predicted concentration by both SCMs approximately follows the scattered peaks observed in the measured concentration over the monitoring period (Fig. 2). However, the estimation of RMSE indicates that the performance of the D&M SCM is to some extent better than that of the CD-MUSIC SCM and both models provide better estimations for As(III) than for As(V) (Appendix Table A.4).

324 3.4. Modeled surface speciation of the aquifer sediment

An attempt was also made to investigate the extent of formation of different complexes at 325 the surface of sorbent considered in the two SCMs, by analyzing the simulated fractional site 326 327 occupancy. Well E from site 1 was selected for this investigation, based on the low estimated RMSE values for both SCMs for the prediction of As(III) concentration in groundwater 328 (Appendix Table A.4). The surface speciation of the weak sites on Fe oxyhydroxide, as 329 330 predicted by the two SCMs, fairly well resembles each other (Fig. 3). According to both SCMs, the surface complexes of PO_4^{3-} are the major adsorbing species, covering 35% and 331 58% of the week surface sites of ferrihydrite and goethite, respectively. For ferrihydrite, the 332 D&M SCM further predicts that H+ and Fe(II) occupy 26 % and 14 % of the surface sites, 333 respectively. The CD-MUSIC SCM for goethite predicts a higher adsorption of Fe(II) (22%) 334 335 compared to H^+ (9%) (Fig. 3). Though HCO₃⁻ is the major anion in groundwater, very low to negligible site occupancy by carbonate surface complexes is estimated by both the SCMs. 336 According to the D&M SCM they only cover 10% of the surface sites, similar to the 337 338 adsorption of H₄SiO₄ species, and the CD-MUSIC SCM estimates <1% of the surface

coverage to be due to the complexes of the HCO₃⁻ and H₄SiO₄ species (Fig. 3). Following the 339 large predominance of As(III) concentration over As(V) in groundwater, both SCMs predict 340 higher average concentration of As(III) surface complexes compared to As(V) complexes. 341 The previous study by Jessen et al. (2012) also reported similar surface speciation for the 342 Vietnam aquifer sediment by the simulation of CD-MUSIC SCM for goethite, the only 343 difference being a higher adsorption of As(V) compared to As(III). However, the estimation 344 by the D&M SCM for ferrihydrite in the present study significantly differs from the 345 composition of surface complexes previously calculated by the simulation of the D&M SCM 346 for Bangladesh (Swartz et al., 2004), and for Vietnam aquifer sediment (Jessen et al., 2012; 347 Postma et al., 2007), where H_4SiO_4 and HCO_3 were reported to be the major adsorbing 348 species with a relatively low surface coverage by PO_4^{3-} . Further, in agreement with the 349 findings of Jessen et al. (2012) the CD-MUSIC SCM predicts the binding of As(III) to 350 351 goethite exclusively by the formation of the As(III)-Fe(II) ternary surface complex (>Fe_uniOAs(OH)₃Fe^{+0.5}). The formation of such a complex may explain the under-352 353 prediction of As(III) concentration by the CD-MUSIC SCM in the post-bio-stimulation experiment period for the wells at site 2. It should be mentioned here that due to the bio-354 stimulation in the aquifer by injecting degradable organic matter, the local groundwater 355 composition was changed drastically for several days, including an elevation in As and Fe 356 357 concentration (Neidhardt et al., 2014). When the regular monitoring was started again in January 2010, the As concentration had returned to the baseline value in all five piezometers 358 (Fig. 1), while the Fe concentration remained elevated till the end of the monitoring 359 (Neidhardt et al., 2014). 360

