

# Magnetic flocculation of anion dyes by a novel composite coagulant

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## ABSTRACT

A novel nano-magnetic particles-polyferric sulfate composite coagulant (Fe<sub>3</sub>O<sub>4</sub>-PFS) was firstly produced. In this study, the pre-polymerized ion-based PFS and  $Fe_3O_4$  were combined ( $Fe_3O_4$ -PFS) to remove a typical anion dye, Congo Red. Fe<sub>3</sub>O<sub>4</sub>-PFS with different molar ratio of PFS (30–100 mg/L) to Fe<sub>3</sub>O<sub>4</sub> (0–600 mg/L) showed good performance at the studied pH range, especially at pH 7. The removal value increased from 29.5% to 64.8% when 500 mg/L of Fe<sub>3</sub>O<sub>4</sub> was added into 30 mg/L of PFS. The structure and morphology property of the aggregated flocs induced by the composite coagulant were analyzed through instrumental analyses such as Fourier-transform infrared spectroscopy, X-ray diffractometer, scanning electron microscope, a physical property measurement system equipped with vibrating-sample magnetometer, and optical microscope. To study the influence of  $Fe_3O_{4'}$ fractal dimension  $(D_i)$  of flocs was investigated by employing image analysis. Finally, the effects and interactions of various factors on the treatment efficiency were studied by response surface methodology coupled with Box-Behnken design. The results showed that the Fe<sub>3</sub>O<sub>4</sub>-PFS-CR flocs induced by some local charge interactions and cheating were successfully formed. The flocs of Fe<sub>3</sub>O<sub>4</sub>-PFS-CR were lager, compacter, and denser. The surface of it exhibits rougher and more porous. This coagulant significantly decreased the dosage of inorganic coagulant, the flocculation time, and exhibited slighter pH dependence compared with PFS. The respective tests confirmed that the predominant coagulation mechanism of Fe<sub>3</sub>O<sub>2</sub>-PFS is the adsorbing-bridging. The method can greatly improve the color removal value. The novel method was highly efficient and environmentally feasible, which it seemed to hold considerable potential in the purification processes of real wastewater.

Keywords: Congo Red; Fe<sub>3</sub>O<sub>4</sub>; Polyferric sulfate; Magnetic flocculation; Water treatment

# 1. Introduction

With the development of the economy, the environmental problems have drawn our attention. Various water treatment processes have been utilized, such as adsorption [1], coagulation–flocculation [2], ion exchange [3], advanced oxidation [4], membrane filtration [5], and biological methods [6]. Among those methods, coagulation–flocculation is one of the widely used processes, which has a long history.

Inorganic metal salts have been widely used for decades as coagulants. It is useful to remove very fine suspended solids, inorganic, and organic dissolved particles [7]. Besides, it is easy to use and affordable. However, its low flocculation efficiency and some severe environmental circumstances limit its application. As reported in many studies, these inorganic metal salts are highly sensitive to pH, temperature, and low-concentration impurities. The pre-hydrolyzed metal

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coagulants in some extent improve the performance, but the problem of large volumes of metal hydroxide (toxic) and residual metal concentration (e.g., aluminum) still exists, which has a possible link with pathogenesis of Alzheimer's disease [8].

In recent years, organic synthetic materials have been enjoying a boom. Various organic flocculants have been synthesized. They have different molecular weight, structure (linear or branched), amount of charge, charge type, and composition. These organic flocculants can achieve better flocculation efficiency, form bigger and stronger flocs, which have good settling characteristics and do not affect the pH of the medium. However, its market cost is higher than the inorganic flocculants, and it is lack of biodegradability. In addition, its application may cause health hazards, which generally arise from residual unreacted monomers. All of these characteristics restrain its application.

With the increase demand of environmentally friendly materials to treat wastewater, natural bioflocculants, such as chitosan [9], tannin [10], gums and mucilage [11], sodium alginate [12], and cellulose [13] have attracted wide interests of researchers. They are biodegradable and produce no secondary pollution, but their short shelf life, high cost, and less effectiveness are big challenges.

The continuous increasing needs for more efficient and environmentally friendly flocculants have induced the development of magnetic coagulation. Compared with the traditional coagulants-flocculants methods, magnetic coagulation-flocculation has many unique characteristics. Most of the Fe<sub>3</sub>O<sub>4</sub> particles used for magnetic coagulation are prepared by chemical reactions such as co-precipitation, thermal decomposition, metal reduction, and the like. These Fe<sub>3</sub>O<sub>4</sub> particles are nearly spherical, have a uniform particle size distribution, and can reach nanometer. In the field of wastewater treatment, there are many studies on the removal of heavy metals and algae using  $Fe_3O_4$  particles [14–19]. In these studies, it was found that  $Fe_3O_4$  particles have a large removal capacity, fast kinetics, and high reactivity for contaminant removal for its extremely small particle size and high surface-area-to-volume ratio. In the meanwhile, Fe<sub>2</sub>O<sub>4</sub> particles have one more important property, that is, magnetism, which allows it to use artificial magnetic field to quickly remove contaminants. It not only can improve the removal value but also can be reused by desorbing contaminants, which has greatly expanded its range of applications. Therefore, Fe<sub>2</sub>O<sub>4</sub> can be used for protein immobilization, drug controlled release, wastewater treatment, and metal processing. Magnetic coagulation combines flocs with Fe<sub>2</sub>O<sub>4</sub>. Then by means of magnetic separation, it can realize rapid removal of impurities. The  $Fe_3O_4$  in the sludge can be recycled, and it can achieve a substantial reduction in sludge treatment capacity. Chin et al. [20] synthesized magnetic nanoparticles to remove silica nanoparticles from chemical mechanical polishing (CMP) wastewaters. It was found that silica and magnetite nanoparticles were oppositely charged between pH 2.2 and 6.7. Silica nanoparticles from CMP wastewater were removed by electrostatic attractions under magnetic field, and the sufficient collisions played an important role in the process. The research on harvesting Chlorella vulgaris by magnetic flocculation shows that the  $\zeta$ -potential of composite PACl (polyaluminum chloride)/Fe<sub>2</sub>O<sub>4</sub> was increased and thus a better result was achieved under a magnetic field [21].

