










## Article

# A Recent Study on Remediation of Direct Blue 15 Dye Using Halloysite Nanotubes

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**Abstract:** A set of lab-scale experiments were designed and conducted to remedy Direct Blue 15 (DB15) dye using nontoxic halloysite nanotubes (HNT) with the view to be utilized in a textile industrial effluent (TIE). The DB15 adsorbed-HNT “sludge” was used as a reinforcing agent and plastic waste to fabricate the composite. To advance the knowledge and further understand the chemical phenomena associated with DB15 adsorption on HNT, different factors like pH value, adsorbate initial concentration, adsorbent dosage, and temperature on the composite were affected experimentally tested. To estimate the adsorption capacity of HNT, nine isotherm models were applied, and it was identified that the Brouers–Sotolongo adsorption isotherm model represented the best accuracy for predicting the adsorption behavior of the HNT. Likewise, the pseudo-second-order reaction was the predominant mechanism for the overall rate of the multi-step dye adsorption process. Additionally, it was demonstrated that the mass transfer during the process is diffusion-controlled, and thermodynamic assessments showed that the process is physisorption.

**Keywords:** remediation; Direct Blue 15; halloysite nanotubes; diffusive mass transfer; adsorption isotherm model

## 1. Introduction

Our previous studies successfully demonstrate a novel nutraceutical industrial spent as a new class of bio-sorbents to amputate dyes from water and industrial effluents. The resultant dye adsorbed waste as a filler material and a plastic waste to fabricate composites [1]. The ever-growing demands for textile products are by far one of the principal supporters of ecological contamination. The insatiable consumption of water in textile industries has also led to a massive water pollution problem as well [2]. This is because, in this industry, in various stages, the discharge waste contains a variety of dyes that poses a technical challenge for the treatment of water and is, of course, a threat to the environment and health of the ecosystem [3]. Accordingly, there is a need to develop innovative, efficient, and cost-effective methods to treat textile industrial effluents. Much effort has been made to utilize different techniques, including but not limited to biological [4], chemical [5], photo-chemical [6], and physical routes [7–9]. Despite some promising results, however, they have three significant deficiencies such as (1) economically unviable, (2) production of undesirable degradation products which display more toxicity than the precursors, and (3) production of undesirable sludge.

Adsorption as a mass transfer technique offers a plausible heat transfer coefficient and feasible approach for the remediation of dyes [10]. One of the significant drawbacks of the adsorption techniques, particularly in the remediation of dyes in a textile industrial effluent, is attributed to the production of highly concentrated sludge, which leads to a disposal problem. Initiated carbon has generally been utilized for remediation of colors in the textile industries, which adds to the complexity of the process and the final cost of the products considering the need for regeneration of active carbon [11]. This is the primary driver to seek alternative approaches aiming to treat effluents with more cost-effective and environmentally benign methods.

The requirement of the quantity of adsorbent for remediation in a textile industry runs into tons of material. Thus, the process for removing dyes from the effluents obtained from textile industries should be economical and eco-friendly. To satisfy these requirements, clay minerals are most appropriate as adsorbents for the amputation of dyes from effluents. However, clay minerals need to be optimized as nanomaterials to enhance several properties targeted for specific applications [12]. Amongst many nanoclay minerals available in abundance, halloysite nanotube (HNT) finds applications in catalysis [13], cosmetics and pharmacy [14], and medicine [15]. We have selected HNT as a choice of adsorbent to suit the design of the circular economy (CE) concept for two reasons. Firstly, it has a tubular structure with functional groups on the surface and inside the pore with different chemistries, enhancing the efficiency of adsorption during the remediation process of dyes. Secondly, HNT as a reinforcement material has been extensively used to fabricate nanocomposites [16].

Azo dyes are currently banned from use in industrial and domestic sectors all over the world. However, they are being processed to produce up to 70% of dyes used in the textile industry due to their inherent properties, such as (1) simple and cost-effective synthesis in aqueous media, (2) availability of colossal choice of starting materials, (3) a wide spectrum of shades, (4) high intensity and superior fastness of the color, (5) versatility in applications on a variety of substrates and (6) energy-saving dyeing process at 60 °C when compared to boiling temperature of its counterparts [17].

DB15 is a bis azo dye utilized to dye materials such as cellulose, leather, wool, and paper. The dye is also utilized for staining biological materials and to tint cinematographic films. The use pattern for the dye in the USA is 65%, 30%, and 5% for textile dyeing, paper colorant, and other uses, respectively [18]. Despite such promising applications, there is a lack of information on using this material for remediation of DB15 by adsorption technique [19].

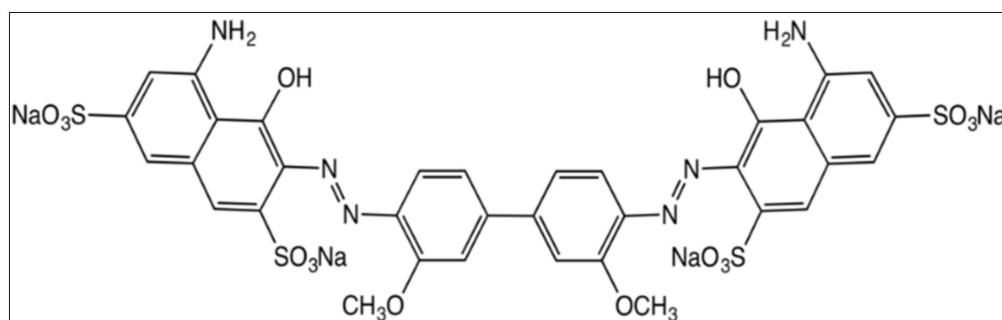
Considering the above literature, the primary reason for the current investigation is to advance the knowledge on remediation of DB15 by adsorption technique and design an effective technique for the remediation of DB15 from water and textile industrial

effluent (TIE). The dye adsorbed HNT generated as “sludge” is used to fabricate novel composites using waste plastic and the CE approach.

## 2. Materials and Methods

### 2.1. Materials

Halloysite nanotubes (HNT) and Direct Blue 15 (DB15) dye (C.I. = 24400; CAS registry number = 2429-74-5; chemical formula =  $C_{34}H_{24}N_6Na_4O_{16}S_4$ ; molecular weight = 992.81) were obtained from Aldrich, India. The dye is commonly referred to as Direct Sky Blue 5B (Figure 1).



**Figure 1.** Structure of Direct Blue 15 dye used in the present research.

#### 2.1.1. Investigation on Factors Effecting Adsorption of DB15 Dye on HNT

Using batch experiments, the impact of test boundaries such as pH, beginning DB15 color focus, HNT measurements, and the temperature was considered. For setting up the stock arrangement of DB15 ( $1000 \text{ mg L}^{-1}$ ), refined  $H_2O$  was utilized. Required arrangement focuses ( $25\text{--}500 \text{ mg L}^{-1}$ ) were ready from the sample. To a progression of 250 mL jars, 50 mL watery DB15 color arrangement ( $25\text{--}500 \text{ mg L}^{-1}$ ) was added. A necessary measure of HNT was brought into every jar. Assessments were led dependent on the impacts of fluctuating boundaries like pH (2–12), DB15 color starting concentration ( $25\text{--}500 \text{ mg L}^{-1}$ ), and measurements of adsorbent ( $0.025\text{--}0.3 \text{ g mL}^{-1}$ ;  $0.5\text{--}6.0 \text{ g L}^{-1}$ ). To consider the impact of temperature on the course of adsorption, three temperatures were chosen to contemplate the underlying color convergence of  $100 \text{ mg L}^{-1}$ . The unabsorbed DB15 color in the arrangement stage was disengaged from HNT for five minutes at 3000 rpm centrifugation. In the event that the arrangement was indistinct, the centrifugation was rehashed for an extra five minutes. The DB15 color focus at balance relating to the supernatant centrifuged arrangement was settled utilizing a UV–vis spectrometer at  $\lambda_{\text{max}}$  602 nm. To contemplate the impact in a scope of pH 2–12 clump tests were completed. The pH of the arrangement was adjusted using 0.01–1.00 M HCl or NaOH arrangement. Analyses were finished in three-fold and the midpoints are accounted for. The constants of variety of outcome did not surpass in all cases  $\pm 2\%$  fault.

#### 2.1.2. Characterization Methods

IR spectra were recorded using the FTIR spectrophotometer. The pH meter 802, manufactured by Systronics, India, was utilized to quantify pH. The point of zero charge (pHPZC) of HNT was controlled by carrying out the procedure described by us elsewhere [20,21].

#### 2.1.3. Optimization of Process Parameters

For an adsorption process, several parameters plays vital functions in determining the dye adsorbing capacity of the adsorbent material. These include time allocated to the adsorption process, the temperature at which it is being carried out, the concentration of the adsorbate dye, the quantity of the adsorbent substance, and the pH at which the adsorption process occurs. Table 1 shows the experimental span for influencing factors

**Table 1.** Experimental span for influencing factors [1] (Reproduction with permission from the publisher).

Factor	Name	Units	Minimum	Maximum
A	Time	min	0	180
B	Temp.	°C	27	50
C	Conc.	mg L <sup>-1</sup>	25	500
D	Adsorbent conc.	g L <sup>-1</sup>	0.500	6.000
E	pH	-	2	12

