**RESEARCH ARTICLE**



# **Investigating the transport and colloidal behavior of Fe3O4 nanoparticles in aqueous and porous media under varying solution chemistry parameters**

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## **Abstract**

The possible adverse effects of engineered iron oxide nanoparticles, especially magnetite (Fe<sub>3</sub>O<sub>4</sub> NP), on human health and the environment, have raised concerns about their transport and behavior in soil and water systems. Accumulating these NPs in the environment can substantially afect soil and water quality and the well-being of aquatic and terrestrial organisms. Therefore, it is essential to examine the factors that affect  $Fe<sub>3</sub>O<sub>4</sub>$  NP transportation and behavior in soil and water systems to determine their possible environmental fate. In this work, experiments were conducted in aqueous and porous media using an environmentally relevant range of pH  $(5, 7, 9)$ , ionic strength  $(IS)$   $(10, 50, 100 \text{ mM})$ , and humic acid  $(HA)$   $(0.1, 1, 10 \text{ mg})$ L<sup>-1</sup>) concentrations. Fe<sub>3</sub>O<sub>4</sub> NPs exhibited severe colloidal instability at pH 7 ( $\sim$  = pH<sub>PZC</sub>) and showed an improvement in apparent colloidal stability at pH 5 and 9 in aquatic and terrestrial environments. HA in the background solutions promoted the overall transport of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs by enhancing the colloidal stability. The increased ionic strength in aqueous media hindered the transport by electron double-layer compression and electrostatic repulsion; however, in porous media, the transport was hindered by ionic compression. Furthermore, the transport behavior of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs was investigated in different natural waters such as rivers, lakes, taps, and groundwater. The interaction energy pattern in aquatic systems was estimated using the Derjaguin-Landau-Verwey-Overbeek (DLVO) theory. This study showed the effects of various physical–chemical conditions on  $Fe<sub>3</sub>O<sub>4</sub>$  NP transport in aqueous and porous (sand) media.

**Keywords**  $Fe<sub>3</sub>O<sub>4</sub> \cdot DLVO$  theory  $\cdot$  Aqueous environment  $\cdot$  Porous media  $\cdot$  Transport

# **Introduction**

Iron oxide nanoparticles ( $Fe<sub>3</sub>O<sub>4</sub>$  NPs) have remarkable characteristics such as superparamagnetic capabilities, large surface-to-volume ratio, and biocompatibility; thus, it is the

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choice of interest for many applications (Ali et al. [2016](#page-10-0)). Magnetite ( $Fe<sub>3</sub>O<sub>4</sub>$ ) is one of the most prevalent forms of iron oxide occurring in nature (Elias and Alderton [2020](#page-10-1)). The engineered  $Fe<sub>3</sub>O<sub>4</sub>$  NPs are generally acceptable for many applications such as sensor development, pigment production, biomedical imaging, ferrofluid technology, and environmental remediation (Imran et al. [2021;](#page-11-0) Kumar et al.  $2021$ ). Nevertheless, the extensive use of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs is potentially detrimental to aquatic biota and human life.  $Fe<sub>3</sub>O<sub>4</sub>$  NPs are released into the aquatic and terrestrial environments through various anthropogenic processes. The fate of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in the environment is influenced by their physical and chemical properties, such as size, shape, and crystal structure. For instance, the smaller magnetite particles can be transported further in the environment and are more mobile, but larger particles may settle more rapidly and accumulate in certain regions (Popescu et al. [2019;](#page-11-2) Vindedahl et al. [2016](#page-11-3)). The surface properties may also infuence

their fate in the environment. For instance, natural organic matter (NOM) may be coated on the surface of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs, which may impact their ability to interact with other elements of the environment (Daoush [2017\)](#page-10-2). After being released into the environment,  $Fe<sub>3</sub>O<sub>4</sub>$  NPs are exposed to multiple environmental conditions of the aquatic and terrestrial systems, such as pH, ionic strength, fow velocity, pore size, and concentration of natural organic matter (NOM) (Goswami et al. [2017;](#page-10-3) Lei et al. [2018](#page-11-4)). These NPs may be deposited in porous media or transported via aqueous media once in the environment, potentially toxic to terrestrial and aquatic organisms (Naz et al. [2022](#page-11-5); Ouyang et al. [2022](#page-11-6); Yu et al. [2014](#page-12-0)). Diferent environmental factors, however, may impact the fate and toxicity of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs (Galloway et al. [2017](#page-10-4); Kahlon et al. [2018\)](#page-11-7).

The transport of NPs in aqueous and porous media signifcantly afects how they will behave in the environment and how they may afect the environment and human health. Several components, including IS and NOM, govern the transport in aqueous media. In contrast, transport in porous media is primarily determined by physical processes such as advection, difusion, and retention in the pore spaces (Dibyanshu et al. [2022](#page-10-5), Ling et al. [2021](#page-11-8), Meng and Yang [2019](#page-11-9)). Multiple research groups have previously explored the effect of several environmentally signifcant physicochemical factors on the transport and behavior of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs (Chen et al. [2019](#page-10-6); Fazeli Sangani et al. [2019;](#page-10-7) Wang et al. [2022\)](#page-11-10). Surface charge and pH levels substantially impact NPs' behavior in the aqueous environment. The NPs' high surface charges at both high and low pH levels cause stronger electrostatic repulsion between them, which prevents them from aggregating. However, as the pH gets closer to the point of zero charge (PZC) for the particles, the surface charge of the particle gets shielded by the water ions, which diminishes electrostatic repulsion and ultimately raises the probability of aggregation (Chekli et al. [2013](#page-10-8)). Adding NOM enhanced the stability of iron oxide NPs in the aqueous environment. The higher environmental concentration of NOM triggered NP disaggregation due to the enhanced steric repulsion induced by the sorption of negatively charged NOM molecules (Baalousha [2009](#page-10-9)). The transport of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in porous media presents distinctive hurdles owing to various factors, including their dimensions, surface properties, interactions with the solid matrix, and the coexistence of additional substances. These factors intricately afect the stability, aggregation, and deposition of the NPs, consequently shaping their fate and spatial distribution within the media. Li et al. investigated iron oxide's co-transport and retention behavior and diferent-sized plastic particles in saturated sand media. Their fndings suggest that the steric repulsion, variation of retention sites on sand particles, and the modification of  $Fe<sub>3</sub>O<sub>4</sub>$  surface properties were the factors governing the transport mechanism (Li et al. [2019](#page-11-11)). Another study by Carstens and coworkers evaluated the effect of flow interruption on iron oxide of organic matter–coated goethite (OMCG) colloids in quartz sand media. The main reason for deposition during fow retardation was colloidal capture at sites with desirable DLVO/XDLVO interactions, which was encouraged by quick colloidal settling onto the solid matrix (Carstens et al. [2017](#page-10-10)). However, there is little knowledge about the fate and transport of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in real-world environmental conditions. Therefore, for determining their potential adverse efects on the environment and establishing efficient mitigation approaches, a thorough understanding of the transport of nanoparticles in both porous and aqueous media is essential. As previously mentioned, the transport behavior of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs under aqueous and porous media with diverse chemical conditions has been studied. A  $Fe<sub>3</sub>O<sub>4</sub>$ concentration of 50 mg  $L^{-1}$  was considered to evaluate maximum environmental impact and transport behavior. Various solution chemistry (including pH, IS, and NOM) crucial to NP suspensions' stability, aggregation, and deposition was considered.

