



## Review

# Application of the kinetic and isotherm models for better understanding of the behaviors of silver nanoparticles adsorption onto different adsorbents

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## ABSTRACT

It is the first time to do investigation the reliability and validity of thirty kinetic and isotherm models for describing the behaviors of adsorption of silver nanoparticles (AgNPs) onto different adsorbents. The purpose of this study is therefore to assess the most reliable models for the adsorption of AgNPs onto feasibility of an adsorbent. The fifteen kinetic models and fifteen isotherm models were used to test secondary data of AgNPs adsorption collected from the various data sources. The rankings of arithmetic mean were estimated based on the six statistical analysis methods of using a dedicated software of the MATLAB Optimization Toolbox with a least square curve fitting function. The use of fractal-like mixed 1, 2-order model for describing the adsorption kinetics and that of Fritz-Schlunder and Baudu models for describing the adsorption isotherms can be recommended as the most reliable models for AgNPs adsorption onto the natural and synthetic adsorbent materials. The application of thirty models have been identified for the adsorption of AgNPs to clarify the usefulness of both groups of the kinetic and isotherm equations in the rank order of the levels of accuracy, and this significantly contributes to understandability and usability of the proper models and makes to knowledge beyond the existing literatures.

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## Contents

1. Introduction .....	60
2. Materials and methods .....	61
2.1. Data collection .....	61
2.2. Numerical simulation .....	61
2.2.1. Adsorption kinetic models .....	61
2.2.2. Adsorption isotherm models .....	62
2.3. Error analysis for application of the kinetic and isotherm models .....	63
3. Results and discussion .....	64
3.1. Results .....	64
3.1.1. Adsorption of AgNPs on glass beads .....	64
3.1.2. Adsorption of AgNPs on aged iron oxide magnetic particles .....	64
3.1.3. Adsorption of AgNPs on Fe <sub>3</sub> O <sub>4</sub> @ polydopamine core-shell microspheres .....	65

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3.1.4.	Adsorption of AgNPs on Poly(ethylenimine) functionalized core-shell magnetic	65
3.1.5.	Adsorption of AgNPs on <i>Aeromonas punctata</i>	65
3.2.	Discussion	66
3.2.1.	Application of the adsorption kinetic models	66
3.2.2.	Application of the adsorption isotherm models	66
4.	Conclusions	68
	Conflict of interest	69
	Acknowledgements	69
	Supplementary data	69
	References	69

## 1. Introduction

Silver nanoparticles (AgNPs) have been widely used in many industrial applications due to they have many advantageous properties of such as antibacterial, antifungal, antiviral, anti-inflammatory, anti-angiogenic and anticancer agents, as well as high electrical conductivity and high sensitivity (Desireddy et al., 2013; Kumar et al., 2008; Le Ouay and Stellacci, 2015; Naik et al., 2002; Park et al., 2012; Zhang et al., 2016). However, the excessive amount of AgNPs released from industrial products of such as detergents, textiles, toys, cosmetics and medical devices can have the potential to cause the risks to human health and the environment because of its antimicrobial effects and subsequent product applications, and the presence of AgNPs in the environment poses undesirable effects on plants of being inhibited seed germination and growth and has substantial adverse to microbial communities in engineered or natural ecosystems (Chen et al., 2017; Quadros and Marr, 2010; Tripathi et al., 2017). The content of AgNPs released from industrial products becomes more important and concerned in many countries because it can cause toxicity to aquatic biota near sources such as sewage discharges.

Adsorption found to be effective and cheap method among the available heavy metals removal methods and has been widely used to remove AgNPs from water. The use of nitrogen rich core-shell magnetic mesoporous silica as adsorbent has been proven to be effective for the removal of AgNPs from water with an adsorption capacity of 909.1 mg g<sup>-1</sup> (Zhang et al., 2017). The use of glass beads as adsorbent can remove up to 75% of AgNPs (Polowczyk et al., 2015). The use of aged iron oxide magnetic particles synthesized by a simple solvothermal method can remove up to 90% of AgNPs for a contact time of 90 min (Zhou et al., 2017). The elimination of AgNPs from synthetic wastewater by electrocoagulation has been proven to be effective by using four different routes (Matias et al., 2015).

Many theoretical and empirical models have been proposed for describing mechanisms of AgNPs adsorption from aqueous solution. However, the report provides practical guidance for choosing an appropriate method by comparing two, three or four models only. Four kinetic models of Lagergren pseudo-first-order, pseudo-second-order, Elovich and intraparticle diffusion have been tested for modeling the adsorption kinetics of AgNPs from aqueous solution to justify that two-parameter equations of pseudo-second-order showed more applicability than six-parameter equations of pseudo-first-order, Elovich and intraparticle diffusion (Ruíz-Baltazar et al., 2015). Application of four kinetics models and three isotherm models has been proposed for simulating the experimental data of AgNPs adsorption onto different adsorbents to show that all the data can have a better fit for both the kinetic model of pseudo-second-order and the isotherm model of Langmuir (Zhou et al., 2017). Two kinetic models (i.e., pseudo-first-order and pseudo-second-order) and three isotherm models (i.e.,

Dubinin-Radushkevich, Freundlich and Langmuir) have been proposed to test the experimental data of AgNPs adsorption and confirmed that using the pseudo-second-order and Langmuir models can get more accurate estimates of the parameter equations (Wu et al., 2017). The use of two kinetic models (i.e., pseudo-first-order and pseudo-second-order) and two isotherm models (i.e., Freundlich and Langmuir) has been used to simulate the experimental data of AgNPs adsorption to show that the most reliable estimates of the parameter equations were found with the pseudo-second-order and Langmuir models (Zhang et al., 2017). The use of Langmuir model has been proven to be better than that of Freundlich model for describing the adsorption of AgNPs on the surface of sodium montmorillonite nanoclays (Zarei and Barghak, 2015). Three models of pseudo-first-order, pseudo-second-order and Langmuir have been used to explain many observations in adsorption of AgNPs on the surface of a natural material of added *Aeromonas punctata* strain to show that the experimental data were fit well with the Langmuir and pseudo-second-order models (Khan et al., 2012). Modeling of experimental data for the adsorption of AgNPs from aqueous solution using the copper-based metal organic framework nanoparticles would fit well with the pseudo-second-order and Langmuir models, and the Langmuir isotherm does describe equilibrium behavior better than the Freundlich isotherm due to the adsorption does not continue beyond a monolayer (Conde-González et al., 2016). However, the experimental data for the adsorption of AgNPs on commercial activated carbon showed that the Freundlich isotherm can describe equilibrium behavior better than the Langmuir isotherm because of the adsorption continues beyond a monolayer (Gicheva and Yordanov, 2013). The conclusions obtained from different studies did show that the usefulness of statistical tests in model validation for the adsorption of AgNPs on the surface of a material is very limited.