### 3. Results

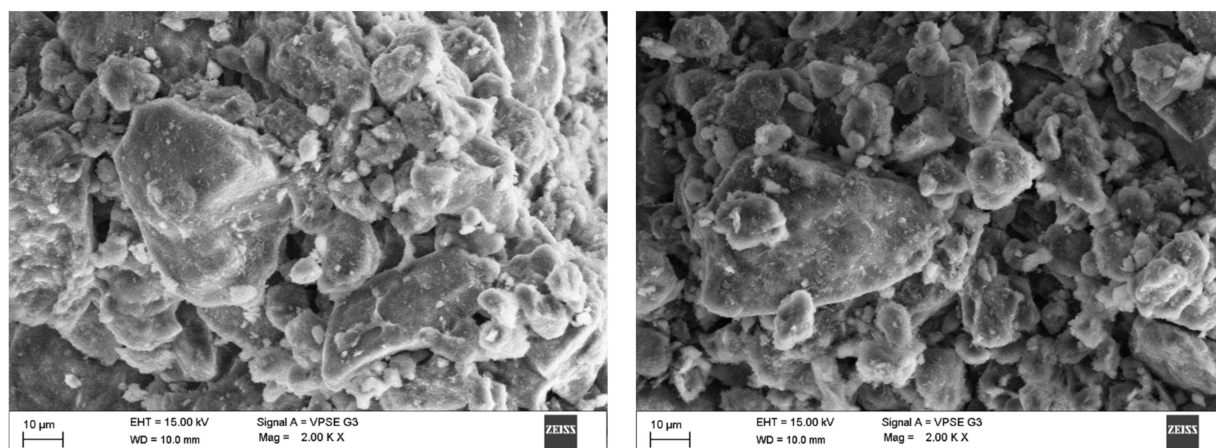
#### 3.1. Characterization of HNT and DB15–HNT Surfaces

##### Scanning Electron Microscopy and FTIR Spectrum

Surface characterization of HNT and DB15–HNT was performed via SEM. Figure 2a,b shows the surface of HNT covered with the DB15 dye. A comparison of FTIR spectra of pristine HNT, DB15 dye, and DB15 dye adsorbed on HNT revealed the following: absence of bands between 2800–3000 cm<sup>-1</sup> was identified in pristine HNT (Figure 3), whereas a tiny band appeared at around 3750 cm<sup>-1</sup> was ascribed to traces of adsorbed water. The typical bands around 2830 and 2852 cm<sup>-1</sup> were because of C–H stretching asymmetric and symmetric vibrations, respectively. The vibration band at 1000–1080 cm<sup>-1</sup> was correlated to the vibrations of single bonds of Si–O, Al–O, and C–O molecules.

FTIR spectra for DB15 dye exhibit the distinctive N–H and CH-aromatic stretching vibrations bands around 2800–3000 and 2900 cm<sup>-1</sup>, respectively. The vibration around 1700 cm<sup>-1</sup> was accredited to S=O of the sulfites group in dyes structure. The triplet bands generally ascribed to C=C in aromatic rings attached with N=N of the azo cluster are seen around 1640, 1570, and 1460 cm<sup>-1</sup>. The multiple bands attributed to N–H and CH bending vibrations that appear at around 1460–1300 cm<sup>-1</sup> were also realized.

FTIR spectra of DB15 dye showed a significant band in the range 2800–3000 cm<sup>-1</sup>. This band appears to be less intense and tends to vanish due to the interactions between the NH groups in dyes with Si/Al in HNC as (Si<sup>4+</sup> ⋯ :NH and Al<sup>3+</sup> ⋯ :NH) in the DB15–HNT FTIR spectra. Additionally, the disappearance of the N = N stretching band around 1598 cm<sup>-1</sup> confirms the adsorption of the DB15 dye on HNT. The interaction between components will affect the property of double bonds and increase the character of the single bond, which is reflected in a sharp expansion in the force of the band around 1100 cm<sup>-1</sup>. Moreover, the disappearance of IR absorption frequencies established the adsorption of DB15 onto HNT. Determination of pH<sub>PZC</sub> confirms that HNT at pH 7.61 displays zero charges (Figure 4).



(a) SEM image of HNT before adsorption

(b) SEM image of DB15–HNT after adsorption

**Figure 2.** Surface characterization of halloysite nanotubes before and after adsorption studies.

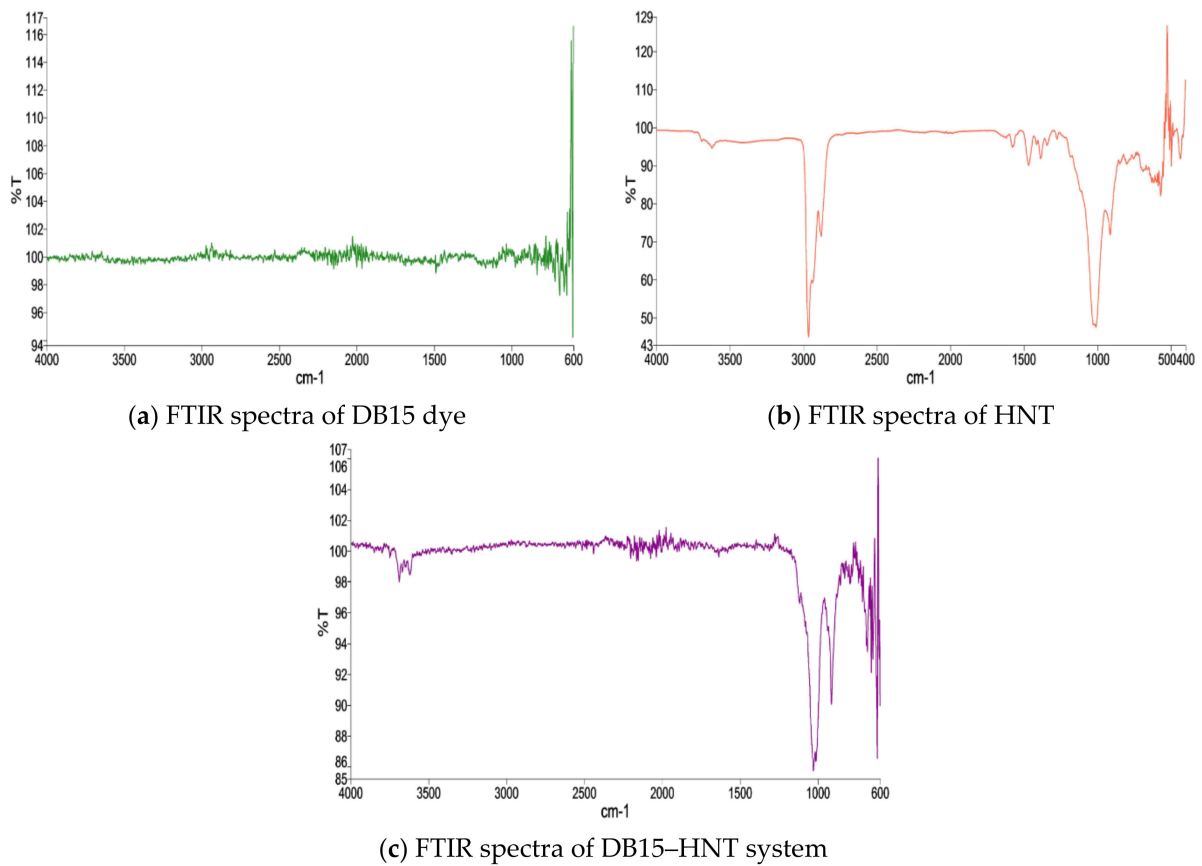


Figure 3. FTIR spectra of the samples under study.

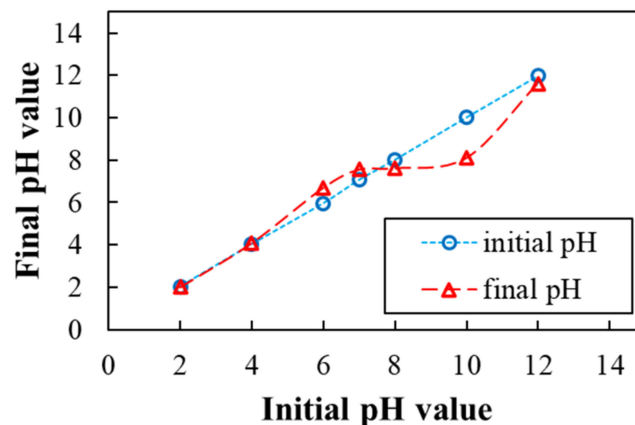


Figure 4. The deliberate mark of zero charges of HNT at the convergence.

### 3.2. The Impact of Factors on DB15 Adsorption on HNT

#### 3.2.1. pH Value of Solution

The adsorption limit of HNT relies upon the value of the pH solution. The pH value majorly influences the attributes of the adsorbent surface and the chemistry of the dye solution [22]. The value of pH, reflects the efficiency of the adsorbent. This boundary is critical when the interaction is scaled too higher. Technology readiness level (TRL) and the commercial stage [23]. As depicted in Figure 5a, the shape of the curve was consistent with the expected results already published in the literature. The primary components of HNT are the oxides of Al and Si. These oxides have various ionization features and surface charges because different zeta potential rates when remained in touch with water [24]. At  $\text{pH} > 1.5$ , the external surface of HNT has negative charges due to the presence of silica

in its chemical structure (Figure 6). Conversely, at a lower pH the anionic dye exhibits a positive charge (see Figure 5a). Thus, adsorption at a higher level occurs in the pH range of 2–4. A rise is seen in the level of pH the amount of degree of protonation of  $\text{NH}_2$  and  $\text{OH}$  groups of the dye decreases. Accordingly, the adsorption capacity of the substrate decreases sharply from pH 4 to 6. A sharp increase at  $\text{pH} > 10$  is likely due to dye adsorption onto positively charged  $\text{Al}^{3+}$  and  $\text{Si}^{4+}$  ions. Moreover, the degradation of the dye at  $\text{pH} > 10$ , resulting in a decrease in absorbance of the experimental solution, cannot be ruled out.

### 3.2.2. Initial DB15 Dye Concentration

The effect of this factor has a profound impact on the adsorption capacity of HNT. This is manifested in the results displayed in Figure 5b. The nature of the curve implies that the % elimination capability of the adsorbate (DB15) by the adsorbent (HNT) is maximum in the lower concentrations of the dye and declines with a surge in the concentrations, as seen in most of the cases [25]. Conversely, the  $q_e$  increases sharply from 25–200  $\text{mg L}^{-1}$ , and a marginal rise was noticed with a rise in the conc. level.

### 3.2.3. Effect of Adsorbent Dosage

For example, the elimination of DB15 dye from the sample enhances with an rise in the adsorbent dosage from 0.025 to 2.0  $\text{g L}^{-1}$ . It was noticed, the percent of DB15, the removal of the dye, grew exponentially from 0.025 to 2.0  $\text{g L}^{-1}$  with a rise in the amount of the adsorbent dosage. Thereafter, the marginal increase in the removal efficiency was observed (see Figure 5c). This perception accepts significance in the commercialization cycle, where the quantity of preliminaries with the least measures of the adsorbent considerably builds the evacuation effectiveness of the dye by HNT.