361 **3.5. Relative roles of competing ions and pH on the mobilization of As**

In order to estimate the relative roles of competing ions and pH on the As mobilization, the sensitivity of the modeled aqueous As(III) and As(V) concentrations towards the changes in

the concentration of competing ions and pH was investigated (Fig. 4). The sensitivity test was 364 performed by the simulation of only the D&M SCM for the well E of site 1. The D&M SCM 365 was chosen as it better predicts the temporal variation of As at both study sites over the whole 366 monitoring period. For the sensitivity test, only the concentration of the selected parameter of 367 interest was varied (-100% to +100%, except for pH, which was varied -5% to +5%) in the 368 simulation, while keeping concentration of other parameters fixed to the measured value. The 369 results indicate that in the aquifer PO_4^{3-} is the major competitor of As(III) and As(V) 370 371 adsorption onto Fe oxyhydroxide (Fig. 4) and the competition ability of the different ions decreases in the order $PO_4^{3-} >> Fe(II) > H_4SiO_4 = HCO_3^{-1}$. In the simulation, when dissolved 372 concentration of PO_4^{3-} is set to zero, the modeled concentration of both As(III) and As(V) is 373 reduced on average by 92.5%. However, a similar imposition for the concentration of Fe(II), 374 H_4SiO_4 and HCO_3^- in the simulation only reduces the As(III) concentration by 12.2%, 7.40%, 375 376 and 7.04% respectively (Table 1). Phosphate, Fe(II) and H₄SiO₄ appears to be equally effective to compete with both As(III) and As(V), while HCO₃⁻ competes more strongly with 377 378 As(V) as compared to As(III) (Table 1). Though previous studies have concluded that Fe(II) 379 does not affect the re-sorption of As onto residual Fe oxyhydroxide (Appelo et al., 2002; Dixit and Hering, 2006), our results indicates a small but significant competition between Fe(II) and 380 As for adsorption sites on Fe oxyhydroxides. It is further observed that the As concentration 381 does not vary linearly with the change in PO_4^{3-} concentration. Although, the As(III & V) 382 concentration is reduced by 92.5% when the PO_4^{3-} concentration is set to zero in the 383 simulation, it is increased by only 31.4% when the PO_4^{3-} concentration is doubled (Table 1). 384 This demonstrates that in the aquifer the competition of PO_4^{3-} with As for the adsorption sites 385 might already reach close to maximum level. In contrast, the relationships with the other 386 387 competing ions are still linear (Table 1).

Some studies have also concluded that Ca^{2+} can enhance the adsorption of As(V) onto Fe 388 oxyhydroxide significantly particularly at high pH, by reducing the surface negative charge 389 (Stachowicz et al., 2008). In contrast, recently Saalfield and Bostick, (2010) have suggested 390 that the adsorption of Ca^{2+} or Mg^{2+} together with HCO_3^{-} can increase the desorption of As(V) 391 from ferihydrite to a greater extent compared to their individual competition. To this end a 392 sensitivity test was performed by changing the concentrations of these ions in different 393 combinations. The results indicate that the change in concentration of Ca²⁺ and Mg²⁺ together 394 with HCO_3^- affect the adsorption of both As(III) and As(V) to Fe oxyhydroxide almost 395 negligibly (Appendix Fig. A.3). 396

397 The results further indicate that the pH value also has a strong influence on the mobility of 398 As(III) and As(V) in the aquifer by changing their concentration oppositely to each other (Fig. 4). A 5% decrease in pH increases the As(III) concentration by 65.3% and decreases the 399 As(V) concentration by 91.2% on average, representing greater influence on the As(V) 400 401 mobility. The influence on the As(V) mobility becomes even more prominent during increase of pH (Table 1). The ease of formation of the major surface complexes for As(III) and As(V) 402 determines their different behavioral pattern towards the change in pH. In the D&M SCM, the 403 major surface complex for As(III) and As(V) are >Fe_wH₂AsO₃ and >Fe_wHAsO₄, 404 respectively. With a decrease of pH the formation of >Fe_wH₂AsO₃ and >Fe_wHAsO₄ 405 complexes and consequently the adsorption of As(III) and As(V) are constrained and favored 406 respectively. Moreover, as reflected in the modeled speciation of surface complexes formed in 407 408 the D&M SCM (Fig. 3), with a decrease of pH the protonation of the weak sites would be increased making them less available for As(III) adsorption. At the same time the protonation 409 of the weak sites reduces the surface negative charge and consequently decreases the 410 electrostatic repulsion during adsorption of negatively charged oxyanions of As(V). At high 411

pH, this electrostatic repulsion becomes so prominent that the desorption of the oxyanions ofAs(V) increases drastically.