The interpretation of adsorption isotherms has been reviewed for the applications of one one-parameter isotherm of Henry's model, thirteen two-parameter isotherms of Hill-Deboer, Fowler-Guggenheim, Langmuir, Freundlich, Dubinin-Radushkevich, Temkin, Flory-Huggins, Hill, Hasley, Harkin-Jura, Jovanovic, Elovich and Kiselev models, eight three-parameter isotherms of Redlich-Peterson, Sips, Toth, Koble-Carrigan, Kahn, Radke-Prausnits, Langmuir-Freundlich and Jossens models, four four-parameter isotherms of Fritz-Schlunder, Baudu, Weber-Van Vliet and Marczewski-Jaroniec models, and one five-parameter isotherm model developed by Fritz and Schlunder whereas the error analysis was performed using the nine methods of Sum of Square of Errors (ERRSQ), Hybrid Fractional Error Function (HYBRID), Average Relative Error (ARE), Marquardt's Percent Standard Deviation (MPSD), Sum of Absolute Errors (EABS), Sum of Normalized Errors (SNE), Coefficient of Determination ( $R^2$ ), Nonlinear Chi-Square Test ( $X^2$ ), Coefficient of Nondetermination ( $1.00 - R^2$ ). This review concludes that the level of accuracy would be dependent on the successful modeling and interpretation of adsorption isotherms

(Ayawei et al., 2017). Even if the mass transfer factor (MTF) models to describe the adsorption kinetics of AgNPs solely in water (Fulazzaky, 2011, 2012) and the modified MTF models to describe the adsorption kinetics of AgNPs accompanied with multifarious solute in water (Fulazzaky et al., 2013, 2014; 2017) have not been used to possibly distinguish between the film mass transfer and the porous diffusion and to determine the resistance of mass transfer, it could be a challenge of verifying the possibility of using many other mathematical models to understand the behaviors of AgNPs adsorption. The aim of this study was to evaluate the use of fifteen kinetic models and that of fifteen isotherm models for describing the behaviors of AgNPs adsorption onto different adsorbents from aqueous solution. In the present work, the use of dedicated software program of the MATLAB Optimization Toolbox with a least square curve fitting (lsqcurvefit) function can be used as a framework to systematically manipulate and compare the application of six statistical methods of analysis toward a better understanding on the adsorption behaviors of AgNPs.

## 2. Materials and methods

### 2.1. Data collection

The data of AgNPs adsorption provided by secondary data sources were used as input to a numerical simulation process. The biological and non-biological adsorbent materials were all considered being testable in this study. The experimental data of AgNPs adsorption onto the synthetic materials of glass beads (GB) collected by Polowczyk et al. (2015), aged iron oxide magnetic particles (AIOMP) collected by Zhou et al. (2017), Fe<sub>3</sub>O<sub>4</sub>@ polydopamine core-shell microspheres (FPC) collected by Wu et al. (2017) and poly (ethylenimine) functionalized core-shell magnetic mesoporous silica composites (PFC) collected by Zhang et al. (2017) as well as those onto the natural (biological) material of using the strains of *Aeromonas punctata* (AP) collected by Khan et al. (2012) were reviewed to assess the reliability of a model and to compare different models.

### 2.2. Numerical simulation

#### 2.2.1. Adsorption kinetic models

This study used the fifteen kinetic models to assess the behaviors of AgNPs adsorption onto different materials. To date, some of these models have been used as systemic approaches to simulate the secondary data (Khan et al., 2012; Polowczyk et al., 2015; Wu et al., 2017; Zhang et al., 2017; Zhou et al., 2017) in spite of many other models such as the MTF and modified MTF models (Fulazzaky, 2011, 2012; Fulazzaky et al., 2013, 2014; 2017) are still not considered for the analysis of the data.

In this work, the first-order model as proposed by Gupta et al. (2001) for dynamic modeling of lead and chromium removal from aqueous solution on red mud was used to assess the reasonableness of accounting its two-parameter equations and this can be mathematically written as follows:

$$q_t = q_e - \exp(-k_1 t) \quad (1)$$

where  $q_t$  is the adsorption capacity ( $\text{mg g}^{-1}$ ) at time  $t$  (min),  $q_e$  is the adsorption capacity at equilibrium ( $\text{mg g}^{-1}$ ), and  $k_1$  is the first-order rate constant ( $\text{min}^{-1}$ ).

The Ritchie second-order model has been used to describe the adsorption of cadmium ions from effluents using bone char (Cheung et al., 2001) and can be mathematically formulated (Cheung et al., 2001; Khambhaty et al., 2009) as:

$$q_t = \frac{q_e}{1 + q_e k_2 t} \quad (2)$$

where  $k_2$  is the second-order rate constant ( $\text{min}^{-1}$ ).

The pseudo-first-order model, firstly proposed by Lagergren (1898) to describe the kinetic process of liquid-solid phase adsorption of oxalic acid and malonic acid onto charcoal and then used by Ho and McKay (1998a) to describe the pseudo-first order sorption kinetics of phosphate onto tamarind nut shell activated carbon, can be mathematically written as the following formula:

$$q_t = q_e [1 - \exp(-k_{p1} t)] \quad (3)$$

where  $q_e$  is the adsorption capacity at equilibrium ( $\text{mg g}^{-1}$ ), and  $k_{p1}$  is the pseudo-first-order rate constant ( $\text{min}^{-1}$ ).

A kinetic model of the pseudo-second-order as proposed by Ho and McKay (1998b) to describe the chemisorption of divalent metal ions onto peat may be used to compare protocols and tests and this can be expressed as follows:

$$q_t = \frac{k_{p2} q_e^2 t}{1 + k_{p2} q_e t} \quad (4)$$

where  $k_{p2}$  is the pseudo-second-order rate constant ( $\text{min}^{-1}$ ).

The intraparticle diffusion model (Plazinski and Rudzinski, 2009) to describe the transportation of species from the bulk to solid phase of porous material in solution may take the following form:

$$q_t = k_{ip} \sqrt{t} + c_{ip} \quad (5)$$

where  $k_{ip}$  is the measure of diffusion coefficient ( $\text{mg g}^{-1} \text{min}^{-1/2}$ ) and  $c_{ip}$  is the intraparticle diffusion constant ( $\text{mg g}^{-1}$ ).

A power model of describing the adsorption behaviors as proposed by Khambhaty et al. (2009) can be mathematically written as follows:

$$q_t = k_p t^{v_p} \quad (6)$$

where  $k_p$  and  $v_p$  are the power constants of the model.

The Avrami's model to describe the kinetics of phase transformation under the assumption of spatially random nucleation has been used for assessing the adsorption of either methylene blue or Hg(II) from aqueous solution (Lopes et al., 2003; Royer et al., 2009) and can be expressed by the following equation:

$$q_t = q_e [1 - \exp(-k_{av} t)^{n_{av}}] \quad (7)$$

where  $k_{av}$  the Avrami rate constant ( $\text{min}^{-1}$ ) and  $n_{av}$  is the Avrami component (dimensionless).

The Bangham model has been used to describe the adsorption of anionic and cationic dyes on activated carbon from aqueous solution (Rodríguez et al., 2009) and can be written in the form of:

$$q_t = k_b t^{1/m} \quad (8)$$

where  $k_b$  is the adsorption rate constant ( $\text{mg g}^{-1} \text{min}^{-1}$ ) and  $m$  is the indicator of adsorption intensity (dimensionless).

A kinetic model derived from the pseudo-first-order and pseudo-second-order called the mixed 1, 2-order model as proposed by Marczewski (2010) to assess the kinetics of dye adsorption onto mesoporous carbons from aqueous solution can be proposed in this work to assess the behaviors of AgNPs adsorption. The formula of the mixed 1, 2-order model can be written as follows:

$$q_t = q_e \frac{1 - \exp(-kt)}{1 - f_2 \exp(-kt)} \quad (9)$$

where  $f_2$  is the mixed 1,2-order coefficient (dimensionless) and  $k$  is the adsorption rate constant ( $\text{mg g}^{-1} \text{min}^{-1}$ ).