### 3.2.4. Effect of Temperature

The impact of temperature on DB15 color adsorption onto HNT is introduced in Figure 5d. The information obtained for the traditional thermodynamic boundaries, specifically,  $\Delta G^\circ$ ,  $\Delta H^\circ$ , and  $\Delta S^\circ$  show the kind of response. For instance, the  $+^{\text{ve}}$   $\Delta H^\circ$  values obtained from 303 to 323 K of HNT demonstrate the endothermic interaction. The  $-^{\text{ve}}$  benefit of  $\Delta G^\circ$  for the DB15–HNT framework affirm the suddenness and feasibility of the adsorption interaction. The size of  $\Delta G^\circ$  esteems is demonstrative of quick and unconstrained adsorption at lower temperatures. Further, it is surmised that  $+^{\text{ve}}$  upsides of  $\Delta S^\circ$  (entropy) demonstrate the homogeneity of the surface at the interface of the DB15 color and the HNT [26].

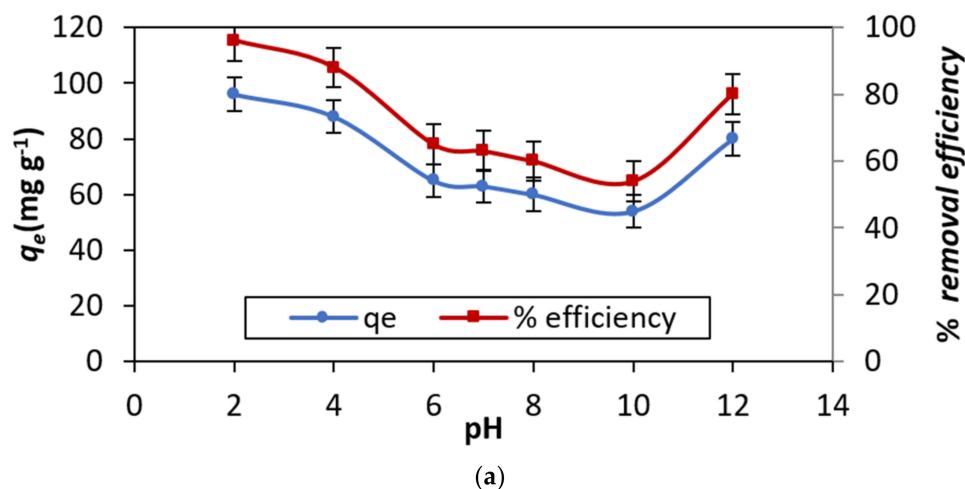
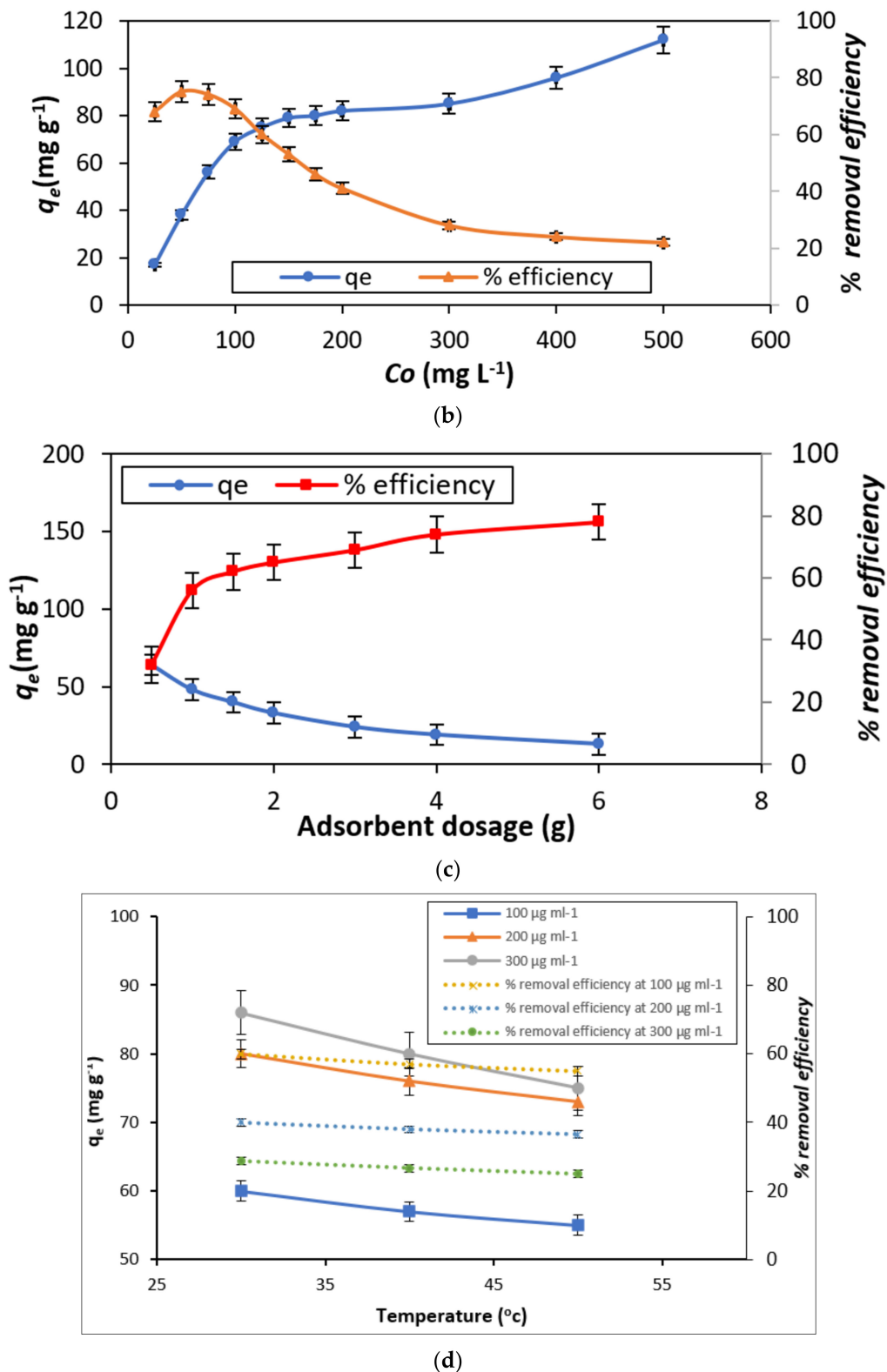
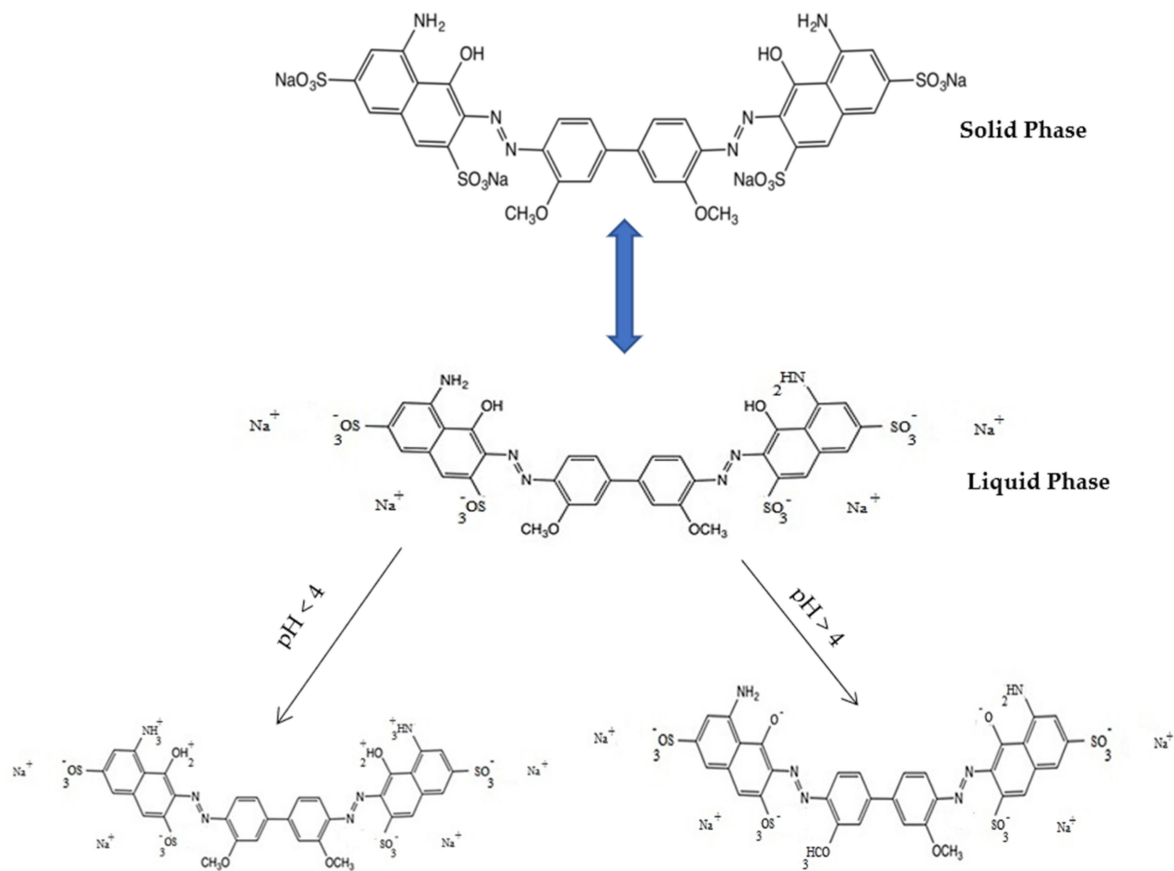


Figure 5. Cont.



**Figure 5.** Adsorption capacity and percentage of dye removal efficiency: (a) Effect of pH,(b) Effect of initial concentration of DB15 (adsorbate), (c) Effect of HNT (adsorbent) dosage, and (d) Effect of temperature.