414 **4.** Conclusion

The assessment of the role of competing ions in the As mobilization processes by surface 415 complexation modeling of the temporal variability of As in groundwater suggests that only 416 the reductive dissolution of Fe oxyhydroxide cannot explain the observed high As 417 concentration in the groundwater of Bengal Basin. Competitive adsorption/desorption 418 reactions with the aquifer sediment have an important role in the As mobilization processes. 419 In the absence of potential competition for the adsorption sites, the As released by the 420 reductive dissolution of Fe oxyhydroxide would have been re-adsorbed onto the residual Fe 421 phases and other sorbents present in the aquifer sediment. It appears that the reductive 422 dissolution of Fe oxyhydroxide followed by competitive ion adsorption, mainly by PO_4^{3-} , with 423 the aquifer sediment is the main processes responsible for As enrichment in the sedimentary 424 aquifers of Bengal Basin. 425

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Table 1. Average change in modeled aqueous As(III) and As(V) concentration for the samples collected from well E of site 1 in response to the variation in pH and concentration of different competing ions. The '-' & '+' signs indicates the decrease and increase of the value respectively.

Parameters	Change in parameters (%)	Change in conc. of As(III) (%)	Change in conc. of As(V) (%)
	-5.00	+65.3	-91.2
ъЦ	-2.50	+28.7	-70.9
рп	+2.50	-28.3	+231
	+5.00	-55.5	+877
	-100	-92.5	-92.5
PO ³⁻	-50.0	-23.3	-23.3
$1O_4$	+50.0	+17.2	+17.2
	+100	+31.4	+31.4
	-100	-7.40	-7.40
LI SIO	-50.0	-3.69	-3.69
1145104	+50.0	+3.72	+3.72
	+100	+7.42	+7.42
	-100	-7.04	-11.2
HCO	-50.0	-3.53	-5.63
ΠCO_3	+50.0	+3.55	+5.67
	+100	+7.12	+11.4
	-100	-12.2	-12.3
Fe(II)	-50.0	-5.68	-5.76
	+50.0	+5.06	+5.15
	+100	+9.61	+9.81



Fig. 1. Measured and predicted (with the D&M and CD-MUSIC SCMs) temporal variability in the concentration of aqueous As(III) for the piezometers of site 1 & 2. Blue-shaded area and white area in the figure represents monsoon period and dry period respectively. Green line and red line represents the time of pumping experiment at site 1 and bio-stimulation experiment at site 2 respectively.



Fig. 2. Measured and predicted (with the D&M and CD-MUSIC SCMs) temporal variability in the concentration of aqueous As(V) for the piezometers of site 1 & 2. Blue-shaded area and white area in the figure represents monsoon period and dry period respectively. Green line and red line represents the time of pumping experiment at site 1 and bio-stimulation experiment at site 2 respectively.

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Fig. 3. The average D&M and CD-MUSIC SCMs predicted surface speciation of the weak adsorption sites, estimated by the equilibration of groundwater samples, collected from the well E of site 1. The fractional site occupancy by a component (except H⁺) is calculated by adding all the surface complexes formed by the specific component with weak adsorption sites. For H⁺, only the surface complex >Fe_OH₂⁺ and >Fe_OH₂^{0.5+} was considered for the calculation of fractional site occupancy in D&M and CD-MUSIC SCMs respectively.



Fig. 4. Sensitivity of the modeled aqueous As(III) and As(V) concentration towards the change in pH and concentration of competing ions. A sensitivity test was performed by the simulation of the D&M SCM by equilibrating the groundwater samples of well E of site 1. In the sensitivity test only the value of selected parameter of interest was varied (-100% to +100%, except for pH, which was varied -5% to +5%), while keeping other parameters fixed to the measured value, in the simulation.