Nevertheless, magnetic coagulation mechanism is still in its infancy. In some places, magnetic field can achieve good results, but in some other places, it has completely failed. Currently, magnetic flocculation has been applied in the removing of algae [22,23], heavy metals [24,25], and wastewater sludge dewatering [26]. Certain progress has been made in the field of removing phosphate by magnetic flocculation [27]. However, there is almost no report on the removal of soluble dyes by magnetic coagulation.

In this study, polyferric sulfate (PFS) and Fe<sub>3</sub>O<sub>4</sub> were combined and used as coagulant, and Congo Red was chosen as a typical anionic dye. The effects of dosage, dosing strategy, and the ratio of PFS to Fe<sub>3</sub>O<sub>4</sub> (mg/L) on the dye removal were investigated in the absence of external magnetic field. The structure and morphology of flocs were characterized using Fourier-transform infrared spectroscopy (FTIR), scanning electron microscope (SEM), and the optical microscope. The  $D_f$  was studied by image analysis. Moreover, the coagulation mechanism was studied. This study can provide a reference for the further theoretical study of magnetic coagulation.

# 2. Materials and methods

#### 2.1. Materials

Congo Red was obtained from Tianjin Damao Chemical Reagent Factory (Tianjin, China). NaOH and HCL were supplied by Shandong Chemical Plant (Jinan, Shandong province, China).

All reagents were of analytical grade and used as received without further purification, and tap water was used in the coagulation experiments.

## 2.2. Preparation of PFS–Fe<sub>3</sub>O<sub>4</sub> composite coagulant

 $Fe_{3}O_{4}$  (50 nm) and PFS were purchased from Cheng Du Micxy Chemical. Co., Ltd., Chengdu, Sichuan province, China.

The PFS–Fe<sub>3</sub>O<sub>4</sub> composite coagulants at different PFS to Fe<sub>3</sub>O<sub>4</sub> ratios were subsequently prepared by inserting a pre-determined amount of Fe<sub>3</sub>O<sub>4</sub> into water–based PFS stock solution (500 mg/L) under stirring for 2 min to form a uniform and stable solution.

#### 2.3. Magnetic flocculation

A total of 1 g/L stock solution of Congo Red (CR) was prepared by dissolving 1 g CR in 1 L tap water. The chemical structure of CR is shown in Fig. 1.

The experiments were carried out in a jar test apparatus (TA6, Wuhan Hengling Technology Co., Ltd., China). The test suspension was prepared by diluting the stock CR solution

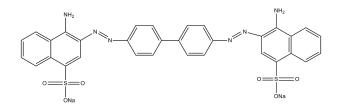


Fig. 1. Structure of CR.

with tap water to obtain the concentration of 100 mg/L. An appropriate amount of coagulant was dosed. Then, the flocculation period (3 min at 250 rpm paddle velocity and 15 min at 80 rpm paddle velocity) and the final sedimentation step (2 min) were applied afterwards. After that, 10 mL sample was collected from 2 cm below the water surface.

Coagulation experiments were conducted at different ratio of composite coagulant  $\text{Fe}_3\text{O}_4$ -PFS. The dosage of PFS and  $\text{Fe}_3\text{O}_4$  were varied from 0 to 600 mg/L and 30 to 100 mg/L, respectively. To investigate the effect of pH on the removal of CR, the pH of test water was adjusted in the range of 4–10 by adding HCl (1 M, 0.1 M) and NaOH (1 M, 0.1 M) solutions. The dosage of PFS and  $\text{Fe}_3\text{O}_4$  was fixed at 50 and 200 mg/L, respectively. The measurement of pH was carried out using a pH700 pH meter (Eutech, USA).

There are three dosing strategies to test the mechanism of the coagulation process. That is, PFS+Fe<sub>3</sub>O<sub>4</sub> (PFS was dosed first followed by Fe<sub>3</sub>O<sub>4</sub>), Fe<sub>3</sub>O<sub>4</sub>+PFS (Fe<sub>3</sub>O<sub>4</sub> was dosed first followed by PFS), and PFS–Fe<sub>3</sub>O<sub>4</sub>. The final concentrations of PFS in all the three strategies were kept the same, that is, 50 mg/L, while the dosage of Fe<sub>3</sub>O<sub>4</sub> was varied from 0 to 600 mg/L.

#### 2.4. Analytical methods

Zeta ( $\zeta$ )-potential measurements were performed on a Zetasizer Nano ZS90 (Malvern Instruments Ltd., Malvern, UK). The concentration of CR was analyzed by a UV–Vis spectrometer by monitoring the absorbance (500 nm) after filtration by of 0.46 µm membrane (mixed cellulose, Navigator). The zeta ( $\zeta$ ) potential of the supernatants was analyzed immediately after flocculation.

The zeta ( $\zeta$ ) potential of Fe<sub>3</sub>O<sub>4</sub> particles (0.6 g/L) was investigated using Zetasizer Nano ZS90 (Malvern Instruments Ltd., Malvern, UK). FTIR spectra of the CR, PFS, Fe<sub>2</sub>O<sub>4</sub>, floc1 (only PFS), and floc2 (PFS and Fe<sub>3</sub>O<sub>4</sub>) were recorded by an FTIR spectrometer (Nicolet iS5, Nicolet, USA) using KBr pellets. The images of the flocs were investigated by a microscope. The size distribution was measured using a particle size analyzer (Mastersizer 2000, Malvern, UK). X-ray diffraction (XRD) patterns were obtained with XRD (DMAX/2C) using graphite monochromatized Cu K $\alpha$  radiation ( $\lambda$  = 1.54056 Å). Magnetic properties were performed with a physical property measurement system (PPMS) equipped with vibrating-sample magnetometer (PPMS DynaCool 9, Quantum Design, USA). The surface morphologies of the two different flocs were observed by an SEM-type TESCAN MIRA3 under an acceleration voltage of 10.0 kV.

Leaching of Fe from  $\text{Fe}_3\text{O}_4$  was measured by inductively coupled plasma-optical emission spectroscopy. 0.1 g of dried  $\text{Fe}_3\text{O}_4$  is added into 250 mL water at different pH levels in each conical flask.

#### 2.5. Fractal dimension

The method put forward by Chakraborti et al. [28] was applied to calculate the two-dimensional fractal dimension of irregular image. The flocs were shaped on slide glass and recorded by microscope. The image was analyzed by image-pro plus. Fractals,  $D_{f}$  was calculated according to the following equation:

$$\mathbf{A} \propto p^{D_f} \tag{1}$$

where A and p are the projected area and the perimeter of flocs, respectively.