**Figure 6.** Structures of Direct Blue 15 dye in an aqueous medium.

### 3.3. Adsorption Isotherms—Modeling Examination

The data of adsorption of DB15 dye by HNT were analyzed by applying the adsorption isotherm models proposed by Freundlich, Jovanovic, Dubinin-Radushkevich, Langmuir, Toth, Vieth-Sladek, Radke-Prausnitz, Redlich-Peterson and Brouers-Sotolongo, isotherm models. To refine the outcomes and to make a differentiation between practically comparable information acquired by different isotherm models, SSE and  $\chi^2$  as two extra blunder capacities were consolidated in our examination.

Langmuir [27] proposed a model in which the adsorbent was accepted to have dynamic locales having practically uniform energies. This was additionally settled on the possibility that no horizontal collaboration happens between adsorbed atoms. A level in a two-dimensional diagram with harmony focus ( $C_e$ ) as a free factor and  $q_e$  (Figure 7a) as a reliant variable describes the immersion of the adsorbent's active destinations on a superficial level [28]. This suggests that further adsorption cannot happen, and the possibility of multi-facet adsorption of the color is precluded. The experimental data,  $R^2 = 0.94$ ,  $q_e = 69.00 \text{ mg g}^{-1}$ , and  $Q_m = 97.96 \text{ mg g}^{-1}$  for the DB15–HNT system, indicates a good fit for the Langmuir adsorption isotherm model. The separation factor ( $R_L$ ) values of 0.035 and 0.419 indicate favorable adsorption of the DB15 dye onto HNT.

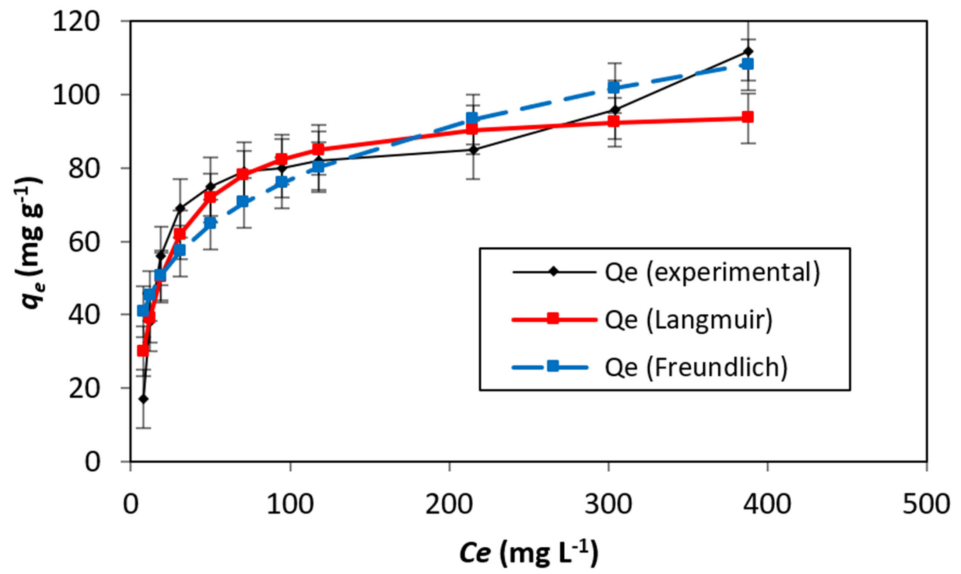
In addition, the adsorption is more likely if the rise in the starting concentrations reduces the RL. This, however, goes against what is seen in Figure 7a. Furthermore, HNT has offered motivation to study different models by variations of 98.96 and 69.00  $\text{mg g}^{-1}$ ,  $Q_m/Q_e$  ratios.

The Jovanovic model [29] tries to reduce the deviancies from the Langmuir isotherm. Comparing the variance in the values of  $q_e = 69.00 \text{ mg g}^{-1}$  and  $Q_m = 85.67 \text{ mg g}^{-1}$  with respect to Langmuir isotherm model.

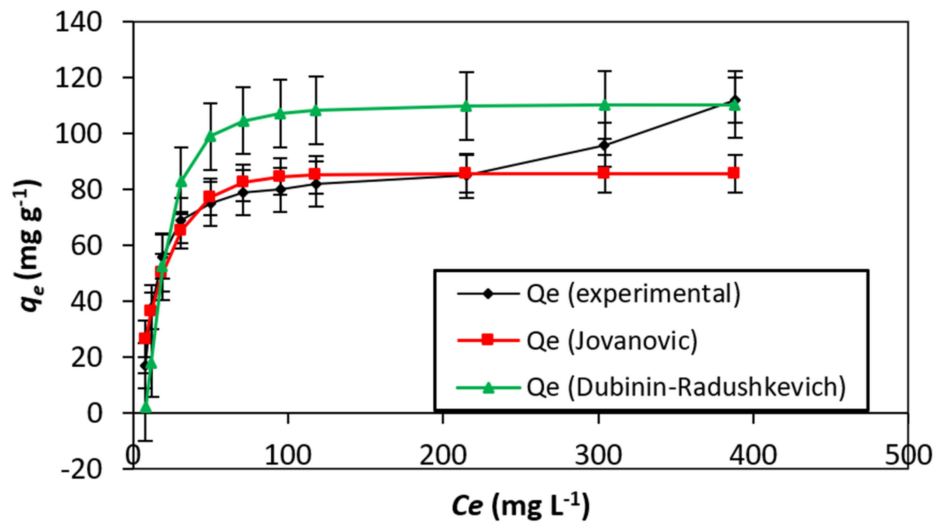
The adsorption isotherm empirical model proposed by Dubinin–Radushkevich [30] describes adsorption by filling the pore of the adsorbent. A value of 110.59  $\text{mg g}^{-1}$  for  $q_s$  con-



trasts with the Langmuir and Jovanovic models (Table 2). Additionally, a value of 0.97 for the correlation coefficient ( $R^2$ ) confirms that the process of adsorption is linear (Figure 7b).

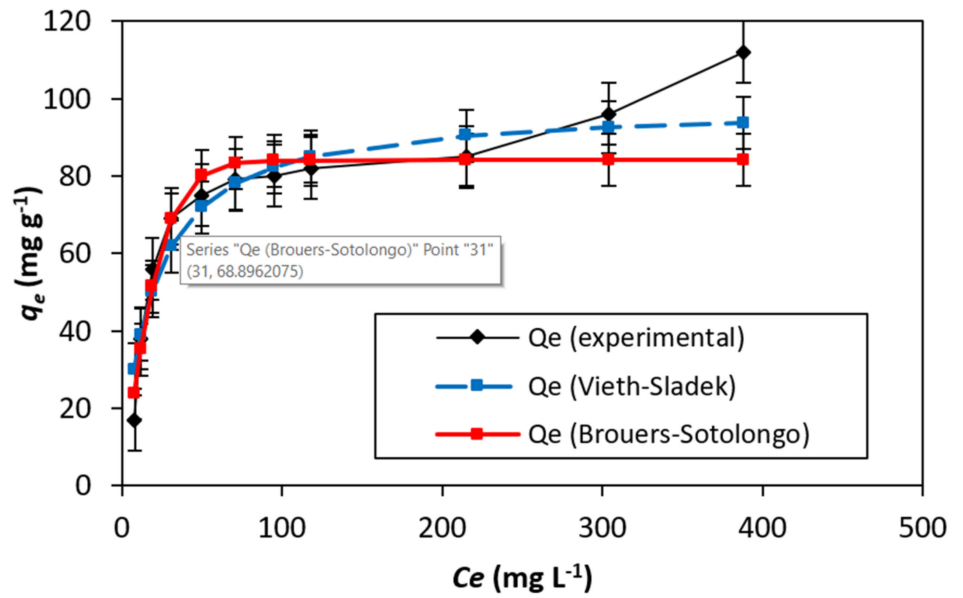


(a)

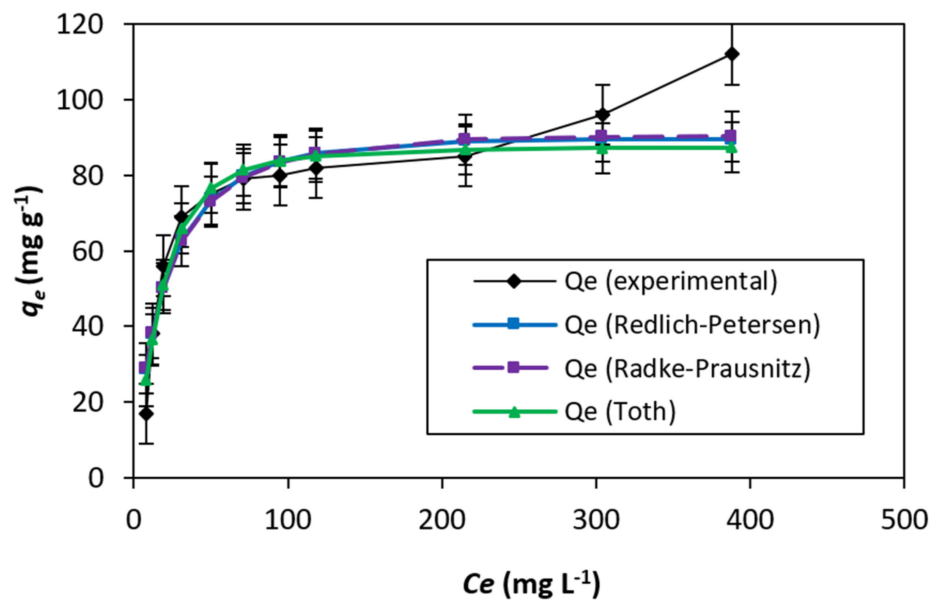


(b)

Figure 7. Cont.



(c)



(d)

Figure 7. (a–d) The curve fitting was conducted on adsorption data isotherm for DB15–HNT.

Table 2. Two-parameter isotherms.