This study is the frst to investigate the transport profle of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in the aqueous and porous media, considering various environmentally relevant solution chemistry factors. The aggregation, transport, and deposition characteristics of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in these environments were critically analyzed. It was hypothesized that several physicochemical factors will considerably infuence the sedimentation and deposition patterns of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs, hence influencing its transport in aqueous and terrestrial environments. The  $Fe<sub>3</sub>O<sub>4</sub>$  NPs were characterized by FT-IR, XRD, TEM, and EDAX techniques. In addition, the observed transport profles were mathematically validated using the DLVO interaction energy modeling. Overall, this work aims to elucidate the transport of  $Fe<sub>3</sub>O<sub>4</sub>$ NPs in porous and aqueous media, which can provide valuable insights into the behavior of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in these environments, aiding in the development of appropriate risk assessment and management strategies.

# **Materials and methods**

### **Materials and sample preparation**

 $Fe<sub>3</sub>O<sub>4</sub>$  NPs that were used in various biotechnological fields (Shukla et al. [2010](#page-11-12)) were provided by CFEES-DRDO, Timarpur, Delhi, India. Humic acid standards (CAS Number 14808–60–7) as a representative of NOM and white quartz sand (particle size 50–70 mesh) (CAS Number 14808–60–7) used in the column transport experiment were obtained from Sigma-Aldrich. Analytical research (AR) grade NaCl supplied by SRL India Pvt. Ltd was used to prepare the background solution in the study. Glass chromatography columns  $20 \times 1.5$  cm (Econo-Column, Catalog No. 7371522) were purchased from Bio-Rad. All tests (except the transport studies in natural waters) were performed with ultrapure Milli-Q water (18.2 MΩ cm at 25 °C) (Pall Corporation, Ann Arbor, MI, USA).

A suspension of Fe<sub>3</sub>O<sub>4</sub> NPs (50 mg L<sup>-1</sup>) was prepared freshly, and the suspension was ultrasonically dispersed for 30 min at 40 kHz to form a homogenous suspension (Ding et al. [2019](#page-10-11)). In the Milli-Q water, humic acid (HA) stock solution (100 mg  $L^{-1}$ ) was prepared and kept on a rotary shaker for about 24 h. Solids were separated from the solution using a 0.45-µm membrane filter. A TOC analyzer (TOC-L, Shimadzu) was used to determine the total organic carbon concentration of the processed stock solution. The concentration (100 mg  $L^{-1}$ ) was unchanged after filtering.

#### **Nanoparticle characterization**

The surface functional groups of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs were identified by FT-IR (IR Affinity-1, Shimadzu, Japan). To verify the crystallinity and phases of the  $Fe<sub>3</sub>O<sub>4</sub>$  NPs, XRD (Advanced D8, Bruker, Germany) was performed. Fe<sub>3</sub>O<sub>4</sub> NP samples dried under vacuum conditions were observed through FE-SEM (Thermo Fisher FEI Quanta 250 FEG) to characterize their size and surface morphologies. The absorption spectra of background solutions under each test condition were recorded using a UV–VIS spectrophotometer (UV-2600, Shimadzu). A 90 Plus Particle Analyzer (Brookhaven Instruments Corporation, USA) was also used to determine the hydrodynamic diameter and surface charge (ζ potential) of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in each experimental condition.

# **Measurement of pH<sub>PZC</sub>**

The point of zero charge ( $pH<sub>PZC</sub>$ ) was investigated using the pH titration method (Herrera-Barros et al. [2020](#page-10-12)). A 0.01 M NaCl solution was prepared, and its pH was set to a range of 2, 4, 6, 8, and 10 (initial pH) by using NaOH/  $HNO<sub>3</sub>$ . One hundred milliliters of an aqueous solution was added with 50 mg  $L^{-1}$  of Fe<sub>3</sub>O<sub>4</sub> NPs (the resulting concentration is 0.216 mM), and the mixture was subsequently shaken in a rotary shaker for 48 h. The supernatant was decanted after 48 h, and again, the pH of the solution was measured and designated as the fnal pH. The fnal pH *versus* the initial pH was plotted, and these curves' points of convergence revealed pH<sub>PZC</sub>.

## **Transport experiments**

### Transport behavior of Fe<sub>3</sub>O<sub>4</sub> NPs in aqueous media

A wide range of environmental conditions, including pH (5, 7, 9), IS (10, 50, 100 mM), and HA (10, 50, 100 mg L<sup>-1</sup>), were employed to simulate and investigate the interactions and efects of various physiochemical factors. The aqueous transport of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs was emphasized based on sedimentation (Ma et al. [2018;](#page-11-13) Mondal et al. [2021](#page-11-14)). After ultrasonication, the colloidal suspension was kept on a steady platform to mimic the static conditions for about 5400 s. The samples from the surface layer were taken at an interval of 300 s (Lv et al. [2016](#page-11-15)). The collected suspension was measured using a UV–VIS spectrophotometer at 370 nm (Chaki et al. [2015](#page-10-13)). The sedimentation curve was analyzed by calculating the absorbance ratio  $(A/A_0)$  as a function of time  $(A_0=$ initial absorbance and  $A =$ absorbance of  $Fe<sub>3</sub>O<sub>4</sub>$  at the end of the sedimentation study) (Zheng et al. [2019\)](#page-12-1). Additionally, after each experiment, the aggregation rate was determined by monitoring the variation in size distribution, and the stability of  $Fe<sub>3</sub>O<sub>4</sub>$  suspensions was determined in terms of hydrodynamic size and ζ potential. The employment of varied parameters in combination with a comparison of particle stability in static conditions can signifcantly improve the overall comprehension of the transport profile of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in the aqueous environment.