# 2.6. Response surface methodology coupled with Box–Behnken design (RSM–BBD)

The RSM–BBD was employed for the optimization of the parameters including initial pH value  $(X_1)$ , coagulant dosage  $(X_2)$ , the initial concentration  $(X_3)$ , and ionic strength of KCl  $(X_4)$  on the response functions, which are listed in Table S1. The experimental data were analyzed and fitted to a second-order polynomial model using Design Expert 10 to optimize the variables in the coagulation–flocculation process.

$$Y = \beta_0 + \sum_{i=1}^{K} \beta_1 X_i + \sum_{i=1}^{j-1} \sum_{i=1}^{k} \beta_{ij} X_i X_j + \sum_{i=1}^{k} \beta_{ij} X_i^2$$
(2)

where *Y* is the response for the residual turbidity of surfactant effluent,  $\beta_0$  is the constant coefficient,  $\beta_i$  is the linear coefficient,  $\beta_{ij}$  is the interaction coefficient, and  $X_i$  and  $X_j$  refer to variables. These analyses are carried out by virtue of  $R^2$  values, Fisher's *F*-test, and *P*-value (probability).

#### 3. Results and discussion

#### 3.1. Properties of $Fe_3O_4$

Fig. 2 presents the adsorption ability of  $Fe_3O_4$ . Prior to any sort of conclusion made by the application of this method, it is more than necessary whether  $Fe_3O_4$  will adsorb CR rather than flocculate. We can see that the CR remained at 100 mg/L after various doses of  $Fe_3O_4$  were added. It can be revealed from Fig. 2 that  $Fe_3O_4$  particles have almost no effect on the removal of the dye. Therefore, in this experiment, the  $Fe_3O_4$ could not remove CR by adsorption. However, in the previous study, it was found that  $Fe_3O_4$  can adsorb the dye on to its surface. It may be due to the different preparation methods that lead to different properties or the too short adsorption time.

As shown in Fig. 3, the zeta potential of the  $\text{Fe}_3\text{O}_4$  was always negative, similar to the study by Toh et al. [15]. When  $\text{Fe}_3\text{O}_4$  particles were dissolved in water, the bare Fe and O on the particle surface would quickly combine with water,

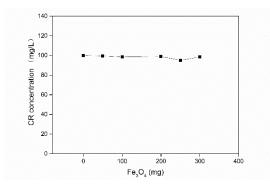


Fig. 2. Effect of Fe<sub>3</sub>O<sub>4</sub> doses on CR adsorption.

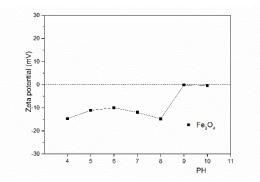


Fig. 3. Zeta potential of  $Fe_3O_4$  as a function of pH.

and adsorb OH<sup>-</sup>or H<sup>+</sup> ions to form Fe–OH, which brought a negative charge [15]. However, there are also studies that have shown that Fe<sub>3</sub>O<sub>4</sub> particles are amphoteric. When it was dissolved in water, it would quickly combine with water and form Fe–OH, and the Fe–OH on the surface could produce positively charged Fe–OH<sup>2+</sup> and negatively charged Fe–O<sup>-</sup> by the protonation and deprotonation reactions. In this situation, it was positively charged below the isoelectric point and negatively charged above the isoelectric point [29]. It may be due to the different properties of the Fe<sub>3</sub>O<sub>4</sub> particles synthesized by different methods.

## 3.2. Flocculation experiments

The flocculation experiments of CR were carried out under pH of 7.80, which was the average pH value of tap water. The removal values with different dosage were shown in Fig. 4.

It can be seen from Fig. 4 that PFS-Fe<sub>3</sub>O<sub>4</sub> had improved the removal value within the dosage range investigated. The CR removal curves associated with different dosages of Fe<sub>2</sub>O<sub>4</sub> exhibited similar changing trends with the increase of  $Fe_3O_4$ : slow increase at low dosage, then followed by a rapid increase with high dosage. However, it decreased when the concentration was greater than a certain value. At PFS dosage of 30 mg/L, the removal rate increased from 29.5% to 64.8% with the addition of 500 mg/L Fe<sub>2</sub>O<sub>4</sub>. While the removal value of 80 mg/L PFS can only reach 62.20%, the effect of Fe<sub>2</sub>O<sub>4</sub> for the coagulation was quite significant. However, when the concentration of Fe<sub>3</sub>O<sub>4</sub> reached 600 mg/L, the removal rate tended to decrease. The zeta potential as a function of Fe<sub>3</sub>O<sub>4</sub> dosage is shown in Fig. 5. With the increase of the concentration of Fe<sub>2</sub>O<sub>4</sub> particles, the zeta potential had a small increase. However, it can be seen that the zeta potential of the flocculated supernatant did not change much, so its enhancement of the neutralization ability was limited. It indicated that the mechanism of removing CR was different from that of algae and the humic acid-kaolin system [30].

In previous studies [31], the PFS itself contains a large amount of polynuclear complex ions, such as  $Fe_3(OH)_4^{5+}$ ,  $Fe_6(OH)_{12}^{6+}$ , and  $Fe_4O(OH)_4^{6+}$ , which were formed by OH bridges and large number of inorganic macromolecular compounds with positive charges [14]. The principle mechanism for the coagulation by PFS is adsorbing-bridging and may follow sweep coagulation [32], which was in accordance with the changes of the zeta potential associated with different

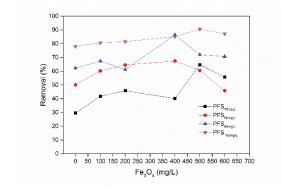


Fig. 4. Effect of Fe<sub>3</sub>O<sub>4</sub> on removal value of CR.

