Contents lists available at ScienceDirect

Heliyon



journal homepage: www.cell.com/heliyon

Maximizing diesel removal from contaminated sand using *Scirpus mucronatus* and assessment of rhizobacteria addition effect

Ipung Fitri Purwanti ^{a, b}, Siti Rozaimah Sheikh Abdullah ^{b, **}, Ainon Hamzah ^c, Mushrifah Idris ^d, Hassan Basri ^e, Mohd Talib Latif ^f, Muhammad Mukhlisin ^g, Setyo Budi Kurniawan ^{h, *}, Muhammad Fauzul Imron ^{i, j}

^a Department of Environmental Engineering, Faculty of Civil, Planning, And Geo Engineering, Institut Teknologi Sepuluh Nopember, Kampus ITS Sukolilo, Surabaya 60111, Indonesia

^b Department of Chemical and Process Engineering, Faculty of Engineering and Built Environment, Universiti Kebangsaan Malaysia, 43600 UKM Bangi, Selangor, Malaysia

^c School of Bioscience and Biotechnology, Faculty of Science and Technology, Universiti Kebangsaan Malaysia, 43600 UKM Bangi, Selangor, Malaysia

^d Tasik Chini Research Center, Faculty of Science and Technology, Universiti Kebangsaan Malaysia, 43600 UKM Bangi, Malaysia

^e Department of Civil and Structural Engineering, Faculty of Science and Technology, Universiti Kebangsaan Malaysia, 43600 UKM Bangi, Malaysia ^f School of Environmental Science and Natural Resources, Faculty of Science and Technology, Universiti Kebangsaan Malaysia, 43600 UKM Bangi, Malaysia

^g Department of Civil Engineering, Politeknik Negeri Semarang, 50275 Semarang, Indonesia

^h Laboratory of Algal Biotechnology, Centre Algatech, Institute of Microbiology of the Czech Academy of Sciences, Opatovický Mlýn, Novohradská 237, 379 81 Třeboň, Czech Republic

ⁱ Study Program of Environmental Engineering, Department of Biology, Faculty of Science and Technology, Universitas Airlangga, Kampus C UNAIR, Jalan Mulyorejo, Surabaya 60115, Indonesia

^j Department of Water Management, Faculty of Civil Engineering and Geosciences, Delft University of Technology, Stevinweg 1, CN Delft 2628, Netherlands

ARTICLE INFO

CelPress

Keywords: Bacillus Hydrocarbon Phytoremediation Pollution TPH

ABSTRACT

Phytoremediation is one of the green technologies that is friendly to nature, utilizes fewer chemicals, and exhibits good performance. In this study, phytoremediation was used to treat diesel-contaminated sand using a local aquatic plant species, Scirpus mucronatus, by analyzing the amount of total petroleum hydrocarbons (TPHs). Optimization of diesel removal was performed according to Response Surface Methodology (RSM) using Box-Behnken Design (BBD) under pilot-scale conditions. The quadratic model showed the best fit to describe the obtained data. Actual vs. predicted values from BBD showed a total of 9.1 % error for the concentration of TPH in sand and 0 % error for the concentration of TPH in plants. Maximum TPH removal of 42.3 \pm 2.1 % was obtained under optimized conditions at a diesel initial concentration of 50 mg/kg, an aeration rate of 0.48 L/min, and a retention time of 72 days. The addition of two species of rhizobacteria (Bacillus subtilis and Bacillus licheniformis) at optimum conditions increased the TPH removal to 51.9 \pm 2.6 %. The obtained model and optimum conditions can be adopted to treat diesel-contaminated sand within the same TPH range (50–3000 mg/kg) in sand.

* Corresponding author.

** Corresponding author.

E-mail addresses: rozaimah@ukm.edu.my (S.R.S. Abdullah), kurniawan@alga.cz (S.B. Kurniawan).

https://doi.org/10.1016/j.heliyon.2023.e21737

Received 17 October 2023; Accepted 26 October 2023 Available online 4 November 2023 2405-8440/© 2023 Published by Elsevier Ltd.

2405-8440/© 2023 Published by Elsevier Ltd. This is an open access article under the CC BY-NC-ND license (http://creativecommons.org/licenses/by-nc-nd/4.0/).