An exponential form of the kinetic equation (Haerifar and Azizian, 2013) can be used to describe the pattern of adsorption rate with time where its mathematical equation can be written in the following form:

$$q_t = q_e \ln[2.72 - 1.72 \exp(-k_e t)] \quad (10)$$

where  $k_e$  is the constant of the exponential model ( $\text{mg g}^{-1} \text{min}^{-1}$ ).

A modified exponential model called as the fractal-like exponential model has been proposed by Haerifar and Azizian (2013) for the adsorption on heterogeneous solid surface and can be written in the form of:

$$q_t = q_e \ln[2.72 - 1.72 \exp(-k_{fle} t^\alpha)] \quad (11)$$

where  $k_{fle}$  is the fractal-like exponential rate coefficient ( $\text{mg g}^{-1} \text{min}^{-1}$ ) and  $\alpha$  is the constant of the model (dimensionless).

The Boyd's model as proposed by Kumar et al. (2014) to predict the actual slowest step in the adsorption process and by Viegas et al. (2014) for estimating intraparticle diffusion coefficients in adsorption processes can be used to assess the behaviors of AgNPs adsorption and this can be expressed as:

$$q_t = q_e \left[ 1 - \frac{6}{\pi^2} \exp(-Bt) \right] \quad (12)$$

where  $B$  is the coefficient that covers the effective diffusion process and radius of the particles ( $\text{min}^{-1}$ ).

A modification of the pseudo-first-order model called as the Fractal-like pseudo-first-order model has been proposed by Haerifar and Azizian (2014) to introduce the fractal concept and can be written as:

$$q_t = q_e \left[ 1 - \exp(-k_{ffo} t^\alpha) \right] \quad (13)$$

where  $k_{ffo}$  is the fractal-like pseudo-first-order coefficient ( $\text{mg g}^{-1} \text{min}^{-1}$ ) and  $\alpha$  is the fractal-like pseudo-first-order model constant.

A modification of the pseudo-second-order model called as the fractal-like pseudo-second-order model proposed by Haerifar and Azizian (2014) to introduce the fractal concept can be mathematically written as:

$$q_t = \frac{k_{fso} q_e^2 t^\alpha}{1 + k_{fso} q_e t^\alpha} \quad (14)$$

where  $k_{fso}$  is the fractal-like pseudo-second-order coefficient ( $\text{mg g}^{-1} \text{min}^{-1}$ ) and  $\alpha$  is the fractal-like pseudo-second-order model constant.

A modification of the mixed 1, 2-order model called as the fractal-like mixed 1, 2-order model proposed by Haerifar and Azizian (2014) to introduce the fractal concept can be written in the mathematical expression of:

$$q_t = q_e \frac{1 - \exp(-k_{ffs} t^\alpha)}{1 - f_2 \exp(-k_{ffs} t^\alpha)} \quad (15)$$

where  $k_{ffs}$  is the fractal-like mixed 1, 2-order coefficient ( $\text{mg g}^{-1} \text{min}^{-1}$ ) and  $\alpha$  and  $f_2$  are the fractal-like mixed 1, 2-order model

constants.

### 2.2.2. Adsorption isotherm models

To do a computation of performance of an adsorption system for selecting the most appropriate model, this study used the fifteen isotherm models to assess the behaviors of AgNPs adsorption onto different materials.

The Langmuir model proposed by Langmuir (1918) has been widely used to describe the adsorption occurred on homogenous surface by monolayer sorption with a finite number of identical sites such as for the adsorption of 2,4,6-trichlorophenol on coconut husk-based activated carbon (Hameed et al., 2008) and this can be mathematically expressed as:

$$q_e = \frac{K_L q_m C_e}{1 + K_L C_e} \quad (16)$$

where  $q_e$  is the adsorption capacity at equilibrium ( $\text{mg g}^{-1}$ ),  $q_m$  is the maximum adsorption capacity per unit weight of the adsorbent ( $\text{mg g}^{-1}$ ),  $C_e$  is the concentration of adsorbate at equilibrium ( $\text{mg L}^{-1}$ ) and  $K_L$  is the Langmuir constant relating the affinity of the binding sites ( $\text{L mg}^{-1}$ ).

The Freundlich model empirically developed by Freundlich (1906) would be suitable to describe sorption of several compounds to heterogeneous surfaces or surfaces supporting sites of varied affinities, assuming that stronger binding sites are occupied first and then binding strength decreases with increasing degree of site occupation (Silva et al., 2013), and can be expressed in the form of:

$$q_e = K_f C_e^{1/n} \quad (17)$$

where  $K_f$  is the Freundlich constant relating the sorption capacity ( $\text{L g}^{-1}$ ) and  $n$  is the sorption intensity of adsorbent (dimensionless).

The Langmuir-Freundlich models would be suitable for describing both types of Langmuir and Freundlich adsorption isotherm (Jeppu and Clement, 2012) and can be written as:

$$q_e = \frac{q_m (K_a C_e)^n}{1 + (K_a C_e)^n} \quad (18)$$

where  $K_a$  is the affinity constant representing the degree of adsorption ( $\text{L mg}^{-1}$ ) and  $n$  is the heterogeneity index.

The Redlich-Peterson model offers a compromise between two isotherm models of Langmuir and Freundlich by assuming the mechanism of adsorption is a hybrid and does not follow ideal monolayer adsorption (Wang et al., 2005) and can be formulated as follows:

$$q_e = \frac{K_{RP} C_e}{1 + a_{RP} C_e^b} \quad (19)$$

where  $K_{RP}$  and  $a_{RP}$  are the Redlich-Peterson isotherm constants ( $\text{L g}^{-1}$ ) and  $b$  is the exponent that lies between 0 and 1.

The Toth model as empirical modification of the Langmuir model aims of reducing the error between experimental data and predicted values of equilibrium data (Ayawei et al., 2017; Sivarajasekar and Baskar, 2014) and can be written as:

$$q_e = \frac{q_m C_e}{(K_T + C_e^{n_T})^{n_T}} \quad (20)$$

where  $K_T$  is the Toth isotherm constant ( $\text{mg g}^{-1}$ ) and  $n_T$  is the Toth model exponent ( $\text{mg g}^{-1}$ ).

The Khan isotherm model has been used to describe the

experimental data with the minimum average percentage error for the adsorption of some pollutants from aqueous solutions by comparing several multicomponent adsorption isotherms (Ayawei et al., 2017; Khan et al., 1997) and can be expressed in the generalized mathematical expression of:

$$q_e = \frac{q_m b_K C_e}{(1 + b_K C_e)^{a_K}} \quad (21)$$

where  $b_K$  is the Khan isotherm constant ( $L\ mg^{-1}$ ) and  $a_K$  is the Khan isotherm model exponent.

The Jovanovic model developed based on the assumptions contained in the Langmuir model with the possibility of some mechanical contacts between the adsorbing and desorbing molecules (Ayawei et al., 2017; Shahbeig et al., 2013) and can be formulated as follows:

$$q_e = q_m [1 - \exp(-K_J C_e)] \quad (22)$$

where  $K_J$  is the Jovanovic constant ( $L\ g^{-1}$ ).

The Koble-Corrigan model proposed by Koble and Corrigan (1952) as a three-parameter equation of isotherm model which incorporates both Langmuir and Freundlich isotherms for representing equilibrium data of adsorption on heterogeneous surfaces (Ayawei et al., 2017; Shahbeig et al., 2013) and can be represented by the following formula:

$$q_e = \frac{q_m a C_e^d}{1 + b C_e^d} \quad (23)$$

where  $a$ ,  $b$ , and  $d$  are the Koble-Corrigan isotherm constants.