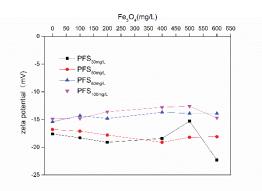


Fig. 5. Effect of  $\text{Fe}_3\text{O}_4$  on the zeta potentials of the supernatants after flocculation.

dosages of PFS. CR is an anionic dye, which could be involved in a dual mechanism including coagulation by charge neutralization and flocculation by bridging mechanism. The Fe<sub>3</sub>O<sub>4</sub> have relatively large specific surface areas, which easily lead the single-molecule aggregates to multi-molecule aggregates. When PFS and Fe<sub>3</sub>O<sub>4</sub> were combined to flocculate CR, one end or segment of the PFS would react with Fe<sub>3</sub>O<sub>4</sub> by ion exchange and formed the sun-like structure. According to the relevant research [14], the hydroxyl groups on the surface of Fe<sub>3</sub>O<sub>4</sub> can react with PFS by ion exchange, that is,  $-Fe_n - (OH)_m$ group from PFS displaces H<sup>+</sup> ions from hydroxyl to form the structure  $-Fe-O-Fe_n(OH)_m$ .

The concentration  $\int_{0}^{\infty}$  Fe<sub>3</sub>O<sub>4</sub>–PFS increased with the increase of Fe<sub>3</sub>O<sub>4</sub>. The sun-like structured Fe<sub>3</sub>O<sub>4</sub>–PFS reacted with CR immediately after dosed. Because only one end or segment of PFS chains attached to the CR in the flocs, and only a portion of the positive charge on PFS chains can neutralize the negative charge of the CR. Although the charge neutralization ability of PFS was weakened, the sun-like structure of the flocs produced by Fe<sub>3</sub>O<sub>4</sub>–PFS contributed the effect of adsorbing-bridging. Thus, the removal rate was improved.

However, it was also noted that with the increase of the concentration of  $\text{Fe}_3\text{O}_4$ , the removal rate of the  $\text{Fe}_3\text{O}_4$ –PFS decreased locally and then increased. This may be due to the inadequate stirring process of the  $\text{Fe}_3\text{O}_4$  and the PFS or a few other factors.

In the experiment of investigating the influence of the  $Fe_3O_4$  on the removal of the dye, the magnetic field was not

applied. However, in the experiment of removing algae, the heavy metal or the humic acid–kaolin system, the improved results only showed under magnetic field. This can only be caused by some other unknown factors related to the properties of CR.

## 3.3. The effect of pH on the flocculation performance

The coagulation-flocculation performance and the effect of pH on the removal of CR were comparatively investigated in this study. The removal value of PFS and Fe<sub>3</sub>O<sub>4</sub>-PFS in treating CR is shown in Fig. 6. The curves associated with the two coagulants exhibited similar changing trends: when the pH was less than 6, the removal value was close to 100%, forming relatively larger flocs, with the increase of pH, removal rate gradually decreased. CR contains a sulfonic acid group and an amino group. When it was dissolved in water, it was negatively charged. The electrostatic repulsion between negative charges on different molecules enhanced the solubility of dyes. As the pH gradually decreased, the protonation processes of the dye reduced its charge density and induced self-aggregation of the dye molecules. Therefore, less coagulant would be required to destabilize it under acidic conditions, and more coagulants were needed in alkaline and neutral environment [33]. However, when the pH reached 8, the adsorbing-bridging effect of PFS was enhanced, thus the removal value was improved. It was noted that PFS gave poor removal results than Fe<sub>3</sub>O<sub>4</sub>–PFS within the dosage range investigated, and flocs produced by Fe<sub>3</sub>O<sub>4</sub>-PFS precipitated more rapidly even in the absence of external magnetic field. Fe<sub>3</sub>O<sub>4</sub>–PFS performed always better than PFS at any pH, and especially at pH = 7 or 8, the removal rate is increased by about 13%. The efficiency of coagulation-flocculation not only depends on the solubility and chemical structures of dyes but also the characteristics of the coagulants-flocculants. So, it can be concluded that Fe<sub>3</sub>O<sub>4</sub>-PFS works extremely better in near-neutral environments.

The polymerization of ferric sulfate hydrolysis process can be seen from Fig. 7. In the acidic environment, mainly free ions and mononuclear hydroxyl complexes exist (Fe<sub>*a*</sub>), with the increase of pH, gradually into a transitional polymer state (Fe<sub>*b*</sub>), and finally into precipitated species (Fe<sub>*c*</sub>) [32]. As mentioned in Section 3.2, Fe–O–Fe<sub>*n*</sub>(OH)<sub>*m*</sub> was formed on the surface of Fe<sub>3</sub>O<sub>4</sub> particles. When pH = 7 or so,

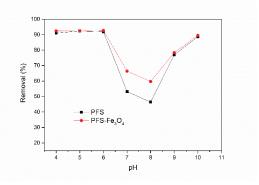


Fig. 6. Removal of CR by coagulation as a function of pH and coagulant dosage.

Fe<sub>*b*</sub> was the majority species [7]. At this time, the Fe<sub>*b*</sub> easily covered the surface of the Fe<sub>3</sub>O<sub>4</sub> particles and formed the sun-like structure with the Fe<sub>3</sub>O<sub>4</sub> particles as the skeleton. The structure of the composite coagulants enhanced the adsorbing-bridging effect. In addition, the addition of Fe<sub>3</sub>O<sub>4</sub> affected the balance of H<sup>+</sup> and OH<sup>-</sup>, driving the balance to the right and promoting the formation of Fe<sub>*b*</sub> to further enhance the flocculation effect [17].

In addition to these, the formation of a floc with  $\text{Fe}_3\text{O}_4$  increased the weight of the flocs and thus allowed the floc to precipitate more rapidly. Therefore, PFS–Fe<sub>3</sub>O<sub>4</sub> works at a broader range even in the absence of external magnetic field.

# 3.4. The dosing strategy

There were three dosing strategies. The structures of the three different flocs are shown in Fig. 8. The first was that PFS was dosed first followed by  $Fe_3O_4$  (expressed as PFS+Fe\_3O\_4), that is, PFS and CR were first combined, and then the PFS–CR interacted with the  $Fe_3O_4$ . The second was to add  $Fe_3O_4$  first and then followed by PFS (expressed as  $Fe_3O_4$ +PFS), this time, after  $Fe_3O_4$  was added, it can be quickly mixed with CR and thus form a mixed system of CR–Fe<sub>3</sub>O<sub>4</sub>. The PFS added later can bridge PFS and  $Fe_3O_4$ . The third one was to add  $Fe_3O_4$  and PFS at the same time (expressed as  $Fe_3O_4$ -PFS). In this condition, the surface of bare magnetic  $Fe_3O_4$  nanoparticles was firstly combined with PFS and then contacted CR.