Two Parameter Isotherms							
Langmuir	Freundlich		Jovanovic		Dubinin–Radushkevich		
$Q_m$	97.96	$K_F$	24.17	$Q_m$	85.67	$Q_s$	110.59
$K_S$	0.055	$n_F$	3.977	$K_J$	0.046	$K_{ad}$	$4.46 \times 10^{-5}$

Toth, Radke–Prausnitz, Vieth–Sladek, Redlich–Peterson, and Brouers–Sotolongo, were also studied [31]. To define a heterogeneous adsorption system, a mathematical correlation was developed by Toth [32]. Brouers–Sotolongo isotherm model [33] and the Vieth–Sladek

isotherm model [34], respectively. The results are presented in Figure 7c. Radke–Prausnitz isotherm model [35]. The Redlich–Peterson isotherm model [36], the a“g” value of 1.063 as a correction exponent showing similarity to the Langmuir isotherm (see Figure 7d).

Table 2 represents the results obtained with two-parameter isotherms, while, in Table 3, the parameters were calculated using three-parameter models. Finally, in Table 4, the curve-fitting results calculated for nine isotherm models are represented. Briefly speaking, the graphs plotted based on the nine models showed similar trends, including nonlinear and flat parts.

Table 3. Three-parameter isotherms.

Three-Parameter Isotherms									
Toth		Brouers–Sotolongo		Vieth–Sladek		Radke–Prausnitz		Redlich–Peterson	
$Q_m$	87.60	$Q_m$	84.00	$A_{RP}$	4.70	$Q_m$	114.80	$A_{RP}$	4.70
$n_{TO}$	1.876	$K_{BS}$	0.027	$B_{RP}$	0.034	$K_{rp}$	0.043	$B_{RP}$	0.034
$b_{TO}$	442.37	$\alpha$	1.21	$g$	1.06	$m_{rp}$	1.06	$g$	1.06

Table 4. Results of the curve fitting for isotherm models.

Isotherms	Langmuir	Freundlich	Jovanovic	Dubinin–Radushkevich	Toth	Brouers–Sotolongo	Vieth–Sladek	Radke–Prausnitz	Redlich–Peterson
SSE	321.3	1080.3	297.4	4324.3	227.2	281.7	321.3	306.4	296.9
$\chi^2$	12.14	40.80	8.02	67.55	6.42	5.59	12.14	10.79	10.15
$R^2$	0.94	0.80	0.94	0.97	0.96	0.95	0.94	0.94	0.95

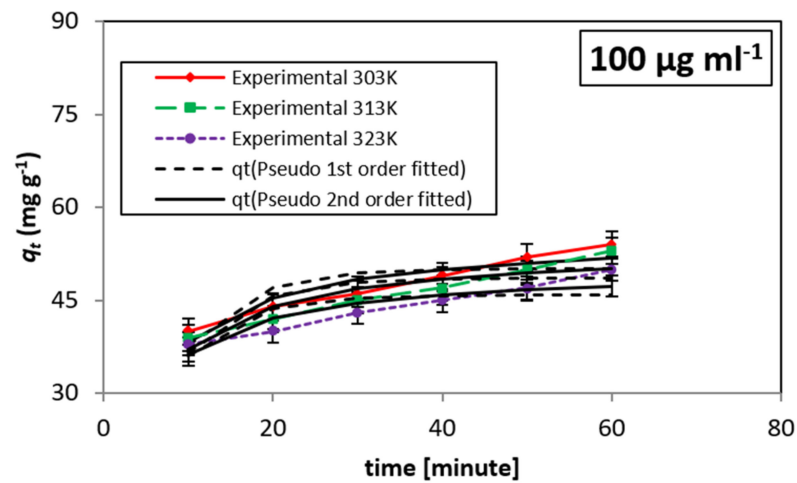
### 3.4. Adsorption Kinetics

To offer the difference in adsorption rate, the concentration of 100, 200, and 300 mg L<sup>-1</sup> of the DB15 dye was utilized to carry out kinetic studies at 303, 313, and 323 K. The used kinetics limitations are given in Table 5.

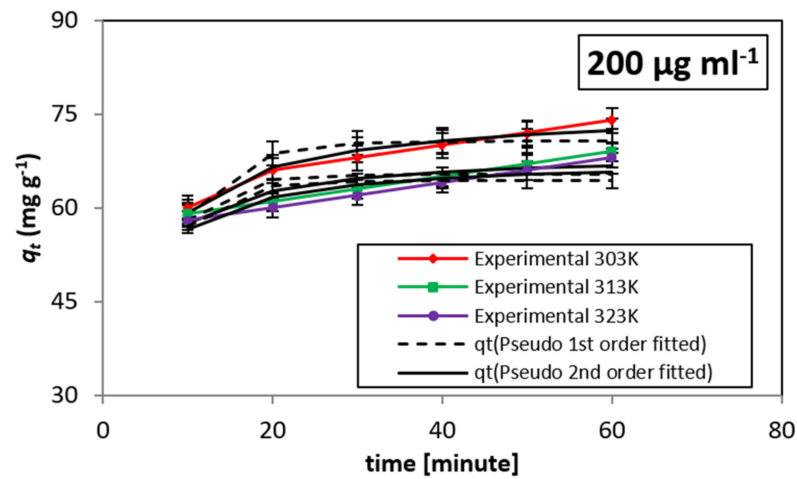
Table 5. Parameters used for adsorption kinetic models in the present research.

Initial Dye Concentration [µg mL <sup>-1</sup> ]	Temp [K]	Pseudo-First Order					Pseudo-Second Order				
		$q_{e,expt}$ [mg g <sup>-1</sup> ]	$q_{e,pred}$ [mg g <sup>-1</sup> ]	$k_1$	$R^2$	$\chi^2$	$q_{e,pred}$ [mg g <sup>-1</sup> ]	$k_2$	$R^2$	$\chi^2$	
100	303	60	50.18	$1.40 \times 10^{-1}$	0.68	0.96	55.64	$3.99 \times 10^{-3}$	0.87	1.72	
	313	57	48.58	$1.40 \times 10^{-1}$	0.63	1.10	53.92	$4.10 \times 10^{-3}$	0.84	0.46	
	323	55	45.89	$1.54 \times 10^{-1}$	0.58	0.98	50.40	$5.07 \times 10^{-3}$	0.81	0.42	
200	303	80	70.67	$1.79 \times 10^{-1}$	0.78	0.39	75.69	$4.78 \times 10^{-3}$	0.95	0.08	
	313	76	65.34	$6.53 \times 10^1$	0.51	0.54	65.88	$1.71 \times 10^{-3}$	0.76	1.65	
	323	73	64.35	$2.19 \times 10^{-1}$	0.51	0.54	67.94	$7.39 \times 10^{-3}$	0.80	0.22	
300	303	86	76.28	$2.39 \times 10^{-1}$	0.49	0.47	79.82	$7.72 \times 10^{-3}$	0.80	0.19	
	313	80	68.28	$2.97 \times 10^{-1}$	0.40	0.20	70.19	$1.54 \times 10^{-2}$	0.71	0.10	
	323	75	68.07	$3.04 \times 10^{-1}$	0.46	0.14	69.78	$1.70 \times 10^{-2}$	0.79	0.06	

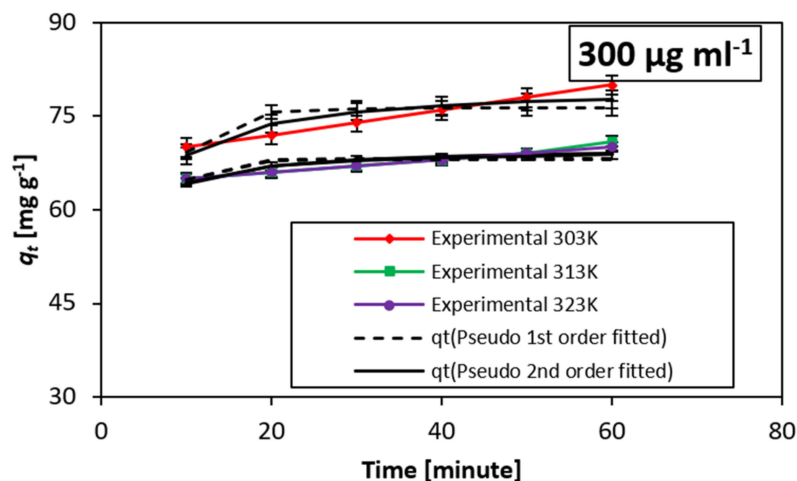
Figure 8 represents the results of the kinetic models developed for DB15. The kinetic data of adsorption of DB15 on minerals were analyzed using a pseudo-1st-order [37] and a pseudo-2nd-order [38].



(a)



(b)



(c)

Figure 8. (a–c) Kinetic model developed for DB15 dye on HNT system at different temperatures.

Examination of the kinetics data (Figure 8) represents raise in adsorption with an increase in adsorbent concentration. Similarly, the adsorption rate increases with time. However, it is realized that the rate of adsorption decreases as the temperature increases.

Thus, a high concentration of adsorbent studied for a longer time interval seems more favorable for future studies.

This was observed in the film diffusion model [39]. As described in Figure 9 and Table 6, the diffusion constant  $R'$  values of a liquid film are in good agreement with high  $R^2$  values. Furthermore, the values of  $R'$  infers, fast adsorption of solute on the atoms' exterior leaving a thin layer.