1. Introduction

Soil pollution is the mixing of compounds and the accumulation of unwanted particles in the soil matrix [1]. Several compounds may contaminate the soil, including organic [2] and inorganic pollutants [3]. Soil pollution may come from daily domestic activities [4] and from industrial activities [5]. Hydrocarbon pollution in soil is currently increasing due to increased fuel utilization and industrialization in many areas [6–9]. Diesel is one of the compounds commonly found to contaminate soil [10,11]. Diesel in soil was reported to reach 18,231 mg/kg in highly contaminated areas [12] and ranging within 50–500 mg/kg in non-severely contaminated areas [13].

Treatment of diesel-contaminated soil has been done using various techniques, including land excavation [14], burning [4], and soil washing [15]. The mentioned technologies are considered costly to be applied in such a large, contaminated area. The application of these techniques also requires skilled personnel to handle the operation and maintenance procedures [16]. The attention is currently shifted to the utilization of biological treatment or bioremediation to remove diesel from contaminated soil, which offers a considerably lower operation and maintenance cost [10,17–19]. One of the biological methods that have reliable performance to treat diesel-contaminated soil is phytoremediation [5,20].

Phytoremediation utilizes plants' natural mechanisms to resist, adapt, and utilize organic compounds in soil to grow [5,21]. Various types of plants have been widely used in hydrocarbon removal, such as *Glycine max* [22], *Festuca arundinacea* [23], *Scirpus grossus* [24], and *Medicago sativa* [25]. Grass-type species have often been reserved as impressive plants for treating polluted soil hydrocarbons due to their fibrous root systems [26,27]. The rhizosphere area played an important role due to the interaction between plants and the rhizo-microbial community to degrade and remove organic pollutants from soil [28]. Bacteria is one of the most commonly mentioned rhizo-microbial species involved in phytoremediation processes [29]. The addition of certain bacteria species is also reported to enhance the hydrocarbon degradation process in soil [30].

Most of the reported studies utilize terrestrial plants as hydrocarbon treatment agents in phytoremediation [6,31,32]. The utilization of aquatic plants, especially native local plants, to treat diesel-contaminated soil is still limited. In addition, Response Surface Methodology (RSM) is currently gaining attention in terms of modeling an optimization for research; however, phytoremediation of diesel-contaminated soil optimization studies using native local plant species is still rare. This research was aimed to (i) optimize, via RSM, the condition of phytoremediation using native aquatic plant species of *Scirpus mucronatus* for maximum removal of diesel represented by Total Petroleum Hydrocarbons (TPHs) and (ii) analyze the effect of rhizobacteria addition to plant growth and diesel removal from sand. The presented result is expected to give a clear understanding of the optimum conditions for diesel removal from sand and also to give a direct view of the effect of rhizobacteria addition during the phytoremediation process.

2. Materials and methods

2.1. Optimization via response surface methodology (RSM)

Optimization of phytoremediation conditions for maximum TPH removal in sand was conducted through Response Surface Methodology (RSM) using Design of Expert (Version 6, Stat-Ease, USA). The interaction between the relationship of key factors, namely diesel concentration in sand, retention time, and aeration, and TPH removal in contaminated sand and plants was analyzed using Box Behnken Design. The results obtained were then analyzed to develop an appropriate model for these factors. The optimum conditions obtained through RSM were then confirmed by comparing them with the experimental results.

The response value used was TPH concentration data on sand and plants. While the independent factors included were diesel

Run Order	Factor 1	Factor 2	Factor 3
	A: Diesel Concentration (mg/kg)	B: Retention Time (day)	C: Aeration (L/min)
1	50	39.5	2
2	50	7	1
3	3000	7	1
4	1525	39.5	1
5	50	39.5	0
6	1525	39.5	1
7	50	72	1
8	1525	72	2
9	3000	39.5	0
10	3000	39.5	2
11	1525	39.5	1
12	1525	7	0
13	1525	39.5	1
14	3000	72	1
15	1525	72	0
16	1525	39.5	1
17	1525	7	2

Table 1Run order based on Box Behnken Design.

concentrations (50 and 3000 mg/kg), retention time (7 and 72 days), and aeration (0 and 2 L/min), The minimum concentration value (50 mg/kg) was determined based on soil quality standards for industrial areas containing benzene. While the maximum concentration (3000 mg/kg) was determined based on the ratio of mass to plant, the plant is still alive at the diesel concentration based on our earlier findings. The retention time in the plant site pilot plant used is from the 7th day until the 72nd day. The 7th day is determined because on that day the plants still look healthy and have not experienced whitening. The 72nd day is determined because on that day, some plants have suffered from lethargy and changed color from green to yellow or brown. Aeration was set at 0 and 2 L/min to analyze the effect of supplying aeration on the TPH removal performance, following the protocols by Al-Baldawi et al. [33] and Tangahu et al. [34].