As we can see in Fig. 9, when 200 mg/L Fe<sub>3</sub>O<sub>4</sub> was added, Fe<sub>3</sub>O<sub>4</sub>–PFS removal rate increased by 14.43%, while the PFS+Fe<sub>3</sub>O<sub>4</sub> and Fe<sub>3</sub>O<sub>4</sub>+PFS increased by 2.81% and 8.01%, respectively. When the Fe<sub>3</sub>O<sub>4</sub> was added at 400 mg/L, the removal value of Fe<sub>3</sub>O<sub>4</sub>–PFS increased by 17.37%, and PFS+Fe<sub>3</sub>O<sub>4</sub> and Fe<sub>3</sub>O<sub>4</sub>+PFS increased by 4.31% and 9.61%, respectively.

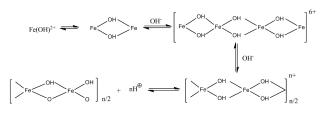


Fig. 7. Simplified scheme of the hydrolysis–polymerization process of PFS.

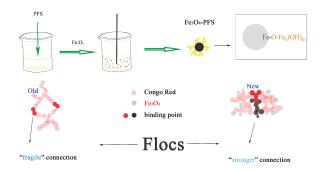


Fig. 8. The possible flocculation mechanism of the flocculant.

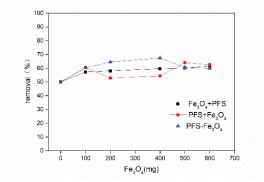


Fig. 9. Effect of different dosage strategy on removal value of CR.

The results of  $Fe_3O_4$ -PFS were obviously superior to that of PFS+Fe<sub>3</sub>O<sub>4</sub> and Fe<sub>3</sub>O<sub>4</sub>+PFS from 200 to 400 mg/L. These differences showed that the increased number of particles was not the dominants mechanism, which was different from the conclusion of Prochazkova et al. [14] dealing with CMP wastewater. It could be seen that the performance of Fe<sub>3</sub>O<sub>4</sub>+PFS is better than PFS+Fe<sub>3</sub>O<sub>4</sub>. The order of color removal was Fe<sub>3</sub>O<sub>4</sub>-PFS > Fe<sub>3</sub>O<sub>4</sub>+PFS > PFS+Fe<sub>3</sub>O<sub>4</sub>.

According to Fig. 5, the adsorbing-bridging was the main mechanism. So, the presence of  $\text{Fe}_3\text{O}_4$  contributes to the effect of adsorbing-bridging.

In addition, the Fe<sub>3</sub>O<sub>4</sub>-PFS was black and well distributed. PFS was chelated and adsorbed on the surface of bare Fe<sub>2</sub>O<sub>4</sub>, which enhanced the stability of colloidal particles and could fully disperse in CR solution [34]. However, Fe<sub>2</sub>O<sub>4</sub>+PFS did not show obviously black, and PFS+ Fe<sub>3</sub>O<sub>4</sub> was slightly black. Fe<sub>2</sub>O<sub>4</sub>+PFS and Fe<sub>2</sub>O<sub>4</sub>+PFS tended to agglomerate and precipitate under the Van der Waals force, magnetic attraction, and gravity, and could not form a stable suspension system, thus reducing the chance of Fe<sub>2</sub>O<sub>4</sub> to bind with CR and PFS, finally, the removal rate was decreased. In the other situation, for PFS+Fe<sub>2</sub>O<sub>4</sub>, after PFS was added, PFS quickly combined with the CR. With the addition of  $Fe_2O_4$ , the  $Fe_2O_4$ would be combined with some flocs, not easy to directly precipitate and therefore the solution was pan-black. For Fe<sub>3</sub>O<sub>4</sub>+PFS, most of the Fe<sub>3</sub>O<sub>4</sub> tended to precipitate to the bottom, only a small part of the Fe<sub>3</sub>O<sub>4</sub> stay in the solution, so no obviously black was observed. However, Fe<sub>2</sub>O<sub>4</sub>+PFS showed better performance than PFS+Fe<sub>3</sub>O<sub>4</sub>, it further demonstrated that the structure of the flocs played an important role.

When the dosage of  $\text{Fe}_3\text{O}_4$  is less than 100 mg/L or more than 500 mg/L, the three kinds of dosing methods showed almost the same performance. When a small amount of  $\text{Fe}_3\text{O}_4$ was added, the structure of the flocs did not show much difference. When the amount of  $\text{Fe}_3\text{O}_4$  dosing is large, a part of the  $\text{Fe}_3\text{O}_4$  directly sinks to the bottom of the beaker, and the other part enhances the combination of PFS and  $\text{Fe}_3\text{O}_4$ , finally resulting in similar removal value of the three dosing methods at this time.

## 3.5. Floc morphological characteristics

It can be seen from Fig. 10 that the  $\text{Fe}_3\text{O}_4$  dispersed around the flocs and in the agglomeration state. The following structures were observed under careful observation: (1) the floc adhered to the periphery of the  $\text{Fe}_3\text{O}_4$  (2) the  $\text{Fe}_3\text{O}_4$ 

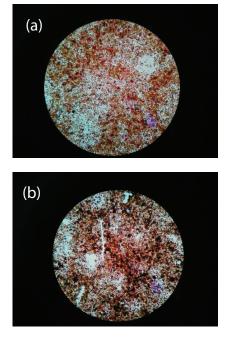


Fig. 10. Flocs under the optical microscope (×100) after magnetic flocculation: (a) the flocs flocculate by PFS and (b) the flocs flocculate by Fe<sub>2</sub>O<sub>2</sub>–PFS.



Fig. 11. Flocs under the optical microscope (×400) after magnetic flocculation by  $Fe_3O_4$ –PFS.

sandwiched Congo Red floc body, and (3) Congo Red flocs sedimented alone. Among them, the first structure is of the majority. As can be seen from Fig. 11, Fe<sub>3</sub>O<sub>4</sub> gathered in different sizes with uneven distribution. With the larger specific surface area of Fe<sub>3</sub>O<sub>4</sub>, the flocs can adhere to the periphery of the Fe<sub>3</sub>O<sub>4</sub>, thus larger flocs were formed. Finally, an improved removal value was gotten.

As we can see from Fig. 4, the removal value decreased with excessive  $Fe_3O_4$ . With the increase of the  $Fe_3O_4$ , the part of the magnetic skeleton would increase which resulted in the rapid precipitation. In return, the removal value decreased.