Appendix A

Role of competing ions in the mobilization of arsenic in groundwater of Bengal Basin: Insight from surface complexation modeling

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A11	Text A.1	References



Picture A.1. Picture of the piezometer nests at the two villages of Chakdaha Block, Nadia District, West Bengal, India.

Location	Well ID	D&M SCM	CD-MUSIC SCM
		(g/L)	(g/L)
	А	21.2	42.3
	В	4.81	10.5
Site 1	С	2.35	10.2
	D	6.72	10.2
	E	25.2	41.5
	А	16.8	49.0
	В	3.40	6.30
Site 2	С	15.0	31.0
	D	10.6	26.7
	E	6.48	19.2

Table A.1. Normalized sorbent content in each SCM for the piezometers of site 1 & 2.

Table A.2. Acid-base and surface complexation reactions and corresponding equilibrium constants used in the D&M S	CM for
ferrihydrite	

Reactions	Log K	Source
Acid-base reactions		
$>$ Fe_sOH + H ⁺ = $>$ Fe_sOH ₂ ⁺	7.29	Dzombak and Morel, 1990
$>$ Fe_sOH = $>$ Fe_sO ⁻	-8.93	Dzombak and Morel, 1990
$>$ Fe_wOH + H ⁺ = $>$ Fe_wOH ₂ ⁺	7.29	Dzombak and Morel, 1990
>Fe_wOH = >Fe_wO ⁻	-8.93	Dzombak and Morel, 1990
Surface Complexation reactions		
\underline{Ca}^{2+}		
$>$ Fe_sOH + Ca ²⁺ = $>$ Fe_sOHCa ²⁺	4.97	Dzombak and Morel, 1990
$>$ Fe_wOH + Ca ²⁺ = $>$ Fe_wOCa ⁺ + H ⁺	-5.85	Dzombak and Morel, 1990
\underline{Mg}^{2+}		
$>$ Fe_wOH + Mg ²⁺ = $>$ Fe_wOMg ⁺ + H ⁺	-4.6	Dzombak and Morel, 1990
<u>Mn2+</u>		
$>$ Fe_sOH + Mn ²⁺ = $>$ Fe_sOMn ⁺ + H ⁺	-0.4	Dzombak and Morel, 1990
$>$ Fe_wOH + Mn ²⁺ = $>$ Fe_wOMn ⁺ + H ⁺	-3.5	Dzombak and Morel, 1990
<u>Fe(II)</u>		
$>$ Fe_sOH + Fe ²⁺ = $>$ Fe_sOFe ⁺ + H ⁺	-0.95	Appelo et al., 2002
$>$ Fe_wOH + Fe ²⁺ = $>$ Fe_wOFe ⁺ + H ⁺	-2.98	Liger et al., 1999
$>$ Fe_wOH + Fe ²⁺ + H ₂ O = $>$ Fe_wOFeOH + 2H ⁺	-11.55	Liger et al., 1999
$PO_4^{\underline{3}}$		
$\overline{}$ = sOH + PO ₄ ³⁻ + 3H ⁺ = >Fe_sH ₂ PO ₄ + H ₂ O	32.08	Gustafsson, 2003
$>Fe_wOH + PO_4^{3-} + 3H^+ = >Fe_wH_2PO_4 + H_2O$	32.08	Gustafsson, 2003
$>Fe_sOH + PO_4^{3-} + 2H^+ = >Fe_sHPO_4^- + H_2O^-$	26.39	Gustafsson, 2003
$>Fe_wOH + PO_4^{3-} + 2H^+ = >Fe_wHPO_4^{-} + H_2O$	26.39	Gustafsson, 2003