Based on the variable factors used, the sampling that must be completed is 17 times with diesel concentrations of 50, 1,525, and 3000 mg/kg and aeration of 0, 1, and 2 L/min. The concentration of 1525 mg/kg was the median value of the diesel concentration. Similarly, 1 L/min of aeration is the middle value of the ventilation factor. In determining the optimal condition of the pilot plant, sampling was conducted as shown in Table 1. In Table 1, the first column is the number of runs, and the next three columns are the experimental conditions compiled by Box-Behnken Design. An ANOVA test was performed on all three factors and the obtained response. Subsequently, the results obtained were used in the operation of the *Scirpus mucronatus* plant site pilot plant to treat diesel-containing sand.

The optimum condition obtained from RSM was then verified by performing a validation run similar to the condition suggested by the model. The results obtained from the validation run and prediction were then compared to calculate the percentage error.

2.2. Reactor set-up and operational condition

A pilot plant study was conducted using 12 pilot tanks, as depicted in Fig. 1, each with dimensions of $1.18 \text{ }m \times 0.9 \text{ }m \times 0.9 \text{ }m$. Each tank was filled with coarse gravel media (\emptyset 2 cm) with a thickness of 0.1 m, fine gravel (\emptyset 0.5 cm) with a thickness of 0.1 m, and sand with a thickness of 0.3 m. In this optimization study, the mass of gravel and sand applied was 491 kg, and a total of 60 one-month-old healthy plants (*Scirpus mucronatus*) were used in each tank. The plants were obtained from a shallow lake in Bangi, Selangor, Malaysia, and propagated in a greenhouse until the first generation was produced. Sand and gravel were used in this study instead of soil to ensure plants only depend on pollutants for growth since no additional nutrients are available in sand or gravel. Referring to Fig. 1, the whole set-up consisted of three rows; each row was set at one aeration rate (0, 1, and 2 L/min). Each row comprised one control tank without contaminants and another three tanks representing vegetated reactors with different diesel concentrations (50, 1525, and 3000 mg/kg). All the pilot reactors were operated batchwise for 72 days according to the experimental design by RSM, as listed in Table 1.

2.3. Effect of rhizobacteria addition

The optimum condition obtained from the DOE model was then validated in two conditions, namely without and with the addition of rhizobacteria. The rhizobacteria added were the combination of the two bacteria that provided the highest percentage of TPH removal for which this study had previously been carried out [35]. The bacterial species added were *Bacillus subtilis* and *Bacillus licheniformis*. The amount of bacterial mixture added to the reactor was 10 % (v/v) of the saturated sand [36,37]. The sand retention capacity is 26 mL in every 100 g of sand [38,39]. When the mass of sand in the reactor is 491 kg, the combined content of water in the reactor was 12.7 L. Thus, the combined content of bacteria added to the reactor was 12.7 L. The bacteria used were two species, so the combined content of each bacterial species was 6.5 L. In providing the added bacteria, the first step to be carried out was the culture of *Bacillus subtilis* and *Bacillus licheniformis* in TSA agar medium (R&M Chemicals, U.K.) for 24 h [40]. The next step is the culture of



Fig. 1. Schematic diagram of reactor set-up for phytoremediation optimization study. All experiments were conducted in triplicate.

bacteria in TSB liquid medium (R&M Chemicals, U.K.) for 24 h [41]. The amount of mixture for the two bacteria was 13 L.

2.4. Plant growth measurement

During the validation run to compare the estimated results with the experimental data and also during the exposure to rhizobacteria, plant growth through dry mass measurement was also recorded. The plant's weight was determined using the gravimetrical method [20,30]. One plant was taken from each reactor during a sampling period. The plant was rinsed using tap water and dried on filter paper (Whatman, U.K.). The dried plant was then weighed as a wet weight. The plant was then dried once again in a 70 °C oven (Memert+, Germany) for 72 h until a constant weight was achieved. The dry weight of the plant was weighed after 72 h in the oven.

2.5. Analysis of TPH in sand and plant

Throughout the optimization study, sampling was conducted in accordance with the results obtained on the selected optimization runs from the Design of Expert Application (detailed in Section 2.3). Samples of sand, water, and plants were taken from each pilot plant. Sand samples were taken compositely from three different points at a depth of about 5–10 cm. Sand samples were taken simultaneously at the same time. The sand sample was then placed in a 120-mL glass bottle. Water samples were also taken compositely from three different points. Plant samples were taken at the same time, and one plant was randomly taken per sampling point. Plants are uprooted from the sand, cleaned with tap water, and dried with a tissue before further analysis.