#### Transport behavior of Fe<sub>3</sub>O<sub>4</sub> NPs in porous media

Further, the quartz sand (mesh size: 50–70) was selected for the porous media transport because of its uniform pore distribution, chemical stability, high porosity, and surface area (Tong et al. [2020](#page-11-16)). Moreover, it provides a standardized and consistent platform for understanding the transport behavior in porous media. Table S4 represents the specifcations of the porous media. The glass chromatography columns were employed with a fxed bed of 20 cm height and 1.5 cm inner diameter (Bio-Rad, Econo-Column, Catalog No. 7371522). Before establishing the column, the sand was thoroughly washed with 0.1 M HCl, rinsed with Milli-Q water, and dried. The column was packed with quartz sand, which was packed uniformly into a 5-cm-high bed with gentle taps to ensure fne packing and then saturated. A peristaltic pump (Miclins PP-30-EX) was employed throughout the study, with the fow rate set to 1 mL/min in a downward direction. Further, the sand column's tubing factor and pore volume (PV) were calculated. The NP suspensions were frst homogenized by probe sonication, followed by repeated introduction to the column through a silicon tube to obtain 4 PVs of the suspension. Furthermore, a background solution with a volume equal to 5 PV was used to rinse the column. Ultrapure water was added to the column till the effluents were completely free of NPs. The pH  $(5, 7, 7)$ and 9), IS (10, 50, and 100 mM), and HA (0.1, 1, and 10 mg  $L^{-1}$ ) were considered as the variables in this transport experiment. UV–VIS spectrophotometer analyzed all the PVs for the  $Fe<sub>3</sub>O<sub>4</sub>$  NPs collected from the column. The calibration curves quantifying  $Fe<sub>3</sub>O<sub>4</sub>$  transport were plotted using different concentrations obtained from the absorbance. The breakthrough curves (BTCs) were analyzed by calculating the concentration

ratio  $(C/C_0)$  as a function of PV (represents the volume of the porous medium), in which  $C_0$  and  $C$  are the concentrations of the nanoparticles in influent and effluent, respectively.

## Transport behavior of Fe<sub>3</sub>O<sub>4</sub> NPs in various natural water **systems**

To investigate the transport of NPs in natural water systems, four diferent types of water, such as lake, river, tap, and groundwater, were used to simulate actual environmental conditions. The detailed physicochemical characteristics of diferent environmental water samples are represented in Table S1. The  $Fe<sub>3</sub>O<sub>4</sub>$  NPs were added to each environmental water sample, serving as background solutions (50 mg  $L^{-1}$ ) for transport studies. The pH of the water samples remained unchanged, before adding the NPs. This was done to maintain the natural water conditions and avoid any potential pH variations that could introduce confounding factors. All the experiments were conducted in triplicate at a constant room temperature of  $25 \pm 1$  °C, and the data are reported as mean  $\pm$  standard deviation to demonstrate the repeatability of the transport results.

# **Theoretical consideration**

## **DLVO interaction energy modeling**

The classical DLVO theory was considered to establish the total interaction energy  $(V_{\text{Total}})$  encountered by two particles approaching each other (Lu et al. [2016\)](#page-11-17). It outlines the factors that afect the behavior and transport of NPs in the porous media. The stability and aggregation of the NPs are governed by the sum of two interactive forces, namely, the van der Waals force of attraction  $(V_{\text{VDW}})$  and electrical double-layer repulsion  $(V<sub>EDL</sub>)$ . The following expressions are used to calculate the  $V_{\text{VDW}}$  and  $V_{\text{EDL}}$  (Ghosh et al. [2022\)](#page-10-14).

$$
V_{\text{Total}} = V_{\text{VDW}} + V_{\text{EDL}} \tag{1}
$$

$$
V_{\text{VDW}} = -\frac{Aa_1a_2}{6h(a_1 + a_2)(1 + \frac{14h}{\lambda})}
$$
(2)

where *A* = Hamaker constant  $(3.3 \times 10^{-20} \text{ J})$ , *h* = distance between two NPs,  $a_1$  = radius of NP 1,  $a_2$  = radius of NP 2, and  $\lambda$  = characteristic wavelength associated with the interaction of NPs (100 nm).

$$
V_{\text{EDL}} = 64\pi\epsilon\epsilon_0 \frac{a_1 a_2}{a_1 + a_2} \zeta^2 \exp(-\kappa h) \tag{3}
$$

$$
\kappa^2 = \frac{4\pi e^2 \Sigma z_i^2 n_i}{\varepsilon \varepsilon_0 \kappa_B T} \tag{4}
$$

where  $\varepsilon_0$  = permittivity of vacuum (8.854 × 10<sup>-12</sup>),  $\varepsilon$  = permittivity of water (78.5),  $\zeta$  = zeta potential,  $\kappa$ = Debye–Huckel reciprocal length,  $e$ = electron charge,  $n_i$ =ionic strength,  $z_i$ =counterion valence,  $\kappa_B$ =Boltzmann constant, and *T*=absolute temperature.

The current study utilized the conventional DLVO theory to understand the surface interactions between  $Fe<sub>3</sub>O<sub>4</sub>$  NPs and sand in the environment. These interactions dictate the mobility of NPs within the soil matrix. While strong ES repulsion is expected to promote the dispersion of NPs, VDW forces favor the aggregation and trapping of NPs in soil. Using Eqs.  $(1)$  $(1)$ – $(4)$  $(4)$ , the interparticle interaction potentials between two  $Fe<sub>3</sub>O<sub>4</sub>$  NPs were computed, which provides information on the transport and behavior of NPs in each environmental condition.

# **Results and discussion**

# **Characterization of Fe<sub>3</sub>O<sub>4</sub>**

The physicochemical properties of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs were thoroughly analyzed. The XRD measurements of iron oxide magnetic nanoparticles correspond to the reference value for Fe<sub>3</sub>O<sub>4</sub> (JCPDS file number 65–3107). Fe<sub>3</sub>O<sub>4</sub> exhibits well-defned Bragg refection properties according to XRD examination of the particles (Fig. S1 A). The data displays diffraction angles of NPs at  $2q = 30.103^\circ$ ,  $35.451^\circ$ ,  $43.088^\circ$ , 53.516°, and 62.657°, indicating a characteristic crystal lattice structure and the presence of well-defned atomic planes within the NPs, emphasizing their composition and arrangement.