## 3.6. Characteristics

In order to further demonstrate the structure of the flocs, the FTIR spectra of flocculants and flocs are shown in Fig. 12. Floc1 was produced by PFS and floc2 was produced by  $Fe_3O_4$ -PFS. Broad peaks at 3,500–3,200 cm<sup>-1</sup> and 1,612–1,635 cm<sup>-1</sup> were observed for all the samples and

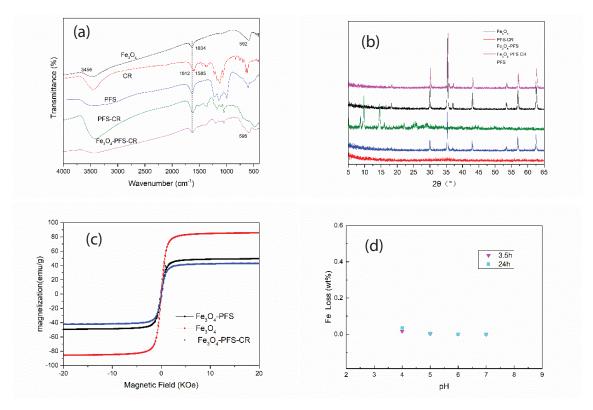


Fig. 12. Characterization results of (a) FTIR spectra, (b) XRD patterns, (c) magnetic hysteresis curve, and (d) leaching of Fe from flocculants at different pH levels.

Table 1 The characteristics of PFS–CR and  $Fe_3O_4$ –PFS–CR

Flocs	$D_{f}$	$R^2$	d(0.1)	d(0.5)	d(0.9)
PFS-CR	1.23	0.96	5.832	13.300	45.797
Fe <sub>3</sub> O <sub>4</sub> -PFS-CR	1.75	0.97	16.707	32.793	59.100

corresponded to the stretching vibration of –OH and to the vibration of water absorbed, or complexed in the coagulant [35]. PFS contained a large amount of sulfate, so the peak appeared at 998–1,224 cm<sup>-1</sup> was the vibration of S=O or/and O=S=O [31]. Fe<sub>3</sub>O<sub>4</sub> appeared relatively strong absorption peak at 592 cm<sup>-1</sup>, which was due to the vibration of Fe–O group [35]. In the spectrum of CR, the peak at 1,322–1,500 cm<sup>-1</sup> and 419–920 cm<sup>-1</sup> attributed to the vibration of benzene ring and its substituent, the absorption peak at 1,066–1,226 cm<sup>-1</sup> was due to the presence of SO<sub>4</sub><sup>2–</sup> group.

Compared with the spectrum of the two flocs, we could see that both of the two flocs have obvious benzene ring and its substituted hydrocarbon absorption peak, indicating the existence of CR. For floc2, a broad peak at 596 cm<sup>-1</sup>, which was found in the spectrum of Fe<sub>3</sub>O<sub>4</sub> but not in the spectrum of floc1, was contributed to the vibration of Fe–O group. All of these indicated that the structure of Fe<sub>3</sub>O<sub>4</sub>–PFS–CR was formed.

The powder XRD patterns in Fig. 12(b) exhibit that magnetite particles are found in Fe<sub>3</sub>O<sub>4</sub>, Fe<sub>3</sub>O<sub>4</sub>–PFS, and Fe<sub>3</sub>O<sub>4</sub>–PFS–CR as the diffraction peaks at 30.2°, 35.5°, 43.1°, 53.4°, 57.0°, and 63.1° are assigned to the cubic spinel structure of Fe<sub>3</sub>O<sub>4</sub>, indicating that the coating process did not

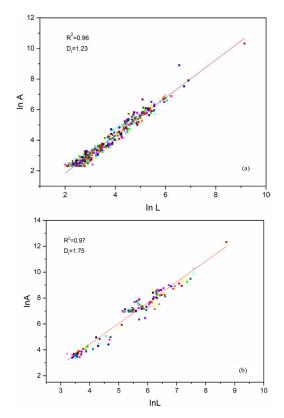


Fig. 13. Fractal dimension and correlation coefficients: (a) PFS–CR and (b)  $Fe_3O_4$ –PFS–CR.

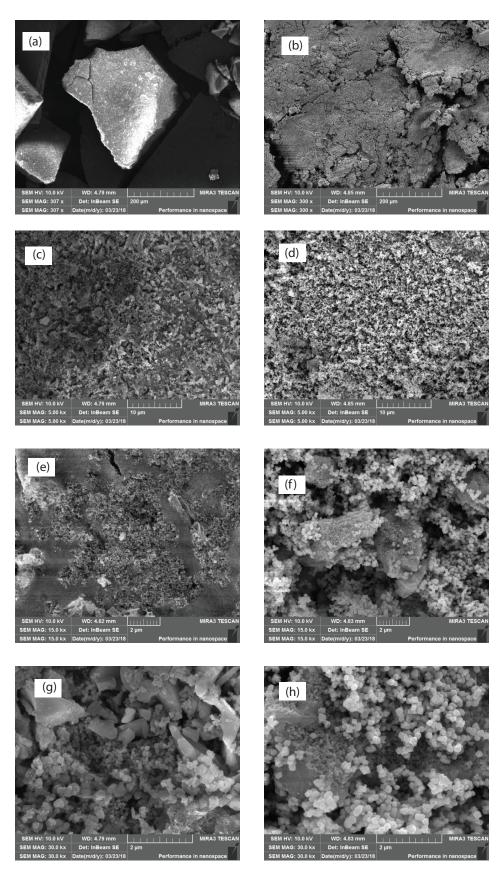


Fig. 14. SEM images of various samples: (a) PFS-flocs (×300), (b)  $Fe_{3}O_{4}$ -PFS-flocs (×300), (c) PFS-flocs (×5,000), (d)  $Fe_{3}O_{4}$ -PFS-flocs (×5,000), (e) PFS-flocs (×15,000), (f)  $Fe_{3}O_{4}$ -PFS-flocs (×15,000), (g) PFS-flocs (×30,000), (h)  $Fe_{3}O_{4}$ -PFS-flocs (×30,000).