The Rake-Prausnitz model developed based on the concept of thermodynamic ideal solution by Radke and Prausnitz (1972) has several important properties which makes it more preferred in most adsorption systems to low adsorbate concentration (Ayawei et al., 2017; Sivarajasekar and Baskar, 2014) and can be expressed as:

$$q_e = \frac{q_m a_{RP} C_e}{[1 + a_{RP} C_e]^{n_{RP}}} \quad (24)$$

where  $a_{RP}$  is the Radke-Prausnitz equilibrium constant ( $L\ mg^{-1}$ ) and  $n_{RP}$  is the Radke-Prausnitz model exponent.

The Fritz-Schlunder model proposed by Fritz and Schlunder (1974) as an empirical equation can fit a wide range of experimental data (Ayawei et al., 2017) and can be expressed as follows:

$$q_e = \frac{a_{FS} C_e^{c_{FS}}}{1 + b_{FS} C_e^{d_{FS}}} \quad (25)$$

where  $a_{FS}$  and  $b_{FS}$  are the Fritz-Schlunder equilibrium constants ( $L\ g^{-1}$ ) and  $c_{FS}$  and  $d_{FS}$  are the Fritz-Schlunder model exponents.

The Baudu model developed from the estimation of the Langmuir coefficients model by the measurements of tangents at different equilibrium concentrations (Ayawei et al., 2017; McKay et al., 2014; Sivarajasekar and Baskar, 2014) can be expressed as follows:

$$q_e = \frac{q_m b_B C_e^{1+x+y}}{1 + b_B C_e^{1+x}} \quad (26)$$

where  $b_B$  is the Baudu equilibrium constant ( $L\ mg^{-1}$ ),  $x$  and  $y$  are the Baudu model parameters.

The Marczewski-Jaroniec model known as the four-parameter general Langmuir equation has been developed on basis the

distribution of the supposition of local Langmuir isotherm and adsorption energies distribution in the active sites on adsorbent (Chen, 2003; Sivarajasekar and Baskar, 2014) and can be expressed by the following formula:

$$q_e = \left[ \frac{q_m a_{MJ} C_e^{b_{MJ}}}{1 + a_{MJ} C_e^{b_{MJ}}} \right]^{m_{MJ}/b_{MJ}} \quad (27)$$

where  $a_{MJ}$  is the Marczewski-Jaroniec equilibrium constant ( $L\ mg^{-1}$ ) and  $b_{MJ}$  and  $m_{MJ}$  are the Marczewski-Jaroniec model exponents.

The Hill model developed by Hill (1910) based on the assumption that adsorption is a cooperative phenomenon with adsorbates at one site of the adsorbent influencing different binding sites on the same adsorbent (Rania and Yousef, 2015) can describe the binding of different solutes onto homogeneous adsorbent and can be written as:

$$q_e = \frac{q_m C_e^{n_H}}{K_H + C_e^{n_H}} \quad (28)$$

where  $K_H$  is the Hill isotherm constant and  $n_H$  is the Hill coefficient. Notes that the values of  $n_H > 1$ ,  $n_H = 1$  and  $n_H < 1$  indicate positive cooperativity, non-cooperative or hyperbolic binding and negative cooperativity in binding, respectively.

The Brouers-Sotolongo model is an adsorption isotherm model given by a deformed exponential function of Weibull distribution (Podder and Majumder, 2016) and this can be written by the following formula:

$$q_e = q_m [1 - \exp(-K_{BS} C_e^{n_{BS}})] \quad (29)$$

where  $K_{BS}$  is the Brouers-Sotolongo equilibrium constant ( $L\ mg^{-1}$ ) and  $n_{BS}$  is the Brouers-Sotolongo model exponent.

The Unilin model is one of the empirical correlations to express experimental data for representing the adsorption (Valenzuela and Myers, 1989) and can be mathematically formulated as follows:

$$q_e = \frac{q_m}{2b_U} \ln \left( \frac{a_U + C_e \exp(b_U)}{a_U + C_e \exp(-b_U)} \right) \quad (30)$$

where  $a_U$  is the Unilin equilibrium constant and  $b_U$  is the Unilin model exponent.

### 2.3. Error analysis for application of the kinetic and isotherm models

This study used the dedicated software of the MATLAB Optimization Toolbox with its lsqcurvefit function to simulate and analyze the experimental data of AgNPs adsorption on the natural and synthetic adsorbent materials. The algorithms can perform calculation, data processing and automated reasoning tasks based on the nonlinear lsqcurvefit function found in the MATLAB to find the coefficient of determination ( $R^2$ ), root mean squared error (RMSE), percentage of error in maximum estimated value ( $E_{max}$ ), percentage of error in minimum estimated value ( $E_{min}$ ), mean absolute percent error (MAPE) and mean absolute deviation (MAD) for statistical analysis significance tests for all the kinetic and isotherm models. The first condition induces a ranking of the arithmetic mean for every model in terms of accuracy. Because of the arithmetic mean is the most commonly used and readily understood measure of central tendency, the selection of a potential model with comparison of the other models as a function of the number of terms in each model is based on the arithmetic mean

information criteria. Finally, the best model order can be determined using the minimum value of average ranking (AR). The mathematical equation of the statistical analysis methods can be described as follows:

(1) For the coefficient of determination,

$$R^2 = 1 - \frac{\sum (x_{obs,i} - x_{model,i})^2}{\sum (x_{obs,i} - \bar{x}_{obs})^2} \quad (31)$$

(2) For the root mean squared error,

$$RMSE = \sqrt{\frac{\sum_{i=1}^n (x_{obs,i} - x_{model,i})^2}{n}} \quad (32)$$

(3) For the percentage of error in maximum estimated value,

$$E_{max} = \left| \frac{x_{model,max} - x_{obs,max}}{x_{obs,max}} \right| \times 100\% \quad (33)$$

(4) For the percentage of error in minimum estimated value,

$$E_{min} = \left| \frac{x_{model,min} - x_{obs,min}}{x_{obs,min}} \right| \times 100\% \quad (34)$$

(5) For the mean absolute percent error,

$$MAPE = \left( \frac{1}{n} \sum \frac{|x_{obs,i} - x_{model,i}|}{|x_{obs,i}|} \right) \times 100\% \quad (35)$$

(6) For the mean absolute deviation,

$$MAD = \frac{1}{n} \sum |x_{obs,i} - x_{model,i}| \quad (36)$$

where  $x_{obs,i}$  is the data obtained from observation at time  $i$ ,  $x_{model,i}$  is the data modeled for observation at time  $i$ ,  $n$  is the number of data,  $x_{model,max}$  is the maximum value of the modeled data,  $x_{obs,max}$  is the maximum value of the observed data,  $x_{model,min}$  is the minimum value of the modeled data, and  $x_{obs,min}$  is the minimum value of the observed data.

### 3. Results and discussion

#### 3.1. Results

The requirement to define a proper model for the adsorption of AgNPs onto different adsorbents has been becoming a concern in terms of AgNPs removal (Sheng and Liu, 2017). In this work, the following criteria were used to rank the goodness-of-fit testing of the kinetic and isotherm models to experimental data that the value of  $AR < 3.75$ , that of  $3.75 \leq AR \leq 7.50$ , that of  $7.50 < AR \leq 11.25$  and that of  $11.25 < AR \leq 15$  represent the very good, good, satisfactory and poor adsorption performance, respectively. The results of ranking the values of every statistical analysis method for the adsorption of AgNPs onto different adsorbents were analyzed on the basis of measuring the values of the parameter equations of each model (see Tables 1 and 2 in Supplementary materials) and can be then used to verify if one kinetic or isotherm model could fit the data better than others.