Three samples of sand and plant samples were taken for TPH extraction in each sampling period. Approximately 10 g of sand or plant sample was placed in 100 mL glass bottles; sodium sulfate (Merck, Germany) and 50 mL dichloromethane (DCM) (R&M Chemicals, U.K.) were then added to the bottles. The sample mixture was stirred well. The sample mixture was extracted using an ultrasonic cleaner (Termo-10D, U.S.A.) for 30 min at 50 °C. The supernatant is filtered through a glass wool (Supelco, U.S.A.) into a 5 mL glass bottle. The extract was left in the fume chamber for seven days to allow the solvent to evaporate. When the solvent had evaporated, 2 mL of DCM was added, and the sample was stored in a GC vial. Extracts were analyzed using GC FID (Agilent, Model 7890 A, U.S.A.) with HP-5 5 % column phenyl methyl siloxane ($30 m \times 0.32 \text{ mm} \text{ i. d. } X 0.25 \mu\text{m}$) with helium as carrier gas. The column temperature is programmed at 50 °C for 1 min, and then ramps at 15 °C per minute to 320 °C for 10 min.

2.6. Statistical data analysis

In this optimization study, the parameters that need to be analyzed using statistics to obtain the significance of the data are changes in plant physics to diesel concentration and TPH concentration in sand and plants. Statistical analysis using two-way ANOVA Statistics SPSS 16.0 (IBM, U.S.A.) at a 95 % confidence level or $p \le 0.05$ [42,43].

3. Results and discussion

3.1. Optimization using response surface methodology

The result of TPH concentrations in sand and plants based on the run order provided by RSM as well as the predicted value by BBD

Table 2

Result of TPH concentration in	and and in plants	(actual vs. predicted	concentration via l	Box-Benken Design).
--------------------------------	-------------------	-----------------------	---------------------	---------------------

Run Order	Initial Diesel Concentration (mg/kg)	Retention Time (days)	Aeration (L/ min)	TPH concentration in sand (mg/kg)			TPH concentration in plants (mg/kg)			
				Actual	Predicted	Error (%)	Actual	Predicted	Error (%)	
1	50	39.5	2	12.41	12.41	0.00	139.97	139.97	0.00	
2	50	7	1	29.83	29.83	0.00	342.50	342.50	0.00	
3	3000	7	1	317.00	317.00	0.00	272.09	272.09	0.00	
4	1525	39.5	1	66.38	64.50	2.83	288.04	288.04	0.00	
5	50	39.5	0	5.81	5.81	0.00	162.87	162.87	0.00	
6	1525	39.5	1	60.18	64.50	-7.18	288.04	288.04	0.00	
7	50	72	1	29.43	29.43	0.00	416.60	416.60	0.00	
8	1525	72	2	34.92	34.92	0.00	233.38	233.38	0.00	
9	3000	39.5	0	120.58	120.58	0.00	161.05	161.05	0.00	
10	3000	39.5	2	199.64	199.64	0.00	290.75	290.75	0.00	
11	1525	39.5	1	76.28	64.50	15.43	288.04	288.04	0.00	
12	1525	7	0	86.32	86.32	0.00	259.56	259.56	0.00	
13	1525	39.5	1	64.17	64.50	-0.52	288.04	288.04	0.00	
14	3000	72	1	104.08	149.28	-43.43	408.43	408.43	0.00	
15	1525	72	0	39.02	75.88	-94.49	140.79	140.79	0.00	
16	1525	39.5	1	55.50	22.84	58.85	288.04	288.04	0.00	
17	1525	7	2	41.99	0.72	98.29	156.77	156.77	0.00	

Equation (2)

(calculated by the model) are tabulated in Table 2. Based on the Box-Behnken design method, it is found that the quadratic model is suitable for both factors. The quadratic models obtained are as shown in Equations (1) and (2). The model was used in determining the concentration of TPH on sand and plants during plant site pilot plant operation at optimal conditions.