<span id="page-3-1"></span><span id="page-3-0"></span>Fig. S1B indicates that the peak at  $546 \text{ cm}^{-1}$  is due to Fe–O stretching vibration on  $Fe<sub>3</sub>O<sub>4</sub>$  NPs. The O causes the elevation at 3364 cm−1–H stretching mode vibrations induced by hydroxyl groups on NPs in water. The band at 2967 cm<sup>-1</sup> corresponds to asymmetric  $CH<sub>2</sub>$  stretching, indicating the presence of aliphatic chains on the surface, possibly from a surfactant used during the synthesis or stabilization process; 2320 cm−1 corresponding to C–O bending suggests the presence of metal–oxygen bonds, which can be attributed to the oxide layer on the surface of the particles; 1625 cm−1 corresponding to N–H stretching and bending suggests the presence of amino groups, which could be a result of functionalization with amino silane or other amine-containing molecules; and 1065 cm<sup>-1</sup> corresponding to C–H stretching vibrations indicates the presence of hydrocarbon groups, which could come from the surfactant or organic residues left over from the synthesis process. These peak values are almost identical to the asserted values of Nurbas et al. ([2017](#page-11-18)).

The  $Fe<sub>3</sub>O<sub>4</sub>$  NPs were concatenated into irregular forms with no discernible structure, as revealed by SEM images

(Fig. S1C). The aggregates formed by these NPs have a porous, sponge-like morphology. As previously noted, the magnetic behavior of NPs tends to stick together during sample preparation for SEM analysis (Babu and Prabu [2011](#page-10-15)). Therefore, the exact size of the  $Fe<sub>3</sub>O<sub>4</sub>$  NPs was challenging to obtain. The EDAX spectrum (Fig. S1D) confrms the presence of Fe and O in the sample. It is worth mentioning here that in the current study, the tests were conducted with various sizes of aggregates of the  $Fe<sub>3</sub>O<sub>4</sub>$  NPs. The properties of these aggregates may difer from truly nano-sized particles (1–100 nm).

The UV–VIS spectra of  $Fe<sub>3</sub>O<sub>4</sub>$  NP dispersion were measured with the absorbance maxima  $(\lambda_{\text{max}})$  recorded at 370 nm. This technique assessed the concentration of  $Fe<sub>3</sub>O<sub>4</sub>$  NP in each experimental condition, providing valuable insights into the size and stability of NPs in the solution. It is worth noting that a previous investigation also reported similar observations regarding the NP concentration (Chaki et al. [2015\)](#page-10-13).

The pH<sub>PZC</sub> of Fe<sub>3</sub>O<sub>4</sub> in Milli-Q water was confirmed to be 7.16, as shown in the graph (Fig. S3), which is very close to the value of 7.27 as determined by previous researchers (Pogorilyi et al. [2017](#page-11-19))*.*

## Transport of Fe<sub>3</sub>O<sub>4</sub> NPs in aqueous media

#### **Efect of initial pH**

The sedimentation pattern of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs as a function of the initial pH of the medium under static conditions is shown in Fig. [1.](#page-4-0) The particles gradually aggregated and settled at three pH values (5, 7, and 9). In particular, at pH 7, near the PZC of NPs ( $pH_{PZC}$ =7.16), the sedimentation rate of NPs was maximum, where the electrostatic repulsion between the NPs was signifcantly diminished (Khan et al. [2022;](#page-11-20) Thio et al. [2011](#page-11-21)). The relative sedimentation regimes at this particular pH are in concordance with the formation of large aggregates  $(>1000 \text{ nm})$  as compared with other pH values  $(5 \text{ and } 9)$ , which resulted in smaller aggregates  $( $600 \text{ nm}$ )$ (Table S2). These measurements demonstrate the polydispersity in aggregate sizes under diferent pH conditions, highlighting the variation in aggregate behavior. At this pH, the Fe<sub>3</sub>O<sub>4</sub> NPs had merely a low surface charge ( $-7.73$  mV), fostering their aggregation due to limited repulsive forces according to DLVO theory (Fig. [9](#page-8-0)A), which is in agreement with the previous experimental results (Baalousha [2009\)](#page-10-9). The surface interactive forces between two  $Fe<sub>3</sub>O<sub>4</sub>$ NPs were the greatest at pH 9 due to the deprotonation of surface functional groups; however, at pH 5, the surface charge of the NPs is less negative, which leads to weaker repulsive forces and a greater propensity for aggregation. It should be noted that the stability of the NP increased at pH 9 (−26.82 mV) (Table S2). The considerable aggregation at pH 7 can be attributed to the enhanced interaction



<span id="page-4-0"></span>**Fig. 1** Sedimentation profiles of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in aqueous media with different pH  $(5, 7, and 9)$  conditions without IS and HA concentrations. The concentration of Fe<sub>3</sub>O<sub>4</sub> NPs was 50 mg L<sup>-1</sup>. Error bars indicate the standard deviation of triplicates



<span id="page-4-1"></span>**Fig. 2** Sedimentation profiles of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in aqueous media with diferent IS (10, 50, 100 mM) conditions at pH 7 and absence of HA. The concentration of Fe<sub>3</sub>O<sub>4</sub> NPs was 50 mg L<sup>-1</sup>. Error bars indicate the standard deviation of triplicates

between the aggregates driven by diferential sedimentation patterns over time (Illés and Tombácz [2006](#page-11-22)). The aggregate sedimentation was observed by the NP size (Table S2). The considerable aggregation and dispersion at these pH values can afect the surface charge of the NPs through protonation and deprotonation of the surface functional groups. Accordingly, solution pH is crucial in defning the transport profle of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in aqueous mediums.