##### 3.1.1. Adsorption of AgNPs on glass beads

The results (Table 3 in Supplementary materials) of ranking the values of arithmetic mean being obtained from every statistical analysis method for the kinetic models of AgNPs adsorption on GB show that the statistical analysis for the fractal-like mixed 1, 2-

order, fractal-like pseudo-first-order and fractal-like exponential models gives a very good fit to experimental data as their AR values of 1.2, 2.3 and 3.3, respectively, have been verified with a best fit being obtained for the fractal-like mixed 1, 2-order model due to its lowest AR value of 1.2. A good fit can be obtained for the fractal-like pseudo-second-order, Power, Boyd and Bangham models as their AR values of 3.8, 5.5, 5.7 and 6.2, respectively, were verified. The model-data fit can be considered satisfactory for the intraparticle diffusion, pseudo-second-order, mixed 1, 2-order and exponential models since the AR values were verified as high as 8.3, 9.3, 9.3 and 11.2, respectively. The statistical analysis for the pseudo-first-order, first order, Avrami and second-order models gives a poor fit to the data due to their AR values of 13.0, 13.2, 13.3 and 14.3, respectively, were verified and this reveals a very poor fit being obtained for the second-order model because of its AR value of 14.3 is higher than others.

The analysis of using the values of arithmetic mean for the isotherm models of AgNPs adsorption on GB (see Table 4 in Supplementary materials) shows that the Fritz-Schlunder and Baudu models give a very good fit to experimental data as their AR values of 1.67 and 2.67, respectively, have been verified with a best fit being obtained for the Fritz-Schlunder model verified by its lowest AR value of 1.67. A good fit can be found for the Khan, Toth and Radke-Prausnitz models as it can be verified by observation of their AR values of 3.67, 4.17 and 4.67, respectively. The verification of model-data fit carried out using the Brouers-Sotolongo, Hill, Redlich-Peterson, Jovanovic, Maczewski-Jaroniec, Koble-Corrigan and Langmuir models can be considered satisfactory since this view deals with the AR values as high as 7.67, 8.00, 8.17, 9.33, 10.00, 10.38 and 11.17, respectively. The statistical data analysis gives a poor fit for the Langmuir-Freudlich, Unilin and Freundlich models as it has been verified by the observation of the AR values as high as 12.00, 12.17 and 13.83, respectively, and this verification reveals a very poor fit for the Freundlich model due to its AR value of 13.83 is higher than others.

##### 3.1.2. Adsorption of AgNPs on aged iron oxide magnetic particles

The results (Table 5 in Supplementary materials) of numerical simulation by the kinetic models of AgNPs adsorption on AIOMP show that the statistical analysis for the fractal-like mixed 1, 2-order, mixed 1, 2-order and fractal-like pseudo-first-order kinetic models gives a very good fit to experimental data as their AR values of 1.33, 1.83 and 2.83, respectively, have been verified with a best fit being obtained for the fractal-like mixed 1, 2-order model due to its lowest AR value of 1.33. A good fit can be obtained for the fractal-like exponential, fractal-like pseudo-second-order, pseudo-first-order and Avrami models since their AR values of 4.00, 5.00, 6.33 and 7.00, respectively, were verified. The model-data fit can be considered satisfactory for the exponential, pseudo-second order and power models because of the AR values were verified as high as 8.17, 9.17 and 10.67, respectively. The statistical analysis for the Bangham, Boyd, intraparticle diffusion, first-order and second-order models gives a poor fit to the data due to their AR values of 11.33, 11.33, 12.00, 14.33 and 14.67, respectively, were verified and this reveals a very poor fit being obtained for the second-order model because of its AR value of 14.67 is higher than others.

The analysis of using the values of arithmetic mean for the isotherm models of AgNPs adsorption on AIOMP (see Table 6 in Supplementary materials) shows that the only Brouers-Sotolongo model gives a very good fit to experimental data due to its AR value of 1.00 has been verified. A good fit can be found for the Langmuir-Freudlich, Fritz-Schlunder, Baudu, Koble-Corrigan, Hill, Maczewski-Jaroniec and Jovanovic models as it can be verified by observation of their AR values of 4.00, 4.50, 4.50, 4.67, 4.83, 5.50 and 7.00, respectively. The verification of model-data fit carried out

using the Toth, Khan and Radke-Prausnitz models can be considered satisfactory since this view deals with the AR values as high as 9.67, 9.83 and 10.50, respectively. The statistical data analysis gives a poor fit for the Langmuir, Unilin, Redlich-Peterson and Freundlich models as it has been verified by the observation of the AR values as high as 12.33, 12.67, 14.33 and 14.67, respectively, and this verification reveals a very poor fit for the Freundlich model due to its AR value of 14.67 is higher than others.

### 3.1.3. Adsorption of AgNPs on $Fe_3O_4$ @ polydopamine core-shell microspheres

The results (Table 7 in Supplementary materials) of ranking the values of arithmetic mean being obtained from every statistical analysis method for the kinetic models of AgNPs adsorption on FPC show that the statistical analysis for the fractal-like mixed 1, 2-order and pseudo-second order models gives a very good fit to experimental data because of their AR values of 1.17 and 2.83, respectively, have been verified with a best fit being obtained for the fractal-like mixed 1, 2-order model due to its lowest AR value of 1.17. A good fit can be obtained for the pseudo-first-order, first order, exponential, Boyd and Avrami models since their AR values of 4.83, 5.17, 5.33, 5.33 and 5.83, respectively, were verified. The model-data fit can be considered satisfactory for the fractal-like exponential, Bangham, power, fractal-like pseudo-first-order and mixed 1, 2-order models since their AR values were verified as high as 9.33, 10.00, 10.17, 10, 50, and 11.17, respectively. The statistical analysis for the fractal-like pseudo-second-order, intraparticle diffusion and second-order models gives a poor fit to the data because of their AR values of 11.50, 12.17 and 14.67, respectively, were verified and this reveals a very poor fit being obtained for the second-order model due to its AR value of 14.67 is higher than others.

The analysis of using the values of arithmetic mean for the isotherm models of AgNPs adsorption on FPC (see Table 8 in Supplementary materials) shows that the only Koble-Corrigan model give a very good fit to experimental data as its AR value of 2.17 has been verified. A good fit can be found for the Toth, Khan, Brouers-Sotolongo, Fritz-Schlunder, Baudu, Langmuir-Freundlich and Maczewski-Jaroniec models as it can be verified by observation of their AR values of 3.67, 4.00, 5.17, 6.33, 6.33, 6.67 and 7.00, respectively. The verification of model-data fit carried out using the Hill, Jovanovic and Langmuir models can be considered satisfactory since this view deals with their AR values as high as 9.33, 9.50 and 9.83, respectively. The statistical data analysis gives a poor fit for the Unilin, Radke-Prausnitz, Freundlich and Redlich-Peterson models as it has been verified by the observation of the AR values as high as 12.17, 12.33, 12.50 and 13.00, respectively, and this verification reveals a very poor fit for the Redlich-Peterson model due to its AR value of 13.00 is higher than others.