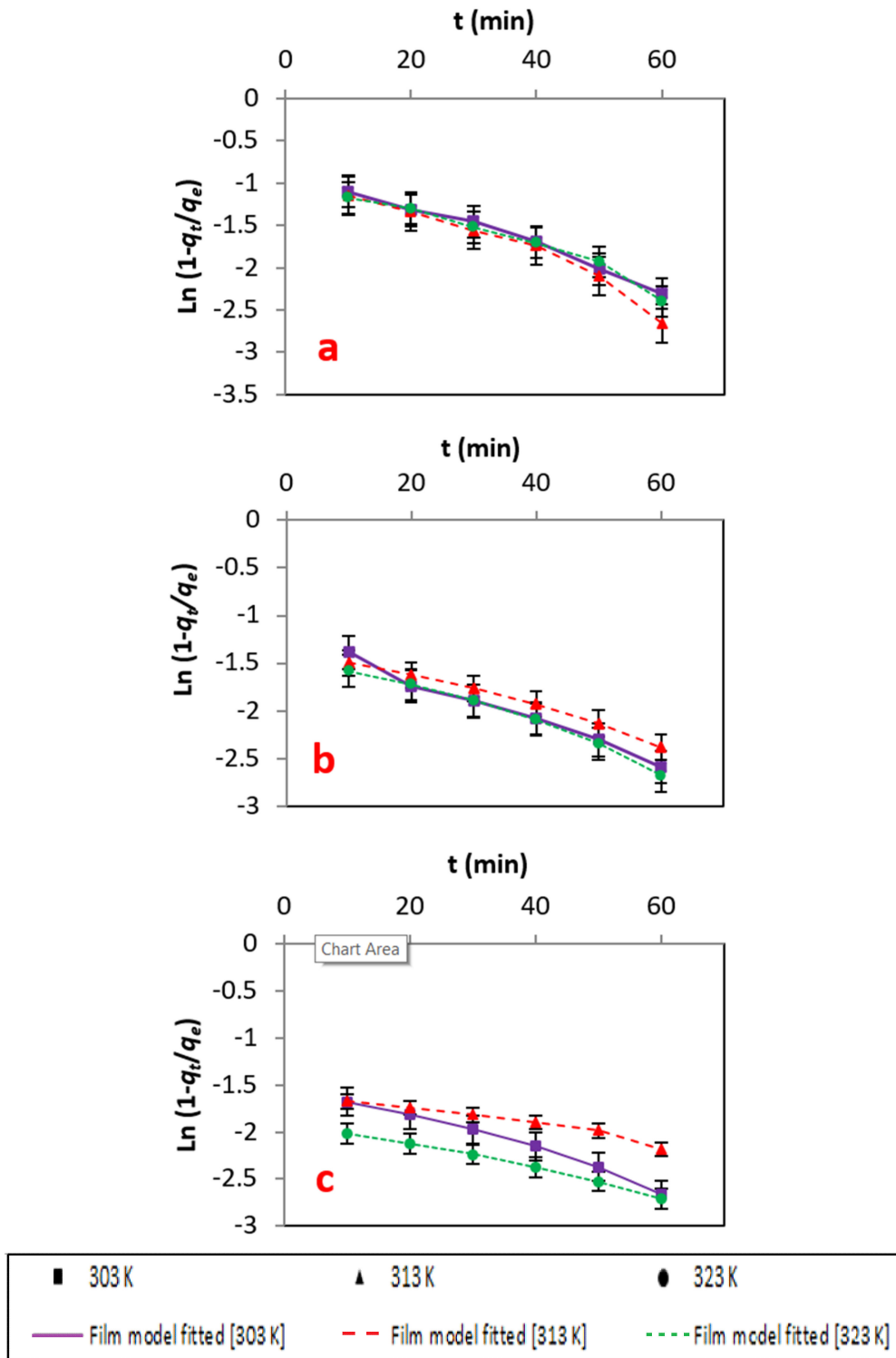


Figure 9. (a–c) Energy information fitted to the film diffusion model at different concentrations.

**Table 6.** The parameters used in the diffusion models.

Initial Dye Concentration [ $\mu\text{g mL}^{-1}$ ]	Temp [K]	Film Diffusion Model		Weber–Morris Model		Dumwald–Wagner	
		$R'$ [ $\text{min}^{-1}$ ]	$R^2$	$k_{id}$ [ $\text{mg g}^{-1} \text{s}^{-0.5}$ ]	$R^2$	$k$ [ $\text{min}^{-1}$ ]	$R^2$
100	303	0.0238	0.98	3.05	0.99	0.021	0.98
	313	0.0285	0.94	2.99	0.98	0.026	0.93
	323	0.0234	0.95	2.59	0.98	0.021	0.94
200	303	0.0225	0.99	2.89	0.98	0.021	0.99
	313	0.0175	0.98	2.18	0.98	0.016	0.98
	323	0.0216	0.97	2.18	0.98	0.020	0.97
300	303	0.0193	0.98	2.18	0.98	0.018	0.98
	313	0.0096	0.95	1.23	0.94	0.009	0.95
	323	0.0138	0.99	1.09	0.98	0.014	0.99

### 3.5. Mechanistic Study

In this section, mathematical models of adsorption reaction and adsorption diffusion are proposed to identify the contribution of the diffusion mechanism in the adsorption process of the DB15 dye by HNT. Results showed that the empirical affiliation of the acceptance of the substrate at a certain time  $q_t$  is comparable with  $t^{\frac{1}{2}}$ . This was carried out by fitting an intra-particle diffusion model. As presented, the process of adsorption is not rate-limiting, and the development of adsorption happens in numerous stages. Thus, it may be pictured that the movement of DB15 dye molecules onto the peripheral of HNT precedes the diffusion into the pores of HNT.

For the Weber–Morris model, the solute endorsement differs with  $t^{\frac{1}{2}}$ . As shown in Figure 10, a straight line was obtained when plotting  $q_t$  versus  $t^{\frac{1}{2}}$ . Hence, it can be concluded that intraparticle diffusion is the rate-limiting step for the process of adsorption of the dye on the adsorbent [37–39]. The results of this model can be seen in Figure 11 and Table 6.

### 3.6. Thermodynamics of the Adsorption Process

Gibbs free energy change ( $\Delta G^\circ$ ) and entropy ( $\Delta S^\circ$ ) of the dye–HNT classification is assessed in this section as two key thermodynamic parameters. In Table 7, the calculated thermodynamic parameters are presented. The outcome of  $\Delta G^\circ$  proposes that the adsorption method is almost spontaneous. The decline in the  $-^{\text{ve}}$  number of  $\Delta G^\circ$  with an increment in the temperature shows that the response is practically unconstrained at a low temp. The  $+^{\text{ve}}$  upsides of  $\Delta S^\circ$  show the arbitrariness of the dye/HNT interface. Figure 12 illustrates the (a) Determination of enthalpy and Gibbs free energy: plot of thermo-dynamic equilibrium constant against  $1/T$  and (b) Determination of activation energy: plot of pseudo-second order kinetic constant against  $1/T$ .

**Table 7.** Impact of temperature and beginning color focus on thermodynamic boundaries.

Initial Dye Concentration [ $\mu\text{g mL}^{-1}$ ]	Temp [K]	$\Delta G^\circ$ [ $\text{kJ mol}^{-1}$ ]	$\Delta S^\circ$ [ $\text{J mol}^{-1} \text{K}^{-1}$ ]	$\Delta H^\circ$ [ $\text{kJ mol}^{-1}$ ]	$\ln A$	$E_a$ [ $\text{kJ mol}^{-1}$ ]
100	303	−2.14	3.39	2.04	0.86	9.66
	313	−2.19				
	323	−2.31				
200	303	−1.22	5.68	3.31	1.72	16.64
	313	−1.24				
	323	−1.29				
300	303	−0.75	8.73	4.80	4.07	32.36
	313	−0.81				
	323	−0.87				

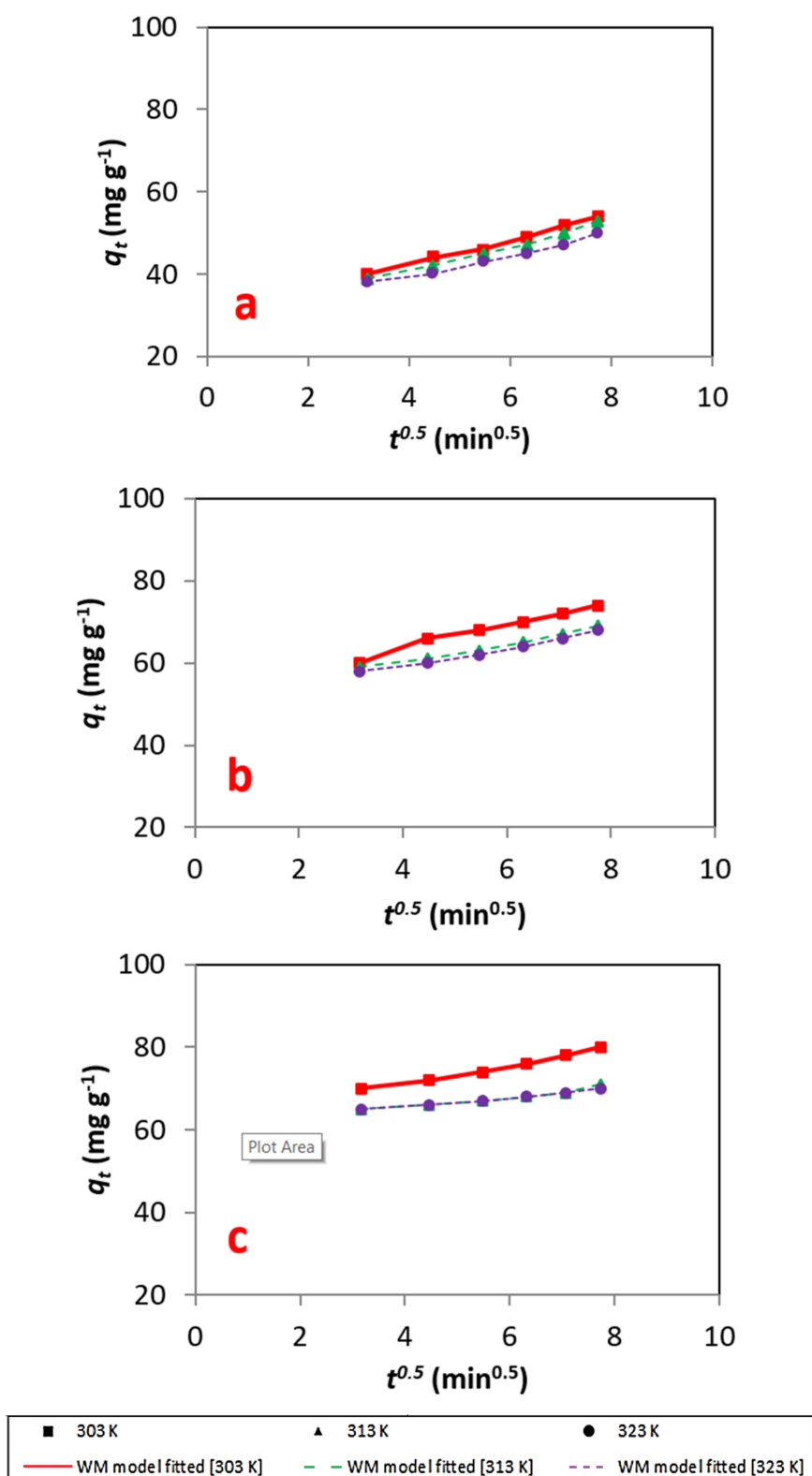


Figure 10. (a–c) Energy information fitted to the to the Weber–Morris model at different concentrations.