#### **Efect of ionic strength**

Figure [2](#page-4-1) represents the sedimentation regimes of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs with different (IS) concentrations at pH 7. The sedimentation of NPs increased signifcantly as the solution IS increased from 10 to 100 mM. The enhanced aggregation due to the higher ionic strength led to increased sedimentation since there was less repulsive force between the NPs. The value of  $A/A<sub>0</sub>$  abruptly decreased as the IS of the background solution progressed from 10 to 100 mM. This was supported by the concurrent increase in the aggregate size (Table S2), indicating the destabilized  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in the suspension (Sodnikar et al.  $2021$ ). It must be noted that at a low IS (10 mM), the effective diameter of the aggregates was 1123 nm (under static conditions), which then increased to 1957 at high IS (100 nm) conditions. As the concentration of ions in the solution is raised, the EDL compression and the electrostatic repulsion among the NPs diminish, resulting in lower colloidal particle stability during transport (Ben-Moshe et al. [2010;](#page-10-16) Wang et al. [2008](#page-11-24)). Another plausible explanation is that the  $Na<sup>+</sup>$  ions at lower IS penetrated the static electric double layer and resulted in a higher screening of surface charge, and the charge neutralization promoted aggregation of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs. This is evident from the surface charge potential of Fe<sub>3</sub>O<sub>4</sub> NPs, which is  $-12.16$ mV (Table S3). Therefore, the transport behavior of  $Fe<sub>3</sub>O<sub>4</sub>$ NPs gets hindered as IS increases.

#### **Efect of humic acid**

The effects of HA on the transport behavior of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs were investigated at constant pH 7 (Fig. [3\)](#page-5-0). HA induced



steric stabilization due to the adsorption of negatively charged carboxylic and phenolic functional groups on the NP surface. As a result, the aquatic transport was enhanced, as marked by a higher  $A/A<sub>0</sub>$  ratio (Yang et al. [2009](#page-12-2)). The FT-IR spectrum analysis (Fig. S4) of the humic acid interacted Fe<sub>3</sub>O<sub>4</sub> shows peaks at 1580 cm<sup>-1</sup> and 1730 cm<sup>-1</sup>, which corresponds to the  $C=O$  bond stretching and the presence of the COOH group, respectively (Fatema et al. [2015](#page-10-17)). All these functional groups confrm the adsorption of HA on the surface of  $Fe<sub>3</sub>O<sub>4</sub>$ . Different environmentally relevant concentrations of HA (0.1, 1.0, 10.0 mg  $L^{-1}$ ) were employed in this study, and a steady  $A/A<sub>0</sub>$  ratio was acquired as the concentration of HA increased from 0.1 mg L<sup>-1</sup> to 10 mg L<sup>-1</sup>, indicating stable  $Fe<sub>3</sub>O<sub>4</sub>$  suspension (Fig. [3\)](#page-5-0). Under these circumstances,  $Fe<sub>3</sub>O<sub>4</sub>$  NPs diffused in the background solution, and the aggregation was limited. The impact of transport enhancement of the  $Fe<sub>3</sub>O<sub>4</sub>$  NPs was more prominent at the maximum HA concentration (10 mg  $L^{-1}$ ). The influence of adsorption of relatively more HA onto the surface of  $Fe<sub>3</sub>O<sub>4</sub>$ increased the negative charge on the NPs, which enhanced the  $A/A<sub>0</sub>$  ratio. The improved zeta potential value ( $-33.25$ ) (Table S2) indicates the presence of steric repulsion due to the adsorbed HA and the formation of a macromolecular layer around the  $Fe<sub>3</sub>O<sub>4</sub>$  NPs (Tombácz et al. [2004](#page-11-25)). Similar impacts of HA on the sedimentation behavior of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs were observed in other studies (Amal et al. [1992;](#page-10-18) Baalousha [2009](#page-10-9); Verrall et al. [1999\)](#page-11-26). Thus, the adsorption of HA onto  $Fe<sub>3</sub>O<sub>4</sub>$  NPs can enhance their stability and promote their transport in aqueous environments through surface coating, density, or charge neutralization (Hou et al. [2017](#page-11-27); Zhang et al. [2015](#page-12-3)).



<span id="page-5-0"></span>**Fig. 3** Sedimentation profiles of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in aqueous media with different HA concentrations (0.1, 1, 10 mg  $L^{-1}$ ) at pH 7 and absence of IS. The concentration of Fe<sub>3</sub>O<sub>4</sub> NPs was 50 mg L<sup>-1</sup>. Error bars indicate the standard deviation of triplicates

<span id="page-5-1"></span>**Fig. 4** Sedimentation profiles of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in different natural waters (river, lake, tap, groundwater). The concentration of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs was 50 mg  $L^{-1}$ . Error bars indicate the standard deviation of triplicates

## Transport behavior of Fe<sub>3</sub>O<sub>4</sub> in various environmental water **systems**

The impact of diferent natural water solution chemistry was explored to gain a practical understanding of the transport behavior of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in the aqueous system. Under all tested conditions, the  $A/A_0$  ratio of Fe<sub>3</sub>O<sub>4</sub> NPs slightly declined in the river and lake water. In contrast, a signifcant drop in the  $A/A<sub>0</sub>$  ratio was observed in both tap and groundwater (Fig. [4](#page-5-1)). The reasonably high stability of  $Fe<sub>3</sub>O<sub>4</sub>$  NP suspension in river water and lake water was exhibited by the apparent zeta potential values of−23.45 and−17.87, respectively. The transport of NPs in river and lake water is quite complex because of the interplay between surface coating characteristics, presence and absence of NOM, and turbulent forces. Owing to the enhanced adsorption of various dissolved organic matter (DOM) from these natural waters onto the surface of  $Fe<sub>3</sub>O<sub>4</sub>$ NPs, the thickness of the interfacial layer surrounding the NPs was greater than the Debye length, resulting in the van der Waals force of attraction being less prevalent than electrostatic repulsion among NPs. As a result, the stability of  $Fe<sub>3</sub>O<sub>4</sub>$ NPs when suspended in these natural waters was confrmed, consistent with previous studies (Wang et al. [2008\)](#page-11-24). The tap and ground water demonstrated exceptionally high sedimentation regimes, indicating low colloidal stability of the  $Fe<sub>3</sub>O<sub>4</sub>$ dispersion. Tap water is characterized by a lower concentration of dissolved ions and organic carbon than other natural waters due to the typical ion composition in municipal water supplies, where the overall ion concentration is kept at lower levels. Fe<sub>3</sub>O<sub>4</sub> NPs, in the presence of tap water, exhibited enhanced sedimentation due to the formation of large aggregates when the pH of the tap water was nearly close to its PZC



(7.16). It implied that the absence of surface charge among  $Fe<sub>3</sub>O<sub>4</sub>$  NPs enhanced the aggregate formation consequently, and lower  $A/A<sub>0</sub>$  ratios were observed. Groundwater, among all the studied natural waters, exhibited the greatest sedimentation over time with the formation of large aggregates of > 1900 nm. High concentrations of divalent ions  $(Mg^{2+})$  and  $Ca^{2+}$ ) and lower concentrations of NOM in the groundwater enhanced the aggregation of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs (Conway et al. [2015](#page-10-19); Lanphere et al. [2014\)](#page-11-28).