### 3.1.4. Adsorption of AgNPs on Poly(ethylenimine) functionalized core-shell magnetic

The results (Table 9 in Supplementary materials) of ranking the values of arithmetic mean being obtained from every statistical analysis method for the kinetic models of AgNPs adsorption on PFC show that the statistical analysis for the fractal-like pseudo-first-order, fractal-like mixed 1, 2-order and fractal-like exponential models gives a very good fit to experimental data as their AR values of 2.00, 2.83 and 3.17, respectively, have been verified with a best fit being obtained for the fractal-like pseudo-first-order model because of its lowest AR value of 2.00. A good fit can be obtained for the fractal-like pseudo-second-order, Boyd, pseudo-second-order, power and mixed 1, 2-order models as their AR values of 4.17, 5.83, 6.67, 7.00 and 7.00, respectively, were verified. The model-data fit can be considered satisfactory for the Bangham, intraparticle diffusion and exponential models since the AR values were

verified as high as 7.67, 10.33 and 10.33, respectively. The statistical analysis for the pseudo-first-order, Avrami, first-order and second-order models gives a poor fit to the data due to their AR values of 11.67, 12.33, 14.50 and 14.50, respectively, were verified and this reveals a very poor fit being obtained for the first-order and second-order model because of the same their AR value of 14.50 is higher than others.

The analysis of using the values of arithmetic mean for the isotherm models of AgNPs adsorption on PFC (see Table 10 in Supplementary materials) shows that the only Freundlich model give a very good fit to experimental data as its AR value of 3.67 has been verified. A good fit can be found for the Radke-Prausnitz, Toth, Fritz-Schlunder, Khan, Brouers-Sotolongo, Koble-Corrigan and Baudu models as it can be verified by observation of their AR values of 4.33, 4.50, 5.33, 5.50, 6.67, 7.17 and 7.33, respectively. The verification of model-data fit carried out using the Langmuir-Freundlich, Maczewski-Jaroniec and Unilin models can be considered satisfactory since this view deals with the AR values as high as 8.00, 8.67 and 9.33, respectively. The statistical data analysis gives a poor fit for the Jovanovic, Langmuir, Hill and Redlich-Peterson models since it has been verified by the observation of the AR values as high as 11.83, 12.50, 12.50 and 12.67, respectively, and this verification reveals a very poor fit for the Redlich-Peterson model due to its AR value of 12.67 is higher than others.

### 3.1.5. Adsorption of AgNPs on *Aeromonas punctata*

The results (Table 11 in Supplementary materials) of ranking the values of arithmetic mean being obtained from every statistical analysis method for the kinetic models of AgNPs adsorption on AP show that the statistical analysis for the fractal-like mixed 1, 2-order, fractal-like pseudo-first-order and fractal-like exponential models gives a very good fit to experimental data because of their AR values of 1.5, 2.3 and 3.5, respectively, have been verified with a best fit being obtained for the fractal-like mixed 1, 2-order model due to its lowest AR value of 1.5. A good fit can be obtained for the mixed 1, 2-order, fractal-like pseudo-second-order, pseudo-first-order and exponential models as their AR values of 5.7, 5.8, 5.7, 7.3 and 7.5, respectively, were verified. The model-data fit can be considered satisfactory for the Avrami, power, Bangham, pseudo-second-order and intraparticle diffusion models since the AR values were verified as high as 8.3, 8.7, 9.7, 10.3 and 10.7, respectively. The statistical analysis for the Boyd, second-order and first-order models gives a poor fit to the data due to their AR values of 11.5, 13.5 and 13.7, respectively, were verified and this reveals a very poor fit being obtained for the first-order model because of its AR value of 13.7 is higher than others.

The analysis of using the values of arithmetic mean for the isotherm models of AgNPs adsorption on GB (see Table 12 in Supplementary materials) shows that the Maczewski-Jaroniec, Brouers-Sotolongo, Fritz-Schlunder and Baudu models give a very good fit to experimental data since their AR values of 1.33, 2.17, 3.00 and 3.50, respectively, have been verified with a best fit being obtained for the Maczewski-Jaroniec model as verified by its lowest AR value of 1.33. A good fit can be found for the Unilin, Langmuir-Freundlich and Koble-Corrigan models as it can be verified by observation of their AR values of 5.33, 6.50 and 6.50, respectively. The verification of model-data fit carried out using the Hill, Toth, Khan, Langmuir, Jovanovic and Radke-Prausnitz models can be considered satisfactory since this view deals with their AR values as high as 7.50, 9.50, 10.00, 11.00, 11.00 and 11.00, respectively. The statistical data analysis gives a poor fit for the Freundlich and Redlich-Peterson models as it has been verified by observation of the AR values as high as 13.50 and 15.00, respectively, and this verification reveals a very poor fit for the Redlich-Peterson model due to its AR value of 15.00 is higher than others.