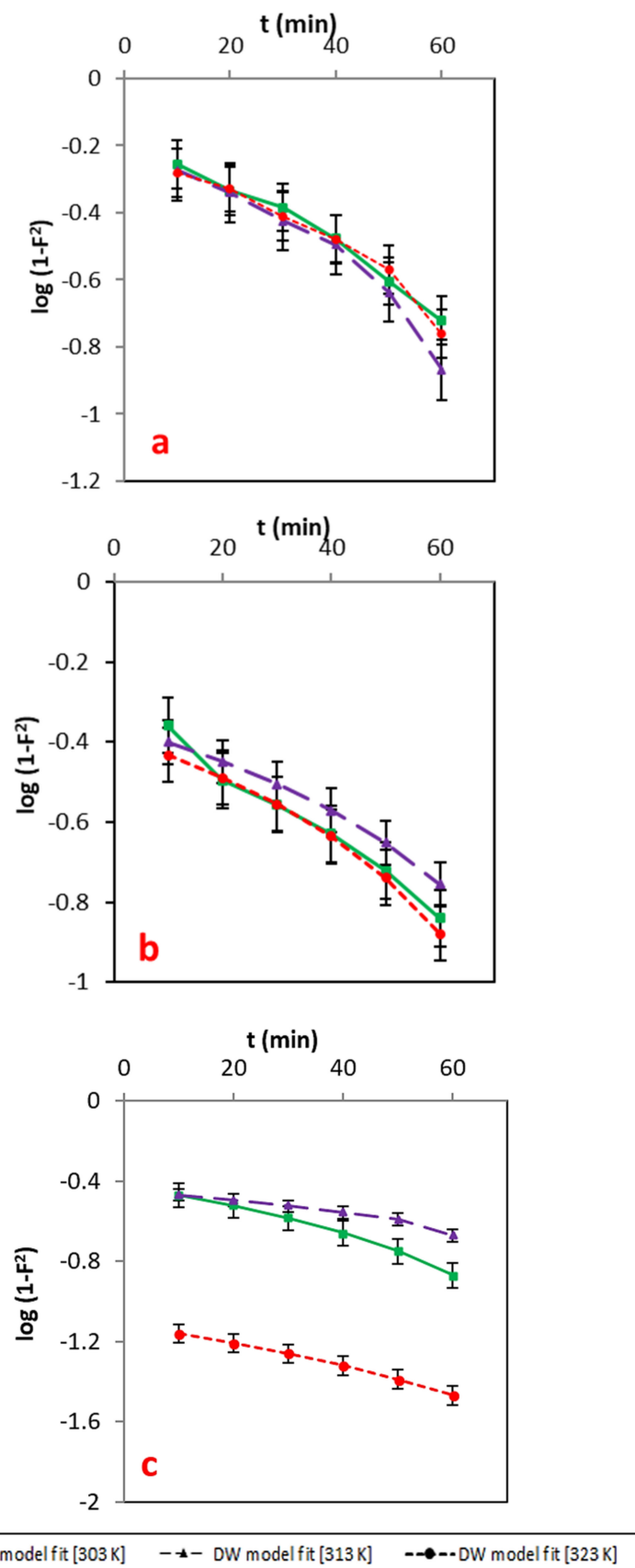
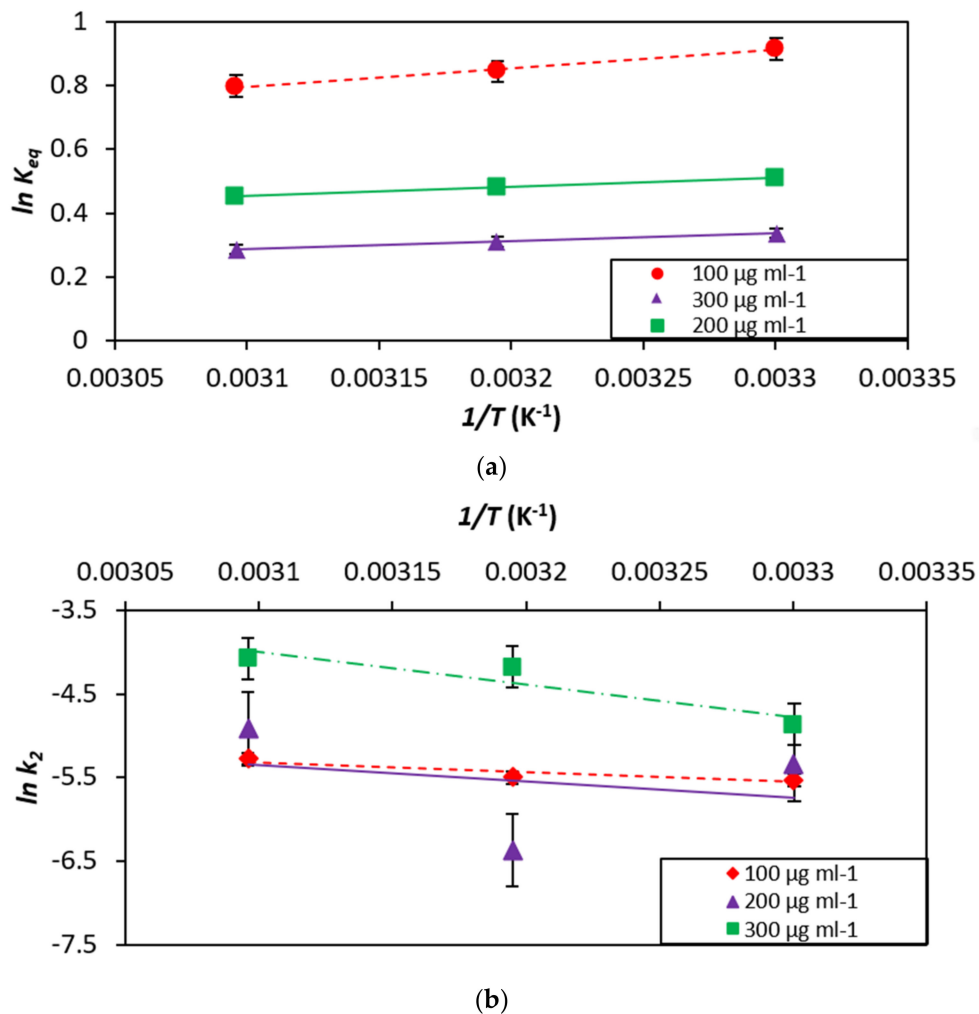


Figure 11. (a–c): Energy information fitted to the Dumwald–Wagner model at different concentrations.





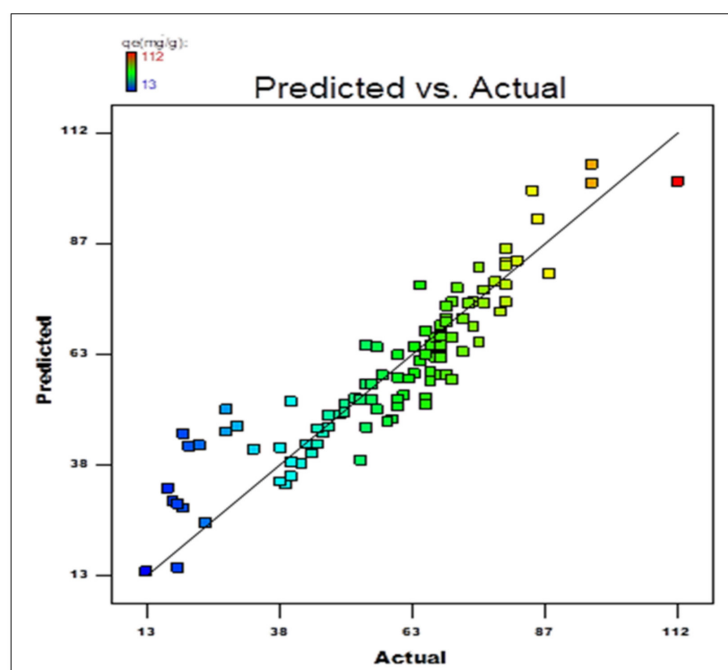
**Figure 12.** (a) Determination of enthalpy and Gibbs free energy: plot of thermodynamic equilibrium constant against  $1/T$  and (b) Determination of activation energy: plot of pseudo-second order kinetic constant against  $1/T$ .

### 3.7. Statistical Process Optimization

The process optimization was conducted using fractional factorial experimental design (FFED) under various combinations of five self-determining variables. The FEED analysis and the quadratic regression eq. obtained from ANOVA illustrate the probable specifics and combined effect of the factors for the DB15–HNT system [39–45]. For the ANOVA analysis, the  $p$ -value  $< 0.05\%$  with 95% assurance span was considered noteworthy [44–50].