#### **Transport of Fe3O4 NPs in porous media**

#### **Efect of initial pH**

The breakthrough curves of  $Fe<sub>3</sub>O<sub>4</sub>$  NP suspension were shown in Fig. [5](#page-6-0) at various initial pH levels  $(5, 7, \text{ and } 9)$ . The Fe<sub>3</sub>O<sub>4</sub> NPs readily fow out of the column at pH values such as pH 5 and 9, where repulsive force arises due to the higher charge content between NPs and sand. The BTC of  $Fe<sub>3</sub>O<sub>4</sub>$  suspension exhibited a rapid increase between pH 5 and 9 before plateauing; particularly, at pH 9, the proportional concentration in the column effluent almost reaches unity. This was due to the colloid deposition force inhibited by electrostatic repulsion on the sand surface. Conversely, lower repulsive forces at pH 7 (=PZC), where sand particles and colloids were mildly charged, enable colloidal  $Fe<sub>3</sub>O<sub>4</sub>$  to adhere to the surface of the sand. Due to this, the effluent concentration remained stable without any significant increase. In the BTCs for pH 5 and 9 suspensions, a slight rise was seen at PV 12 due to the leaching of  $Fe<sub>3</sub>O<sub>4</sub>$  from the porous media (maximum for pH 9). This suggested that  $Fe<sub>3</sub>O<sub>4</sub>$  NPs and sand could bind reversibly. The transport recovery rates of Fe<sub>3</sub>O<sub>4</sub> NPs at pH 5 and 9 were 94%



<span id="page-6-0"></span>**Fig. 5** The Breakthrough curve of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in porous media with diferent pH (5, 7, and 9) conditions without IS and HA concentrations. The concentration of Fe<sub>3</sub>O<sub>4</sub> NPs was 50 mg L<sup>-1</sup>. Error bars indicate the standard deviation of triplicates

<span id="page-6-1"></span>**Fig. 6** The breakthrough curve of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in porous media with diferent IS (10, 50, 100 mM) conditions at pH 7 and absence of HA. The concentration of Fe<sub>3</sub>O<sub>4</sub> NPs was 50 mg L<sup>-1</sup>. Error bars indicate the standard deviation of triplicates

and 96%, respectively, demonstrating a high transport rate and low deposition in sand. The MPs were forced apart because of the signifcant electrostatic double-layer (EDL) repulsion among the  $Fe<sub>3</sub>O<sub>4</sub>$ –sand particles and served as the crucial controlling factor. Due to these unfavorable circumstances,  $Fe<sub>3</sub>O<sub>4</sub>$ NPs were restricted from attaching to the sand surface, resulting in improved mobility at pH 5 and 9. In contrast, the transport recovery rate was 3% for pH 7 suspension, suggesting high deposition of Fe<sub>3</sub>O<sub>4</sub>. Additionally, the  $C/C<sub>0</sub>$  value dropped to almost zero when the infuent pH reached 7. This is due to the substantially larger Fe<sub>3</sub>O<sub>4</sub> aggregate size ( $>1000$  nm), which led to severe straining and the blocking effect of the column near the inlet (Phenrat et al. [2009](#page-11-29)). The overall interaction energy across  $Fe<sub>3</sub>O<sub>4</sub>$  and sand grains at pH 7 is attributed to the van der Waals attraction force according to the DLVO interac-tion profile depicted in Fig. [9.](#page-8-0) The deposited  $Fe<sub>3</sub>O<sub>4</sub>$  NPs were most likely at the primary energy minima, indicating a signifcant interaction between the NPs and quartz sand. In addition, the restricted release of deposited  $Fe<sub>3</sub>O<sub>4</sub>$  NPs exceeding 2 PVs supports the theory that the  $Fe<sub>3</sub>O<sub>4</sub>$  NPs are accumulated at primary energy minima under favorable environmental pH, preventing the particles from releasing during subsequent DI water fushing. Overall, the repulsive charges on the NPs and sand surface were accountable for the increased mobility of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs at these pH levels.

#### **Efect of ionic strength**

The porous media transport profile of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs dispersed in solutions of varying concentrations of monovalent ions  $(Na<sup>+</sup>)$  (10, 50, and 100 mM) at pH 7 is shown in Fig. [6.](#page-6-1) The  $C/C<sub>0</sub>$  ratio decreased as the ionic intensity of the influent increased. The maximum amount of  $Fe<sub>3</sub>O<sub>4</sub>$  was eluted at IS of 10 mM, followed by 50 and 100 mM at PV 5 with transport recoveries of 72%, 52%, and 25%, respectively, demonstrating high retent, ion, and low propensity of  $Fe<sub>3</sub>O<sub>4</sub>$ NPs. When the IS rises, the electrostatic double layers around the sand and  $Fe<sub>3</sub>O<sub>4</sub>$  NPs become more compressed, reducing the repulsive forces between them (Franchi [2000,](#page-10-20) Nowack and Stone [1999](#page-11-30)). The apparent zeta potential results corroborate with these evaluations as it decreases from  $-12.16$  to  $-4.26$  mV. However, the effluent profiles in Fig. [6](#page-6-1) show that increasing IS decreased the mobility and increased retention of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs, as in the column effluent. For all tests, the BTCs at PV 12 slightly increased due to the remobilization of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in the quartz sand under these experimental conditions. The DLVO hypothesis makes idealized assertions and ignores the complexity of the  $Fe<sub>3</sub>O<sub>4</sub>$ NP-sand system. The surface charge and other properties of NPs could change due to increased IS and altering their interaction with the soil matrix. In addition, other factors could interact with the efect of IS, further confounding the transport dynamics of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs, such as unique surface



<span id="page-7-0"></span>**Fig. 7** The breakthrough curve of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in porous media with different HA concentrations (0.1, 1, 10 mg L<sup>-1</sup>) at pH 7 and absence of IS. The concentration of Fe<sub>3</sub>O<sub>4</sub> NPs was 50 mg L<sup>-1</sup>. Error bars indicate the standard deviation of triplicates

chemistry, surface roughness, and other forces like capillary and hydrodynamic interactions (Phenrat et al. [2010](#page-11-31); Xu et al. [2020](#page-12-4)). The DLVO theory might not adequately account for these changes, which would cause a discrepancy between the expected interaction profle and the actual transport behavior.