$>Fe_sOH + PO_4^{3-} + H^+ = >Fe_sPO_4^{2-} + H_2O$	20.73	Gustafsson, 2003
$>Fe_wOH + PO_4^{3-} + H^+ = >Fe_wPO_4^{2-} + H_2O$	20.73	Gustafsson, 2003
$\underline{As(V)}$		
$>$ Fe_sOH + AsO ₄ ³⁻ + 3H ⁺ = $>$ Fe_sH ₂ AsO ₄ + H ₂ O	30.98	Gustafsson and Bhattacharya, 2007
$>$ Fe_wOH + AsO ₄ ³⁻ + 3H ⁺ = $>$ Fe_wH ₂ AsO ₄ + H ₂ O	30.98	Gustafsson and Bhattacharya, 2007
$>$ Fe_sOH + AsO ₄ ³⁻ + 2H ⁺ = $>$ Fe_sHAsO ₄ - + H ₂ O	25.84	Gustafsson and Bhattacharya, 2007
$>$ Fe_wOH + AsO ₄ ³⁻ + 2H ⁺ = $>$ Fe_wHAsO ₄ ⁻ + H ₂ O	25.84	Gustafsson and Bhattacharya, 2007
$>Fe_sOH + AsO_4^{3-} + H^+ = >Fe_sAsO_42^- + H_2O$	19.5	Gustafsson and Bhattacharya, 2007
$>Fe_wOH + AsO_4^{3-} + H^+ = >Fe_wAsO_4^{2-} + H_2O$	19.5	Gustafsson and Bhattacharya, 2007
$>$ Fe_sOH + AsO ₄ ³⁻ = $>$ Fe_sOHAsO ₄ ³⁻	11.92	Gustafsson and Bhattacharya, 2007
$>$ Fe_wOH + AsO ₄ ³⁻ = $>$ Fe_wOHAsO ₄ ³⁻	11.92	Gustafsson and Bhattacharya, 2007
<u>As(III)</u>		
$>$ Fe_sOH + H ₃ AsO ₃ = $>$ Fe_sHAsO ₃ ⁻ + H ⁺	-2.19	Gustafsson and Bhattacharya, 2007
$>$ Fe_wOH + H ₃ AsO ₃ = $>$ Fe_wHAsO ₃ ⁻ + H ⁺	-2.19	Gustafsson and Bhattacharya, 2007
$>$ Fe_sOH + H ₃ AsO ₃ = $>$ Fe_sH ₂ AsO ₃ + H ₂ O	5.27	Gustafsson and Bhattacharya, 2007
$>$ Fe_wOH + H ₃ AsO ₃ = $>$ Fe_wH ₂ AsO ₃ + H ₂ O	5.27	Gustafsson and Bhattacharya, 2007
$\underline{H_4SiO_4}$		
$>$ Fe_sOH + H ₄ SiO ₄ = $>$ Fe_sH ₃ SiO ₄ + H ₂ O	4.28	
$>$ Fe_wOH + H ₄ SiO ₄ = $>$ Fe_wH ₃ SiO ₄ + H ₂ O	4.28	Swedlund and Webster, 1999
$>$ Fe_sOH + H ₄ SiO ₄ = $>$ Fe_sH ₂ SiO ₄ + H ⁺ + H ₂ O	-3.22	
$>$ Fe_wOH + H ₄ SiO ₄ = $>$ Fe_wH ₂ SiO ₄ + H ⁺ + H ₂ O	-3.22	Swedlund and Webster, 1999
$> Fe_sOH + H_4SiO_4 = > Fe_sHSiO_4^{2-} + 2H^+ + H_2O$	-11.69	
$>$ Fe_wOH + H ₄ SiO ₄ = $>$ Fe_wHSiO ₄ ²⁻ + 2H ⁺ + H ₂ O	-11.69	Swedlund and Webster, 1999
HCO ₃		
$>$ Fe_sOH + CO ₃ ²⁻ + H ⁺ = $>$ Fe_sCO ₃ ⁻ + H ₂ O	12.78	
$>Fe_wOH + CO_3^{2-} + H^+ = >Fe_wCO_3^{-} + H_2O$	12.78	Appelo et al., 2002
$>$ Fe_sOH + CO ₃ ²⁻ + 2H ⁺ = $>$ Fe_sHCO ₃ + H ₂ O	20.37	
$>$ Fe_wOH + CO ₃ ²⁻ + 2H ⁺ = $>$ Fe_wHCO ₃ + H ₂ O	20.37	Appelo et al., 2002