## 3.2. Discussion

### 3.2.1. Application of the adsorption kinetic models

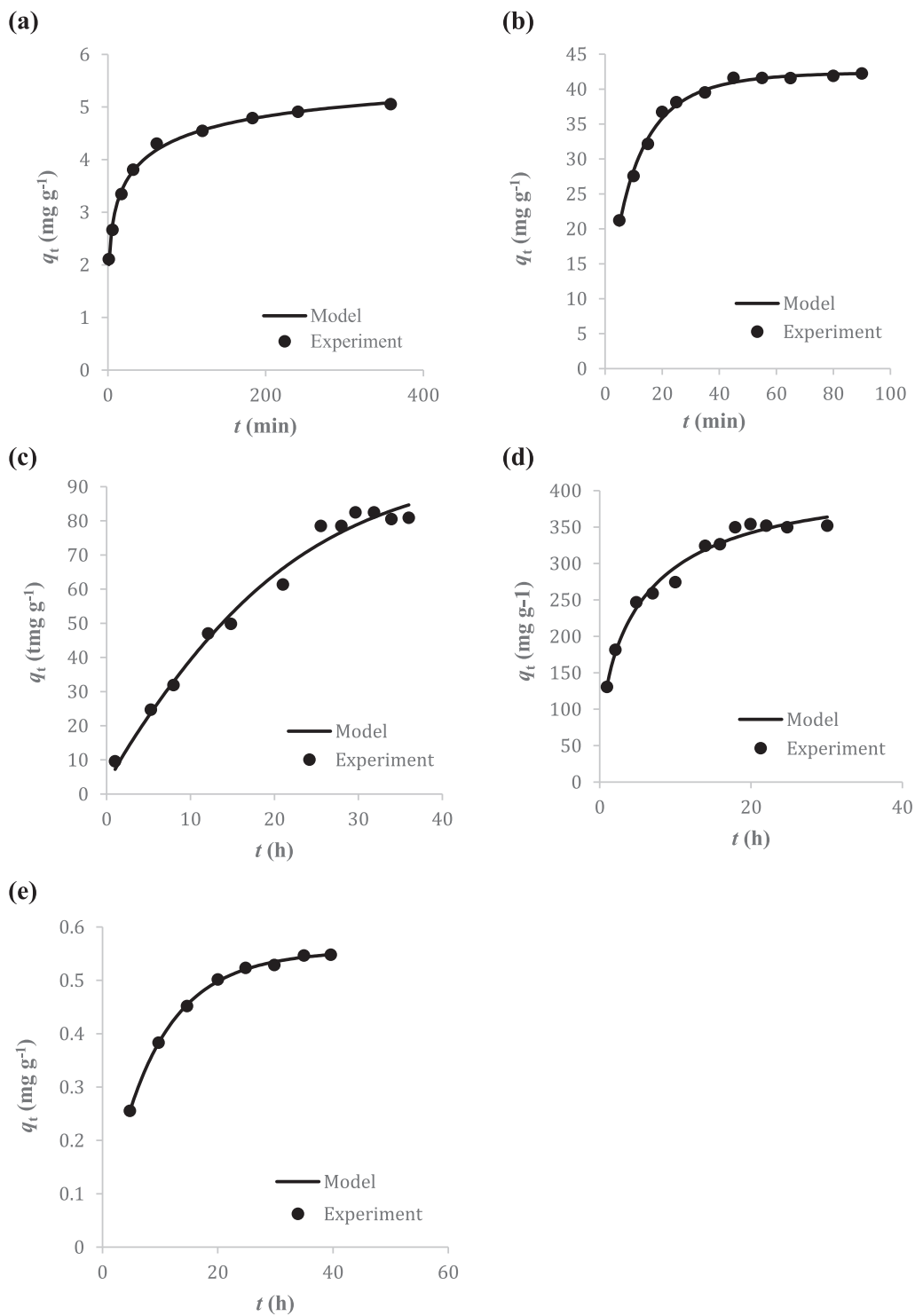
The error analysis has been one of the most applied tools for defining the best fitting adsorption models because it consists of different statistical methods for determining the values of such as  $R^2$ , RMSE,  $E_{max}$ ,  $E_{min}$ , MAPE and MAD (Ayawei et al., 2017; Madhavan et al., 2016; Sivarajasekar and Baskar, 2014). This analysis induces a ranking of the arithmetic mean in term of accuracy for every model. The results (Tables 3, 5, 7, 9, 11 in Supplementary materials) show that the adsorption kinetic models for the adsorption of AgNPs do fit to the experimental data depending on type of the adsorbent. It is an inconsistency in the representational content of different models for the adsorption of AgNPs from aqueous solution and spectrum of the stimulating zone depends on AgNPs properties and environmental conditions (Sheng and Liu, 2017). The experimental evidence of the existence of fractal-like mixed 1, 2-order model for modeling the adsorption of AgNPs on GB, AIOMP, FPC, PFC and AP gives a very good fit to the data as judged by all the AR values of below than 3.75 in spite of the analysis of using the values of  $E_{max}$ ,  $E_{min}$  and MAPE as high as 4.00 for the adsorption of AgNPs on PFC from aqueous solution gives a good fit. A plot (Fig. 1) of  $q_t$  versus  $t$  for the fractal-like mixed 1, 2-order model shows that the trend curve is different depending on the adsorbent and can be expressed as parametric model with a growth curve followed exponential pattern within a specific range. The kinetics of AgNPs adsorption on GB, AIOMP, FPC, PFC or AP with an energetically heterogeneous surface determine the adsorption capacity and breakthrough time of the adsorbent of being characterized by its different surface chemical properties (Fayaz et al., 2017; Haerifar and Azizian, 2014). The statistical analysis of experimental data for the adsorption of AgNPs on GB, AIOMP, PFC and AP can be performed using the fractal-like pseudo-first-order, fractal-like exponential, fractal-like pseudo-second-order and mixed 1, 2-order models except for: (1) the use of mixed 1, 2-order model for modeling the adsorption of AgNPs on GB and PFC by using the  $R^2$ , RMSE and MAPE values and AP by using the  $E_{min}$  and MAPE values and (2) the use of fractal-like pseudo-second-order model for modeling the adsorption of AgNPs on AP. This conclusion would be due to the use of these models to rank the values of arithmetic mean can provide a good fit within the data range as judged by their AR values of  $3.75 \leq AR \leq 7.50$ . Previous studies have found the kinetics of AgNPs adsorption on GB, AIOMP, FPC and PFC followed a pseudo-second-order model (Polowczyk et al., 2015; Wu et al., 2017; Zhang et al., 2017; Zhou et al., 2017). It has been reported that the kinetics of adsorption of AgNPs on AP fitted best to pseudo-first-order (Khan et al., 2012). In this work, the use of pseudo-second-order, Boyd, power, exponential, pseudo-first-order, Bangham, Avrami and intraparticle diffusion models can be recommended for modeling the experimental data but it needs to be checked the reliability and validity on a case-by-case basis because of the error analysis of using the different statistical methods for determining the values of  $R^2$ , RMSE,  $E_{max}$ ,  $E_{min}$ , MAPE and MAD can have many reasons for coming to different conclusions of very good, good, satisfactory and poor fit to the experimental data. Experimental evidence (see Tables 3, 5, 7, 9, 11, 13 in Supplementary materials) shows that based on the verification of arithmetic mean as a statistical measure the use of first-order and second-order models cannot be recommended for modeling the experimental data except the use of first order model for modeling the adsorption of AgNPs on FPC due to its statistical data analysis gives a poor fit to the data as judged by an AR value of higher than 11.25. In summary, comprehensive performance analysis of the fifteen kinetic models can rank that the use of the fractal-like mixed 1, 2-order for describing the behaviors of adsorption of AgNPs is better than fractal-like pseudo-first-order,

better than fractal-like exponential, better than fractal-like pseudo-second-order, better than mixed 1, 2-order, better than pseudo-second-order, better than Boyd, better than Power, better than exponential, better than pseudo-first-order, better than Bangham, better than Avrami, better than intraparticle diffusion, better than first order, and better than second-order model as it can be verified by the overall average AR values of 1.61, 3.99, 4.66, 6.05, 7.00, 7.65, 7.94, 8.41, 8.51, 8.63, 8.98, 9.35, 10.70, 12.18, and 14.33, respectively (see Table 13 in Supplementary materials).

### 3.2.2. Application of the adsorption isotherm models

The error analysis may classify the ranking of the arithmetic mean in term of accuracy for the application of fifteen adsorption isotherm models. The results (Tables 4, 6, 8, 10, 12 in Supplementary materials) show that the use of the isotherm models for modeling the adsorption of AgNPs do fit to the experimental data depending on the type of adsorbent. Even though the experimental evidence of using (1) the Fritz-Schlunder, Baudu and Khan models for modeling the adsorption of AgNPs on GB, (2) the Brouers-Sotolongo model for the adsorption of AgNPs on AIOMP, (3) the Koble-Corrigan and Toth models for the adsorption of AgNPs on FPC, (4) the Freundlich model for the adsorption of AgNPs on PFC and (5) the Maczewski-Jaroniec, Brouers-Sotolongo, Fritz-Schlunder and Baudu models for the adsorption of AgNPs on AP shows a very good fit to the experimental data as judged by the AR value of below 3.75, the statistical analysis of ranking the arithmetic mean verified that no one model can be considered as the most reliable estimate of adsorption isotherm parameters for the adsorption of AgNPs on all adsorbents of GB, AIOMP, FPC, PFC and AP. It has been reported that the experimental data best fitted the Langmuir model for the adsorption of AgNPs on GB, AIOMP, FPC and AP (Khan et al., 2012; Polowczyk et al., 2015; Wu et al., 2017; Zhou et al., 2017). Both Langmuir and Freundlich models fitted the experimental data well for the adsorption of AgNPs on PFC (Zhang et al., 2017). This study found that the most reliable way of analysing the experimental data for the adsorption of AgNPs on GB, AIOMP, PFC and AP can be suggested using the Fritz-Schlunder and Baudu models because of the use of these two models to rank the values of arithmetic mean can give a good fit to the data as judged by the AR values of  $3.75 \leq AR \leq 7.50$ . The trend curve is different depending on the adsorbent and this can be verified by plotting a curve of  $q_t$  versus  $t$  as shown in Fig. 2 for the application of Fritz-Schlunder model to describe the behaviours of AgNPs adsorption. This study of the adsorption of AgNPs on GB, AIOMP, FPC, PFC or AP evaluated by the fifteen isotherm models involves plotting the experimental data and finding the different behavior accumulation curves and this suggests that the physical and chemical properties of the adsorbent determine the adsorption capacity and concentration of AgNPs at equilibrium (Adane et al., 2015; Azeez et al., 2018). The application of Fritz-Schlunder, Brouers-Sotolongo, Baudu, Koble-Corrigan, Toth, Maczewski-Jaroniec, Khan, Langmuir-Freundlich, Hill, Radke-Prausnitz, Jovanovic and Unilin models can be recommended for modeling the experimental data since the AR values of less than 11.25 were verified in many cases; however, the verification of the reliability and validity of each model is important for any experimental data to provide guidance and clarity on the specific case of adsorption isotherm because of the error analysis of determining the values of  $R^2$ , RMSE,  $E_{max}$ ,  $E_{min}$ , MAPE and MAD can reach different conclusions of very good, good, satisfactory and poor fit to the experimental data. The experimental evidence of arithmetic mean verification (see Tables 4, 6, 8, 10, 12, 14 in Supplementary materials) shows that the use of Redlich-Peterson model cannot be recommended for modeling the adsorption of AgNPs on AIOMP, FPC, PFC and AP due to the statistical data analysis gives a poor fit to the experimental data as judged by the AR values of higher than