#### **Efect of humic acid concentrations**

The effect of natural organic matter on colloidal nanoparticles is a critical consideration in evaluating their fate and transport behavior (Hotze et al. [2010\)](#page-11-32). Figure [7](#page-7-0) shows the BTCs of  $Fe<sub>3</sub>O<sub>4</sub>$  dispersed at pH 7 with various concentrations of HA (0.1, 1, and 10 mg  $L^{-1}$ ). Under all test conditions, a high  $C/C_0$  ratio ( $\sim$ >0.9) and comparatively high breakthrough time (up to 6 PVs) were observed for  $10 \text{ mg } L^{-1}$  HA concentration, demonstrating low retention and significant mobility of  $Fe<sub>3</sub>O<sub>4</sub>$  in the column. A high rate of elution of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs was observed in 10 mg  $L^{-1}$ , proceeded by 1 and 0.1 mg  $L^{-1}$  at PV1, and the respective transport recovery rates from the column effluent were 96%, 86%, and 84%. The ions of  $Fe<sub>3</sub>O<sub>4</sub>$  from porous media may have caused a slight peak at PV 12 for all HA concentrations. A comparative reduction in the hydrodynamic size of  $Fe<sub>3</sub>O<sub>4</sub>$  was noted as the HA concentration increased (Table S2). This agrees with the previous results (Wang et al. [2020](#page-11-33)). In addition to preventing aggregation, HA adsorption onto the surface of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs aids in the dispersion of the colloidal particles in the solution. However, HA had a negligible effect on the zeta potential (Table S2) and DLVO energy profiles



<span id="page-8-1"></span>**Fig. 8** The breakthrough curve of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in different natural waters (river, lake, tap, groundwater) through porous media. The concentration of Fe<sub>3</sub>O<sub>4</sub> NPs was 50 mg L<sup>-1</sup>. Error bars indicate the standard deviation of triplicates

(Fig. [9](#page-8-0)C), indicating the influence of other dominating colloidal interactions. The likely mechanism is that the thermodynamic interaction between sand particles and organic matter– $Fe<sub>3</sub>O<sub>4</sub>$  NP complexation could overcome the interaction energy barrier and inhibit their retention in the porous media, thus inducing electrostatic stability in the dispersion. Gu et al. proposed that the prominent interplay between iron oxide and NOM is the ligand exchange and electrostatic interactions among the surface hydroxyl groups of  $Fe<sub>3</sub>O<sub>4</sub>$  and the carboxyl or hydroxyl groups in natural organic matter of most systems (Gu et al. [1994](#page-10-21)). The interaction between  $Fe<sub>3</sub>O<sub>4</sub>$  NPs and NOM in the porous media could potentially affect the colloidal transport of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs.

# Transport behavior of Fe<sub>3</sub>O<sub>4</sub> NPs in various natural water **systems**

Figure [8](#page-8-1) indicates the porous media transport of  $Fe<sub>3</sub>O<sub>4</sub> NPs$ in diferent environmental water systems. For various environmental water samples, the breakthrough was achieved at PV 1 for river and lake waters and PV 2 for groundwater. No breakthrough point was defned in tap water, indicating high retention. A strong  $C/C_0$  ratio of 0.97 was observed in river water, indicating an increased mobility of NPs. This suggests that the high concentration of dissolved ions in river water reduces NP retention. Conversely, a lower  $C/C_0$  ratio of 0.48 was observed in the presence of lake water, indicating reduced mobility of NPs. This can be attributed to the lower concentration of dissolved ions in lake water, which promotes NP retention.  $Fe<sub>3</sub>O<sub>4</sub>$  in the presence of ground and tap water exhibited a  $C/C_0$  ratio of 0.12 and 0.08, respectively, which signifes a very high deposition of nanoparticles in the column. The transport recovery rate of  $Fe<sub>3</sub>O<sub>4</sub>$ NPs from the column outlet was 98%, 52%, 15%, and 7% for river, lake, ground, and tap water, respectively. River water has the highest mobility, followed by lake and groundwater. Tap water shows the least transport behavior in porous media with high retention in sand columns among the tested water samples, which follows the same trend as the transport in aqueous media.

The considerable abundance of organic matter in river and lake water was confrmed by total organic carbon measurements (Table S1) adsorbed to the surface of  $Fe<sub>3</sub>O<sub>4</sub>$ , which repels negatively charged sand particles and hinders particle retention (Phenrat et al. [2008\)](#page-11-34). Thus, the presence of NOM augmented the transport and stability of  $Fe<sub>3</sub>O<sub>4</sub>$  colloids through electrostatic and steric interactions. As per the literature studies, the quantity and dispersion of surface hydroxyl groups on iron oxide particle suspension make them sensitive to the adsorption of organic matter and ions (Gu et al.



<span id="page-8-0"></span>**Fig. 9** The DLVO energy profiles of Fe<sub>3</sub>O<sub>4</sub> NPs under various conditions A with different pH values (5, 7, and 9), B with different IS (10, 50, and 100 mM), C with diferent HA concentrations (0.1, 1, and 10 mg L−1), and D in diferent environmental waters (river, lake, tap, and groundwater)

[1994](#page-10-21); Sun et al. [2023](#page-11-35)). Thus, dispersing the  $Fe<sub>3</sub>O<sub>4</sub>$  in river and lake water plausibly exposed these surface hydroxyl groups to the humic acid, and monovalent ions in the water systems minimized the EDL compression and enhanced the electrostatic repulsion among  $Fe<sub>3</sub>O<sub>4</sub>$  NPs according to the DLVO interactive energy profles (Fig. [9D](#page-8-0)). The interactive force between the  $Fe<sub>3</sub>O<sub>4</sub>$  NPs and NOM overcomes the energy barrier between the NP and sand, thus enhancing their transport. The high particle retention in tap water and groundwater is due to the potential aggregation and straining effects of Fe<sub>3</sub>O<sub>4</sub>. The pH of the tap water (7.7  $\sim$  = PZC) can infuence the changes in the electrostatic interactions, affecting the retention behavior of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in porous media. Due to the high ionic strength of the groundwater (Table S1), they could be adsorbed onto porous media and inhibit the transportability of  $Fe<sub>3</sub>O<sub>4</sub>$ . Understanding the possible behavior and transport of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in these natural environmental conditions aids in estimating the risk levels of exposure scenarios.