$$y_{1} = 11.31384 + (0.014121 * A) + (6.73179E - 003 * B) + (42.19012 * C) + (2.73896E - 005*A^{2}) - (4.44663E - 003*B^{2}) - (24.70798*C^{2}) - (1.52430E - 004 * A * B) - 0.034716 * A * C) + (0.30949 * B * C) - (5.62031E - 007*A^{2}*B) + (1.54092E - 005*A^{2}*C) + (9.59880E - 006 * A*B^{2})$$
Equation (1)

$$y_{2} = 319.31290 + (0.034103 * A) - (7.66664 * B) + (191.56701 * C) - (3.42649E - 005*A^{2}) + (0.093943*B^{2})$$

$$-(130.82931*C^2) + (4.84993E - 004*A*B) - (0.015137*A*C) + (1.50288*B*C) + (8.93128E - 007*A^2*B)$$

$$+ (1.34430E - 005*A^2*C) - (3.65124E - 005*A*B^2)$$

with, y_1 = TPH concentration in sand (mg/kg), y_2 = TPH concentration in plant (mg/kg), A = TPH initial concentration (mg/kg), B = retention time (day) and C = aeration (L/min).

The results of the ANOVA analysis of the two quadratic models are shown in Table 3. Based on Table 3, the *F*-values for both models (TPH in sand and in plants) were 129.87 and 63, 660, 000, respectively. This value indicates that the quadratic model obtained was significant (p < 0.05). An adequate level of precision is needed to measure the noise-to-noise ratio, for which a ratio exceeding 4 is required [44]. From the quadratic model obtained, the noise-to-noise ratio value is 45.76 for the concentration of TPH in sand. As for the concentration of TPH in plants, there is no value for the signal-noise ratio. This is due to the values of $R^2 = 1$ and R^2 adj = 1, indicating that each model was sufficient for use and in accordance with the experimental design of a plant site pilot plant. Moreover, the *p* value of the second model was less than 0.05, which indicates that the model was significant, and the quadratic equations formed can be applied to determine the concentration of TPH in sand and plants [11]. The *F*-value of the lack of fit obtained from Equation (1) was 32.3, while Equation (2) does not have a lack of fit value due to the total congruency.

The results obtained through experiments and estimated by the model are shown in Table 2. In Table 2, run 5 gives the lowest TPH concentration in the sand (5.8 mg/kg), while the TPH concentration in the plant is 162.9 mg/kg under the condition of 50 mg/kg diesel

Table 3

Resul	t of	f ANO	VA	analy	sis f	or a	quad	lratic	mode	l for	TPH	in	sand	and	pl	ants
-------	------	-------	----	-------	-------	------	------	--------	------	-------	-----	----	------	-----	----	------

TPH in sand						
Source	Sum of square	DF	Mean Square	<i>F</i> -value	Prob > F	Remark
Model	94237.64	12	7853.14	129.87	0.0001	Significant
Α	22800.94	1	22800.94	377.06	< 0.0001	
В	738.84	1	738.84	12.22	0.0250	
С	586.28	1	586.28	9.70	0.0357	
A ²	8456.28	1	8456.28	139.84	0.0003	
B ²	487.92	1	487.92	8.07	0.0468	
C^2	2570.46	1	2570.46	42.51	0.0029	
AB	11291.21	1	11291.21	186.72	0.0002	
AC	1312.82	1	1312.82	21.71	0.0096	
BC	404.68	1	404.68	6.69	0.0609	
A ² B	3158.53	1	3158.53	52.23	0.0019	
A ² C	2247.81	1	2247.81	37.17	0.0037	
AB^2	447.28	1	447.28	7.40	0.0530	
Pure Error	241.88	4	60.47			
Cor Total	94479.52	16				
$R^2 = 0.9974$	R^2 adj = 0.9898	Lack of fit =	= 45.762			
TPH in plants						
Source	Sum of square	DF	Mean Square	F-value	Prob > F	Remark
Model	117589.68	12	9799.14	63,660,000	< 0.0001	Significant
Α	5547.27	1	5547.27	63,660,000	< 0.0001	
В	444.57	1	444.57	63,660,000	< 0.0001	
С	25.97	1	25.97	63,660,000	< 0.0001	
A^2	4165.22	1	4165.22	63,660,000	< 0.0001	
B ²	6877.01	1	6877.01	63,660,000	< 0.0001	
C^2	72068.66	1	72068.66	63,660,000	< 0.0001	
AB	968.21	1	968.21	63,660,000	< 0.0001	
AC	5821.69	1	5821.69	63,660,000	< 0.0001	
BC	9542.82	1	9542.82	63,660,000	< 0.0001	
A ² B	7976.12	1	7976.12	63,660,000	< 0.0001	
A ² C	1710.77	1	1710.77	63,660,000	< 0.0001	
AB^2	6471.86	1	6471.86	63,660,000	< 0.0001	
Pure Error	0.00	4	0.00			
Cor Total	117589.68	16				
$R^2 = 1.000$	R^2 adj = 1.0000	Lack of fit =	= -			

concentration and a retention time of 39.5 days without aeration. The highest TPH concentrations in plants (416.6 mg/kg) were achieved on run 7, at 50 mg/kg diesel concentration, 72 days of retention time, and 1 L/min of aeration.