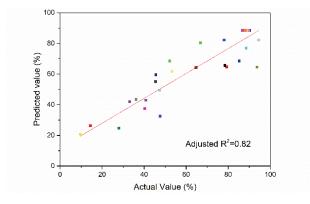


Fig. 15. Parity plot for the experimental and predicted values of removal value of the dye.

induce any phase change of Fe<sub>3</sub>O<sub>4</sub> and further demonstrates the successful combination of flocs. After coating, the intensities of corresponding diffraction peaks for magnetic flocculants were significantly reduced because of the layer of PFS or PFS–CR on the particle surface. The hysteresis loop of each curve in Fig. 12(c) demonstrated superparamagnetic properties. The saturation magnetization values ( $M_s$ ) were measured to be 85.60, 49.35, and 42.64 emu g<sup>-1</sup>, respectively, for Fe<sub>3</sub>O<sub>4</sub>, Fe<sub>3</sub>O<sub>4</sub>–PFS, and Fe<sub>3</sub>O<sub>4</sub>–PFS–CR. Obviously, the  $M_s$  value decreased after coating, but the relatively high saturation magnetization significantly facilitates separation and regeneration of it.

Taking into account the economic costs of water treatment, the stability of  $Fe_3O_4$  was investigated to evaluate its application potential in removal of organic dyes. As can

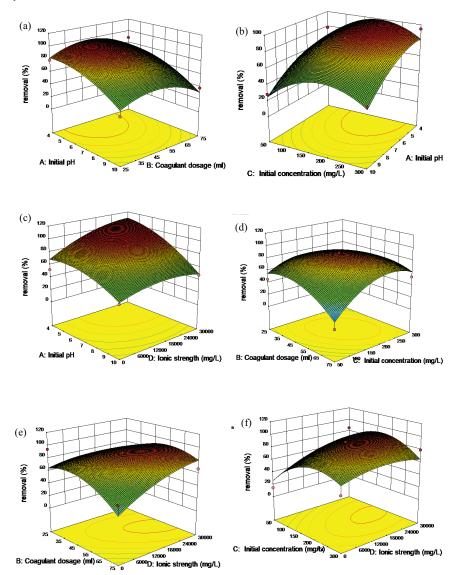


Fig. 16. Coagulation–flocculation optimization using RSM–BBD: (a) surface plots for removal value of the dye: initial pH and coagulant dosage (initial concentration = 175 mg/L, ionic strength = 15,000 mg/L), (b) initial pH and initial concentration (coagulant dosage = 50 mL, ionic strength = 15,000 mg/L) at pH 7, (c) initial pH and ionic strength (coagulant dosage = 50 mL, initial concentration = 175 mg/L), (d) coagulant dosage and initial concentration (initial pH = 7, ionic strength = 15,000 mg/L), (e) coagulant dosage and ionic strength (initial pH = 7, ionic strength = 17, 000 mg/L), (f) initial concentration and ionic strength (initial pH = 7, coagulant dosage = 50 mL).

be seen from the analysis of pH dependence in Fig. 12(d), the leaching rate at the pH studied was very low, implying that leaching of Fe was ignorable.

#### 3.7. Characteristics of flocs

To demonstrate the structure of flocs, characteristics of flocs by PFS flocculation and  $Fe_3O_4$ -PFS flocculation were compared in this study. Fractal dimension and particle size distribution are displayed in Table 1 and Fig. 13, revealing the difference between the two kinds of flocs. Table 1 illustrates that fractal dimension and the particle size of  $Fe_3O_4$ -PFS-CR were higher than PFS-CR, which revealed that the structure of  $Fe_3O_4$ -PFS-CR were denser and compacter than that of PFS-CR. When the PFS was used to flocculate CR, the charge neutralization was the dominated mechanism. The force of electrostatic and Van der Waals were weak, so loosely PFS-CR were formed.

The morphology of the flocs in the absence and presence of Fe<sub>2</sub>O<sub>4</sub> exhibited in Fig. 14 provided further structure evidence of the flocculation mechanism. The SEM pictures revealed that the flocs, of small size and randomly separated, in the absence of the Fe<sub>3</sub>O<sub>4</sub> are gathered in bigger aggregates after the formation of the flocs based on Fe<sub>3</sub>O<sub>4</sub>. In addition, PFS-CR had relative regular structure and smooth surface in Fig. 14(a). However, Fe<sub>2</sub>O<sub>4</sub>–PFS–CR possessed tiny and sharp bulges on the surface and formed loose condensed structure based on the rigid skeleton of Fe<sub>3</sub>O<sub>4</sub>. Fe<sub>3</sub>O<sub>4</sub>-PFS-CR combined Fe<sub>3</sub>O<sub>4</sub> and PFS, and flexible branches and rigid structures penetrate each other. The embedded structure added the surface area to interact with each other, and thus the ability of adsorbing was enhanced. In addition, the weight of the flocs was heavier which was conducive for forming denser and compacter flocs. What more is that the porous morphologies of samples can improve the ability to adsorbing and flocculating purities in water. Finally, a better result was gotten.

## 3.8. Optimization of coagulation-flocculation using RSM-BBD

The experimental design matrix used for the coagulation– flocculation optimization together with the experimental and predicted residual turbidities is listed in Table S2. According to the experimental results, the best second-order polynomial equation was obtained as follows:

$$Y = -52.68 + 15.08X_1 + 1.76X_2 + 0.49X_3 + 0.00264X_4 - 0.018X_1X_2 - 0.00251X_1X_3 - 0.000193X_1X_4 + 0.00422X_2X_3 + 0.000032X_2X_4 - 0.00000494X_3X_4 - 1.29X_1^2 - 0.03X_2^2 - 0.00156X_3^2 - 0.0000000414X_4^2 (3)$$

For a reliable model, the predicted data of the residual turbidity should be compared with the experimental data. Fig. 15 shows that the experimental data agree well with the predicted data of the removal value. The adjusted  $R^2$  value of 0.82 suggested the fitness of the model, because magnetic coagulation is always instability. Furthermore, the adequacy of the model was justified through analysis of variance (ANOVA) as shown in Table S3. The values of 'Prob > *F*' less than 0.0500 indicated that the model terms were significant as indicated in Table S3.

The response surface 3D plots for a better explanation for the independent variables and their interactive effects on the removal value of the dye are presented in Fig. 16. Here, the pH value and ionic strength played a key role in the coagulation–flocculation process. pH and ionic strength can greatly influence the property of PFS, thus the performance of PFS–  $Fe_3O_4$  was changed.