**Fig. 1.** Curve of plotting  $q_t$  versus  $t$  for assessing the behaviors of AgNPs adsorption on (a) GB, (b) AlOMP, (c) FPC, (d) PFC and (e) AP by the fractal-like mixed 1, 2-order kinetic model.

11.25. In general, the statistical analysis of the experimental data to evaluate the performance ranking of the fifteen isotherm models may conclude the Fritz-Schlunder better than Brouers-Sotolongo, better than Baudu, better than Koble-Corrigan, better than Toth, better than Maczowski-Jaroniec, better than Khan, better than Langmuir-Freudlich, better than Hill, better than Radke-Prausnitz,

better than Jovanovic, better than Unilin, better than Langmuir, better than Freundlich, and better than Redlich-Peterson as it can be verified by the overall average AR values of 4.17, 4.54, 4.87, 6.27, 6.30, 6.50, 6.60, 7.43, 8.43, 8.57, 9.73, 10.33, 11.37, 11.63, and 12.63, respectively (see Table 14 in Supplementary materials).

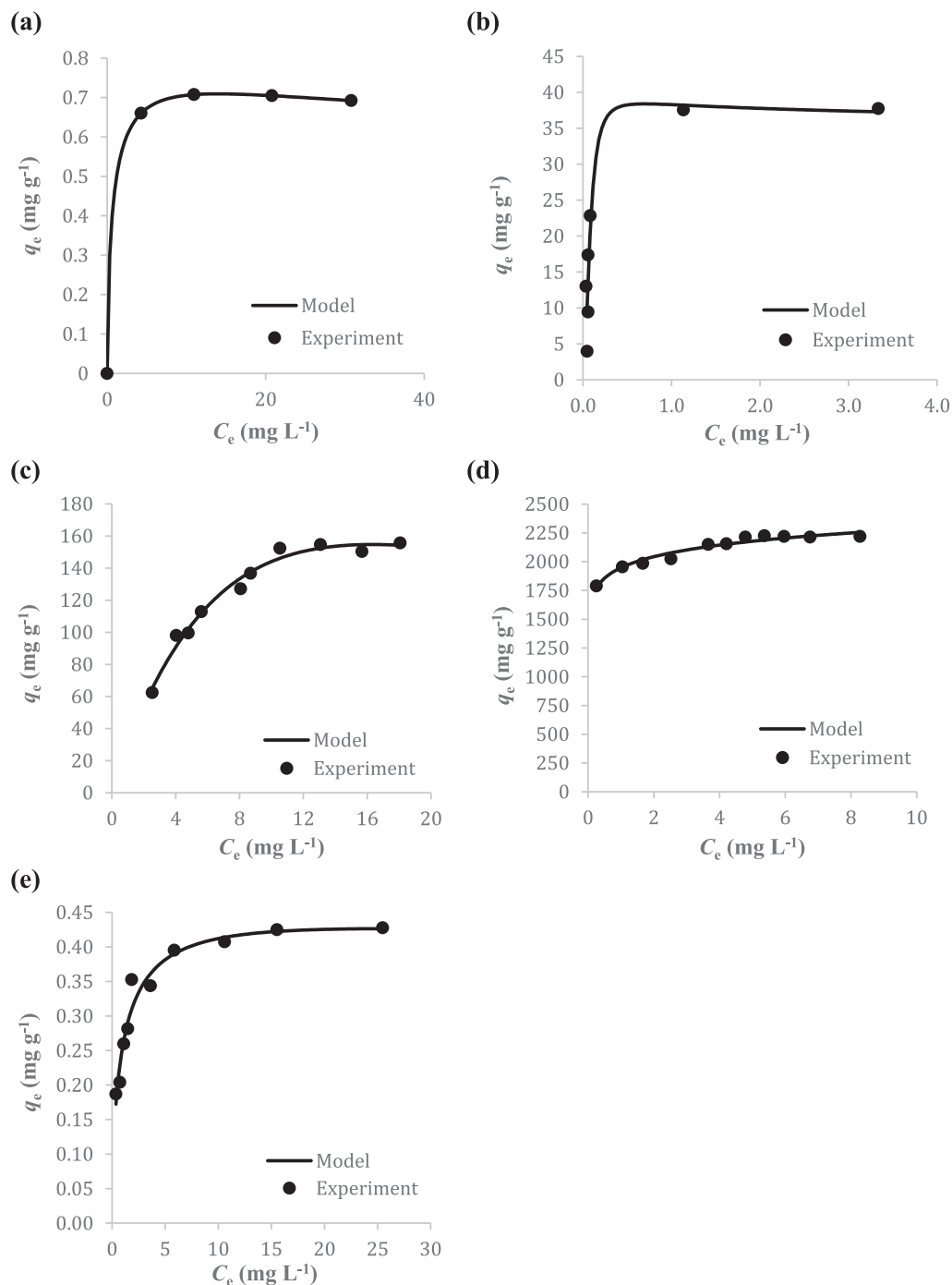


Fig. 2. Curve of plotting  $q_e$  versus  $C_s$  for assessing the behaviors of AgNPs adsorption on (a) GB, (b) AIOMP, (c) FPC, (d) PFC and (e) AP by the Fritz-Schlunder isotherm model.

#### 4. Conclusions

This study used fifteen kinetic models and fifteen isotherm models together with six statistical analysis methods to assess the level of accuracy for the adsorption of AgNPs from aqueous solution onto the five types of adsorbent. The results of this study verified that the fractal-like mixed 1, 2-order model is the best one among the fifteen kinetic models to be used for describing the behaviors of adsorption of AgNPs on GB, AIOMP, FPC, PFC and AP and the Fritz-Schlunder and Baudu models are the most reliable isotherm models

to be used for describing the behaviors of adsorption of AgNPs on GB, AIOMP, PFC and AP. The verification of the reliability and validity of the match of these thirty models with experimental data would be important to provide guidance and clarity on the kinetic and isotherm studies of AgNPs adsorption on the GB, AIOMP, FPC, PFC and AP adsorbent. The application of other kinetic and isotherm models for studying the adsorption of AgNPs as well as the application of these thirty models for the adsorption of other nanoparticles onto different types of adsorbent would be interested in conducting researches in the future.

## Conflict of interest

The authors declare that they have no conflict of interest.

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## Appendix A. Supplementary data

Supplementary data related to this article can be found at <https://doi.org/10.1016/j.jenvman.2018.03.066>.

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