$\underline{SO_4}^{2-}$		
$Fe_sOH + SO_4^{2-} + H^+ = Fe_sSO_4^{-} + H_2O$	7.78	
$Fe_wOH + SO_4^{2-} + H^+ = Fe_wSO_4^{-} + H_2O$	7.78	Dzombak and Morel, 1990
$Fe_sOH + SO_4^{2-} + H^+ = Fe_sOHSO_4^{2-}$	0.79	
$Fe_wOH + SO_4^{2-} + H^+ = Fe_wOHSO_4^{2-}$	0.79	Dzombak and Morel, 1990

Location	Well ID	No. of	As(III) (µg/L)		As(V) (μ g/L)	
		sample	Range	Average ± Stdev	Range	Average ± Stdev
Site 1	А	33	43.0 - 112	68.5 ± 17.1	BDL - 14.5	5.70 ± 4.07
	В	33	70.1 - 393	158 ± 103	BDL - 59.8	10.0 ± 11.0
	С	33	20.6 - 317	234 ± 63.0	BDL - 149	39.0 ± 35.0
	D	33	189 -279	223 ± 22.0	BDL - 35.6	11.0 ± 10.0
	E	32	105 - 155	138 ± 14.0	BDL - 41.3	10.0 ± 10.0
Site 2	А	33	16.8 - 127	56.1 ± 29.6	0.40 - 14.4	5.20 ± 3.71
	В	33	102 - 162	130 ± 13.1	BDL - 30.8	9.10 ± 8.24
	С	32	93.2 - 128	112 ± 10.5	0.50 - 34.7	9.59 ± 8.20
	D	32	85.3 - 129	108 ± 11.4	BDL - 25.4	9.17 ± 6.86
	Е	31	90.2 - 140	112 ± 13.0	BDL - 25.5	7.76 ± 6.33

Table A.3. Statistical summary of the temporal variation of As(III) and As(V) concentrations in the piezometers of site 1 & 2.

Table A.4. Estimated root mean square error (RMSE) values for assessing the accuracy of fitting of the measured concentrations of As(III) and As(V) to the respective modeled concentrations, predicted by D&M and CD-MUSIC SCMs for the piezometers of two sites.

Location	Well ID		As(III)	As(V)		
		D&M Model	CD-MUSIC Model	D&M Model	CD-MUSIC Model	
Site 1	А	0.10	0.15	0.15	0.19	
	В	0.40	0.34	0.40	0.35	
	С	0.10	0.23	0.15	0.25	
	D	0.09	0.12	0.24	0.30	
	E	0.06	0.12	0.24	0.25	
Site 2	А	0.17	0.18(0.31)*	0.25	0.21(0.32)	
	В	0.06	0.06(0.18)	0.27	0.26(0.24)	
	С	0.09	0.06(0.18)	0.21	0.18(0.15)	
	D	0.08	0.14(0.24)	0.28	0.22(0.20)	
	E	0.09	0.14(0.32)	0.16	0.16(0.29)	

*In site 2, for CD-MUSIC SCM, the RMSE values were estimated for pre- and post-biostimulation experiment period, to evaluate the effect of bio-stimulation experiment on the model performance. The values of RMSE for post-experiment period are given in the parenthesis.



Fig. A.1. Distribution of major cations, anions, pH and electrical conductivity (EC) in the wells at two sites.



Fig. A.2. Distribution of As and other aqueous redox parameters in the wells at two sites. The legend of the Box Whisker plot is same as Fig. A.2.



Fig. A.3. Sensitivity of the modeled aqueous As(III) and As(V) concentration towards the change in the concentration of Ca^{2+} , Mg^{2+} and HCO_3^{-} in different combination. A sensitivity test was performed by the simulation of only D&M SCM by equilibrating the groundwater samples of well E of site 1. In the sensitivity test only the value of selected parameter of interest was varied (-100% to +100%), while keeping other parameters fixed to the measured value, in the simulation.

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