The graphs in Figure 13 represent a strong correlation between the particle data and the responses calculated with the FFED model. In addition, A, C, D, A<sup>2</sup>, C<sup>2</sup>, D<sup>2</sup>, and E<sup>2</sup> are considerable model conditions for the DB15–HNT system. The regression Equation (1) obtained for DB15–HNT system is shown below:

$$\text{Response}_{\text{DB15-HNT}} = 42.1 + 18.5 \times A - 6.2 \times B + 19.5 \times C - 32.0 \times D - 13.4 \times E - 3.4 \times AB + 11.8 \times AC - 3.0 \times BC - 19.8 \times A^2 + 1.6 \times B^2 - 27.5 \times C^2 + 24.2 \times D^2 + 23.4 \times E^2 \quad (1)$$



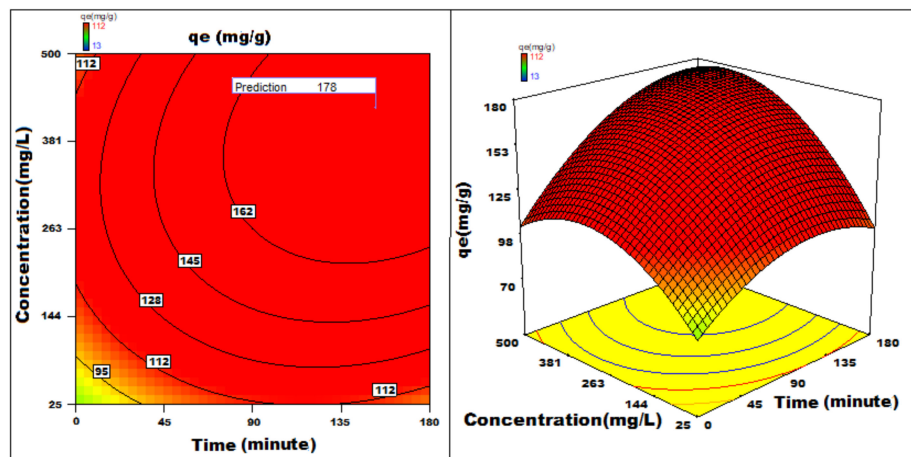
**Figure 13.** The calculated response against the experimental value obtained for adsorption capacity of DB15-HNT.

The regression coefficient [51–63] indicates the effect of various features affecting the adsorption capacity on the adsorption capacity [64–67]. The surface and contour plots represented in Figure 14 show the combined effect of two features on the process of adsorption. Statistical optimization experiment was  $112 \text{ mg g}^{-1}$  with conditions optimized pH = 1, the adsorbent dosage of  $0.5 \text{ g L}^{-1}$ , and an initial dye concentration of  $412 \text{ mg L}^{-1}$  for an adsorption time of 177 min with orbital shaking of 165 rpm at temperature  $20 \text{ }^{\circ}\text{C}$ .

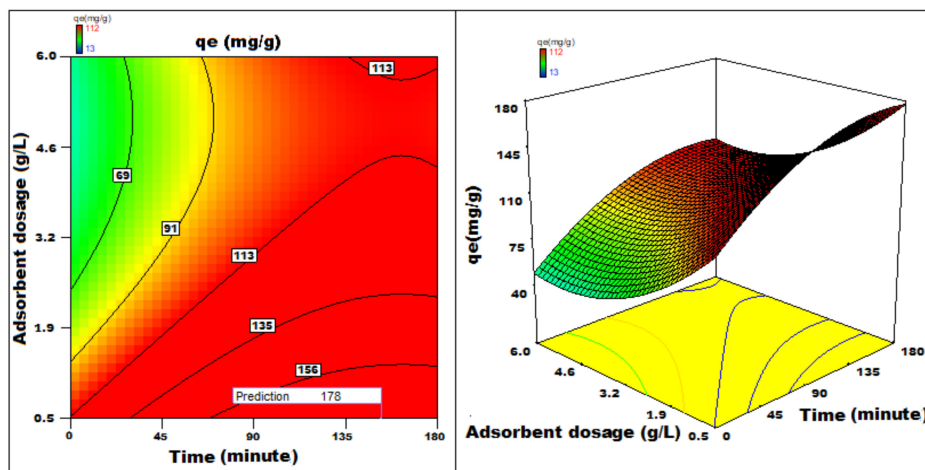
### 3.8. Adsorption Process for Textile Industrial Effluents

To measure the real-life performance of the prepared DB15, it was utilized to treat an industrial textile effluent (TIE) [66]. 0.1% (*w/v*) DB15 color arrangements were ready by dissolving 5 g of the color in 5L refined water (referred to as solution 1) and in 5 L TIE (referred to as Solution 2). Preliminary investigations were carried out to evaluate the effective parameters derived from optimization on the efficiency of the dye using aqueous matrices. It was observed that the addition of fresh samples at short intervals showed an effective treatment such that the adsorbent could amputate the dye along with the allied materials present in Solution 2.

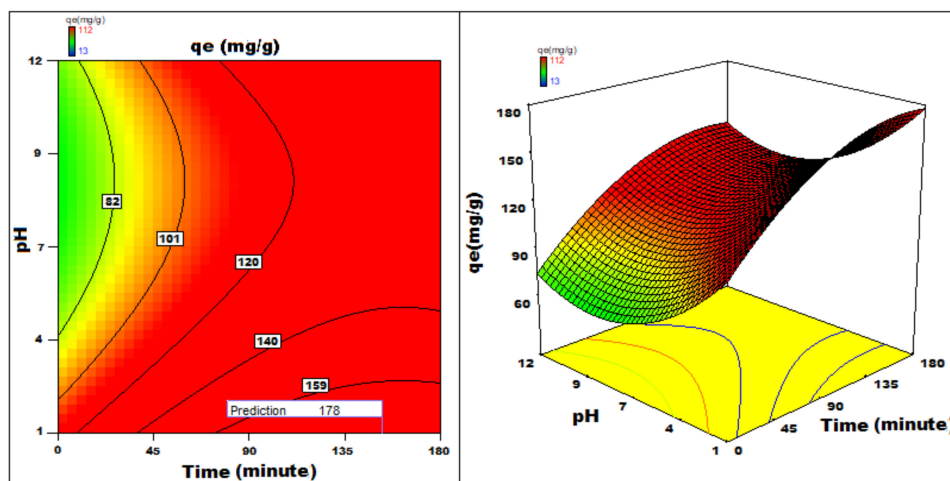
Figure 15 shows a visual comparison between distilled water, DB15 color in refined water, TIE arrangement, DB15 in TIE arrangement, and filtrate after the adsorption of color on HNT after 15 min.



(a)

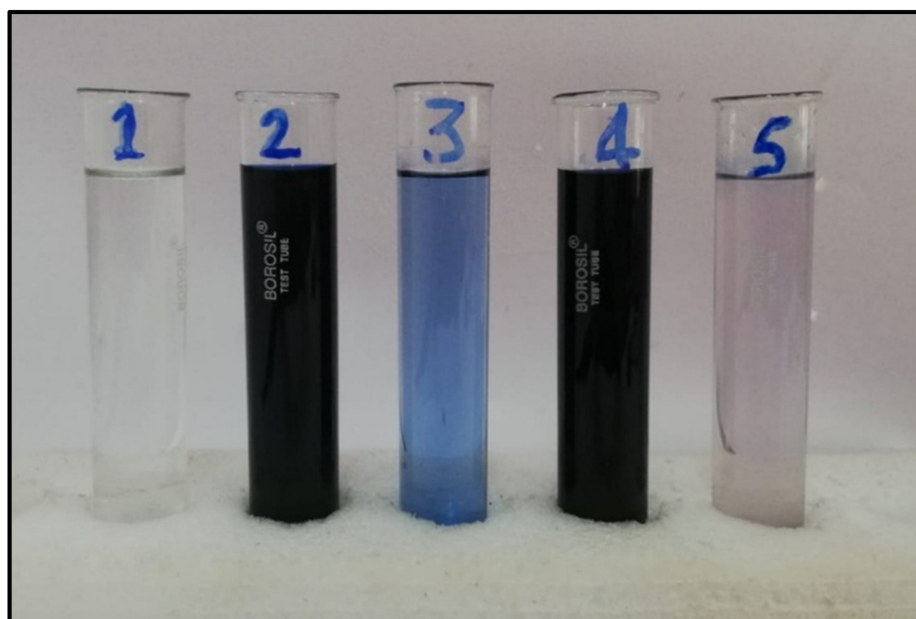


(b)



(c)

Figure 14. (a–c) 3D-surface plots and 2D-contour plots of variation of adsorption capacity with different parameters.



**Figure 15.** (1) Distilled water; (2) DB15 dye in distilled water; (3) TIE; (4) DB15 dye in TIE; (5) Filtrate after adsorption of dye on HNT after 15 min.

To scale up the experiments by one and two orders, 0.5 and 5.0 g each of the HNT was transferred to 1L and 10L polyethylene beakers. Next, 500 mL and 5 L Solution 2 was added to 1 L and 10L polyethylene beakers, respectively. Using a magnetic stirrer, the solutions were agitated. The procedure was repeated as described earlier [64–67].

#### 4. Conclusions

The adsorption process is a dynamic phenomenon, and various factors seem to influence the remediation process synergistically. The study sets a new roadmap for the applied science by amalgamating the experimental analysis with in-depth modeling for an effective outcome. The connections among HNT as the adsorbent and DB15 color as the adsorbate displayed a test harmony ( $q_e$ ) worth  $96.00 \text{ mg g}^{-1}$  at pH 2,  $69.00 \text{ mg g}^{-1}$  at a practically unbiased pH, and  $112 \text{ mg g}^{-1}$ , which was obtained via statistical optimization. To further understand the process of adsorption, nine isotherm models were studied. The adsorption follows Brouers–Sotolongo model, and the interactions between HNT and DB15 were identified to be physical in nature, following the pseudo-second-order kinetics. The contact time, dye concentration and dosage, and initial pH were the effective operating parameters influencing the adsorption. Based on the positive outcomes of the statistical optimization studies, the current work was tested at a laboratory scale for the application perspective. It was also demonstrated that the dye modified HNT has the potential to treat effluents from the textile industry. Furthermore, the current case study of the DB15 dye being adsorbed on the lucrative halloysite nanotubes sets a benchmark for remediation. Any given dye can be tested for its remediation purpose by choosing adsorbate material such as HNT. It would lead to a sustainable approach for tackling the current market demands. This study further bolsters the adsorption process by concretizing the need for modeling studies right from the laboratory scale to an industrial scale for process optimization. Thus, the work attracts researchers from various fields to address the current social/market needs by implementing green chemistry and green engineering principles for a sustainable environment.

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support, review and editing, A.E. and E.M.E.; visualization, M.I.H.S.; supervision, M.R.S. and M.G.; project administration, M.G. and H.M.A.; and funding acquisition, A.E.A. and E.M.E. All authors have read and agreed to the published version of the manuscript.

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