It can be concluded that the performance of PFS–Fe<sub>3</sub>O<sub>4</sub> mainly depended on the property of PFS. The denser and compacter flocs of PFS–Fe<sub>3</sub>O<sub>4</sub> induced the higher removal value.

# 4. Conclusion

This paper presents a new method to remove soluble anion dye, Congo Red. In this method, the Fe<sub>3</sub>O<sub>4</sub> was combined with the PFS to remove the CR without external magnetic field for the first time. This study shows that pH, the ratio of Fe<sub>3</sub>O<sub>4</sub> and PFS, and the method of dosing have a great impact on the effect of magnetic coagulation-flocculation. After PFS was dissolved in water, polynuclear complex ions were formed by OH bridges. The polynuclear complex ions had a very large surface area and were positively charged, with the addition of Fe<sub>3</sub>O<sub>4</sub>, the sun-like structure of Fe–O–  $Fe_{\mu}(OH)_{\mu}$  was formed. As shown in Fig. 8, when PFS- $Fe_{3}O_{4}$ was added to the Congo Red solution, the denser, compacter, and larger flocs were formed, which strengthened the effect of adsorbing-bridging, and thus the removal value was improved. The method breaks the limit to remove the soluble dyes by magnetic coagulation and enriches the theoretical research foundation of magnetic coagulation that is of guiding significance for the expansion of this field. By using the method, the flocs produced by magnetic coagulation can rapidly remove the flocs under the condition of applied magnetic field, which can significantly reduce the settling time. In addition, the dosage of inorganic flocculants needed significantly decreased. The used Fe<sub>2</sub>O<sub>4</sub> is environmentally friendly, has no secondary pollution, and is easy to be recovered. Therefore, the method has the advantages of high efficiency, simplicity, no secondary pollution, and has a wide range of applications.

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# Supplementary material

Table S1 Levels and codes of Box–Behnken design

Factor	Codes		Level	Level		
	<i>x</i> <sub>1</sub>	-1	0	1		
Initial pH	$X_1$	4	7	10		
Coagulant dosage/mL	$X_2$	25	50	75		
Initial concentration	$X_3$	50	175	300		
Ionic strength	$X_4$	0	15,000	30,000		

Table S2 Box–Behnken experiment plan and result

Experiment number	Code	S			Actual				Removal percentage	
	<i>x</i> <sub>1</sub>	<i>x</i> <sub>2</sub>	<i>x</i> <sub>3</sub>	<i>x</i> <sub>4</sub>	$X_1$	X2	$X_3$	$X_4$	Actual	Predicted
1	0	0	0	0	7	50	175	15,000	90.11	88.49
2	0	0	1	1	7	50	300	30,000	79.30	64.73
3	-1	0	0	-1	4	50	175	0	52.17	68.50
4	-1	-1	0	0	4	25	175	15,000	78.11	82.18
5	0	0	0	0	7	50	175	15,000	87.60	88.49
6	0	0	0	0	7	50	175	15,000	86.74	88.49
7	0	1	-1	0	7	75	50	15,000	9.60	20.76
8	0	-1	0	-1	7	25	175	0	93.71	64.49
9	0	0	1	-1	7	50	300	0	45.53	59.47
10	1	-1	0	0	10	25	175	15,000	33.14	41.99
11	0	-1	0	1	7	25	175	30,000	64.74	64.21
12	1	0	-1	0	10	50	50	15,000	28.00	24.65
13	-1	0	0	1	4	50	175	30,000	93.49	109.64
14	0	0	-1	1	7	50	50	30,000	85.20	68.56
15	0	0	0	0	7	50	175	15,000	88.23	88.49
16	1	0	0	-1	10	50	175	0	40.80	42.97
17	1	0	1	0	10	50	300	15,000	40.33	37.44
18	1	1	0	0	10	75	175	15,000	38.11	31.35
19	-1	0	1	0	4	50	300	15,000	94.50	82.23
20	0	-1	1	0	7	25	300	15,000	36.20	43.36
21	0	1	1	0	7	75	300	15,000	53.20	61.84
22	1	0	0	1	10	50	175	30,000	47.37	49.37
23	0	0	0	0	7	50	175	15,000	89.77	88.49
24	0	-1	-1	0	7	25	50	15,000	45.40	55.09
25	-1	0	-1	0	4	50	50	15,000	78.40	65.67
26	0	0	-1	-1	7	50	50	0	14.40	26.28
27	0	1	0	1	7	75	175	30,000	66.74	80.34
28	0	1	0	-1	7	75	175	0	47.60	32.51
29	-1	1	0	0	4	75	175	15,000	88.51	76.97

Term	Sum of squares	Degree of freedom	Mean square	F-value	P-value	Remarks
Model	15,380.9	14	1,098.6	4.3	0.0051	Significant
$X_1$	5,522.3	1	5,522.3	21.6	0.0004	Significant
$X_2$	188.4	1	188.4	0.7	0.4056	Insignificant
$X_3$	646.3	1	646.3	2.5	0.1345	Insignificant
$X_4$	1,695.1	1	1,695.1	6.6	0.0221	Significant
$X_{1}X_{2}$	7.4	1	7.4	0.0	0.8678	Insignificant
$X_{1}X_{3}$	3.5	1	3.5	0.0	0.9080	Insignificant
$X_{1}X_{4}$	301.8	1	301.8	1.2	0.2961	Insignificant
$X_{2}X_{3}$	697.0	1	697.0	2.7	0.1213	Insignificant
$X_{2}X_{4}$	578.7	1	578.7	2.3	0.1550	Insignificant
$X_{3}X_{4}$	342.9	1	342.9	1.3	0.2667	Insignificant
$X_{1}^{2}$	868.1	1	868.1	3.4	0.0869	
$X_{2}^{2}$	2,292.8	1	2,292.8	9.0	0.0097	Significant
X <sub>3</sub> <sup>2</sup>	3,870.8	1	3,870.8	15.1	0.0016	Significant
$X_{4}^{2}$	561.5	1	561.5	2.2	0.1609	Insignificant
Residual	3,586.3	14	256.2			
Lack of fit	3,578.1	10	357.8	174.7	< 0.0001	Significant
Pure error	8.2	4	2.0			
Correction total	18,967.2	28				

Table S3 ANOVA test for the residual turbidity of the surfactant effluent