## **DLVO interaction energy interpretation**

The DLVO interaction energies of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs were calculated to determine the mechanism underlying NP's subsequent sedimentation and deposition in the porous media. Figure [9A](#page-8-0) shows the efect of diferent pHs on the total interaction energy of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs. According to the DLVO theory,  $Fe<sub>3</sub>O<sub>4</sub>$  NPs have a negative interaction energy pattern at pH 7, and as the separation gap between the two  $Fe<sub>3</sub>O<sub>4</sub>$  NPs increased, it approached zero. The existence of signifcant van der Waals force among  $Fe<sub>3</sub>O<sub>4</sub>$  NPs, as suggested by the absence of an energy barrier ( $\Phi$ max) and larger primary minimum value ( $\Phi$ <sub>min</sub>) (−1.437E-15), led to the considerable sedimentation and deposition in the aqueous matrix. A positive interaction energy profle was found at pH 5 and 9, and the  $\Phi_{\text{min}}$  decreased dramatically, suggesting that van der Waals's attractive force was diminishing. As the overall NP interaction energy was repulsive, the  $Fe<sub>3</sub>O<sub>4</sub>$  NPs exhibited enhanced stability at pH 5 and 9. As a result,  $Fe<sub>3</sub>O<sub>4</sub>$ NPs disseminated in suspensions of pH 5 and 9 had greater sedimentation and deposition ratios as compared to those dispersed in solutions of pH 7.

 $Fe<sub>3</sub>O<sub>4</sub>$  NPs dispersed in the aqueous matrix at 10, 50, and 100 mM ionic concentrations exhibited a negative interaction energy profle. Figure [9B](#page-8-0) shows the impact of various IS on the total interaction energy of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs. The  $\Phi_{\text{min}}$ increased gradually with the rise in the ion concentration in solution from 10 to 100 mM. The higher  $\Phi_{\min}$  values support the observed colloidal instability under all test conditions. According to the fndings, adding higher salt concentration enhanced the van der Waals forces among  $Fe<sub>3</sub>O<sub>4</sub>$  NPs owing to EDL compression. Consequently, an increased aggregation, sedimentation, and deposition rate was observed in the

aqueous matrix. Therefore, the  $A/A<sub>0</sub>$  ratios increased remarkably with a rise in the IS from 10 to 100 mM.

Figure [9C](#page-8-0) depicted a positive interaction energy pattern when  $Fe<sub>3</sub>O<sub>4</sub>$  NPs dispersed in a background solution containing humic acid at varying concentrations (0.1, 1, and 10 mg  $L^{-1}$ ). The  $\Phi_{\text{min}}$  tended to decrease, and an increment in maximum energy barriers  $(\Phi_{\text{max}})$  was observed with rising concentrations of HA. According to the DLVO interaction energy profle, the presence of HA at various concentrations augmented the electrostatic and steric repulsion among NPs due to its surface adsorption. As a result, a higher energy barrier prevented  $Fe<sub>3</sub>O<sub>4</sub>$  aggregation and retention in the aqueous environment, thereby increasing the stability and transportability of  $Fe<sub>3</sub>O<sub>4</sub>$ NPs, which correlates to the high absorbance values.

 $Fe<sub>3</sub>O<sub>4</sub>$  NPs were suspended in various natural waters (river, lake, tap, and groundwater) (Fig. [9D](#page-8-0)). A positive interaction energy profle was obtained between the NPs when suspended in the river and lake water systems. In contrast, the overall interaction energy of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs suspended in ground and tap water was negative. When suspended in lake and river water, the decreased  $\Phi_{\text{min}}$  of Fe<sub>3</sub>O<sub>4</sub> NPs indicated the presence of strong stearic repulsion among NPs due to the adsorption of NOM on the nanoparticle surface. The increased steric repulsion due to increased  $\Phi_{\text{max}}$  between NPs contributed to its stability in the presence of lake and river water. In tap and groundwater, the increased  $\Phi_{\min}$  of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs suggested that the van der Waals attraction force was dominant among NPs due to EDL compression. As a result, aggregation, sedimentation, and deposition of  $Fe<sub>3</sub>O<sub>4</sub>$ NPs were observed in lake and river water under a porous matrix, which corresponded to lower absorbance ratios.

## **Conclusion**

The fndings of this study demonstrated that the transport profiles of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs in aquatic and porous media are controlled by various solution chemistry factors. The results showed that  $Fe<sub>3</sub>O<sub>4</sub>$  NPs behave distinctly under different pH, IS, and HA conditions. The interactive forces on the surface of  $Fe<sub>3</sub>O<sub>4</sub>$ NPs, electron double-layer repulsion, and electrostatic and steric interactions were the major phenomena responsible for the transport of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs. An abrupt change in the surface chemistry may cause aggregation or trigger the release of previously adsorbed NPs into the water. Aggregation and sedimentation can cause the NPs to settle in the bottom sediments, reducing their mobility and potential exposure to biota. Furthermore, if  $Fe<sub>3</sub>O<sub>4</sub>$  NPs dissolve, Fe ions can be released, sometimes leading to potential ecological risks. It is important to note that the surface modifcation of NPs can signifcantly alter their interactions with the environment and biota, which can further impact their toxicity and uptake. Analyzing the complete transport phenomena of  $Fe<sub>3</sub>O<sub>4</sub>$  NPs is essential to predict their environmental risks. These trends, however, may be disguised by the existence of several other physicochemical processes occurring in the environment. Thus, additional research is necessary to delineate conceptual models and to systematically evaluate all potential interaction concepts for predicting the fate and transport of NPs.

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**Author contribution** Reetha Thomas: methodology and writing review and editing

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**Data availability** All data employed in support of the study's outcomes are included in the article.

## **Declarations**

**Ethical approval** Not applicable.

**Informed consent** It is declared that the study involved no human participants.

**Consent to participate** Not applicable.

**Consent for publication** All authors have given consent to the publication of the manuscript.

**Competing interests** The authors declare no competing interests.

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