Fig. 2 demonstrates a comparative analysis between the concentration of TPH in sand and plants for each run obtained through experiments and that estimated by Box-Behnken. Based on the diagram, the concentration of TPH on sand estimated by Box-Behnken was obtained according to the removal pattern obtained from the experiments. However, there was a slight pattern difference in runs 14 to 17 (Fig. 2(a)). TPH concentrations in plants do not indicate a pattern of difference between actual and predicted data. This was because the value of $R^2 = 1$. A greater R^2 indicated that the obtained data were more closely matching the prediction; in this case, it means that the experiment was indeed equal to the prediction [45,46]. An illustration of the actual value of the response obtained through the experiments arranged by Box-Behnken and the estimated value obtained through Equations (1) and (2) are also shown in Fig. 2. The values of coefficients R^2 and R^2 adj for the estimated concentration of TPH in sand are 0.9974 and 0.9898. While the estimated concentration of TPH in plants has a value coefficient of 1 for both R^2 and R^2 adj. The R^2 and R^2 adj were also used as indicators to show satisfactory development between simulated data; values higher than 0.95 indicated a good fit [47]. In addition, Sidek et al. [48] mentioned that a significant *p*-value (<0.05), an R^2 above 0.9, and adequate precision >4 indicated the good soundness of the model with a surface contour plot.

3.2. Model desirability for the optimization study

Determining the optimal factor conditions carried out was to minimize the concentration of TPH in sand and maximize the



Fig. 2. Comparison of TPH concentrations obtained through experiments with those estimated by Box-Behnken in (a) sand and (b) plants.

278.29

Obtained TPH Concentration in Plant (mg/Kg) (b)

347.44

416.60

209.13

139.97

concentration of TPH in plants. The required goal for operating conditions is that the initial concentration of diesel in the sand was set in the range of 50–3000 mg/kg, the retention time was set in the range of 7–72 days, and the aeration supply was set to a minimum to reduce electricity consumption. The response of TPH concentrations in sand was minimized (i.e., targeting maximum removal of diesel from sand), and TPH concentrations in plants were maximized. Through the optimization program, the likelihood of each factor and response was combined, and then the search for the maximum model (Equation (1) and (2)) was performed. The optimization results are shown in Fig. 3, where the optimum conditions at the predetermined goal are selected at a desirability of 0.82 with a diesel concentration of 50.0 mg/kg, a retention time of 72.0 days, and an aeration rate of 0.59 L/min. A desire value higher than 0.8 is considered a good scenario to be implemented for a specific objective function [49], with a higher value (closer to 1) indicating a better solution for optimization [49,50].

The desirability of the optimum operating conditions is shown in Fig. 4(a). Experiments were conducted to confirm the optimum conditions obtained from the model estimation to eliminate the concentration of TPH in sand and increase the concentration of TPH in plants [51,52]. Fig. 4(b) and (c) show that the optimal diesel concentration in the operation of this plant site is 50.0 mg/kg, with a sand retention time of 72 days at the plant site and an aeration supply of 0.6 (approximated from 0.59) L/min. Based on the optimal conditions obtained, sampling of sand, water, and plants was done from day 0 to day 72 to obtain the concentration of TPH on sand and plants. At this optimum condition, the estimated concentration of TPH in sand using Equation (1) was 17.11 mg/L (Fig. 4(b)), while the estimated concentration of TPH in plants using Equation (2) is 325.62 mg/kg (Fig. 4(c)).

3.3. Validation run at optimal conditions

In this section, the results obtained during the operation of the optimum-condition pilot plant will be compared with the results from the DOE model. This validation run was performed to confirm the validation of the results obtained from the DOE optimization [51]. Validation runs can be carried out using various methods, including t-tests and further runs using suggested conditions [53,54]. This research validation was conducted using further runs on the suggested condition, with the parameters analyzed being TPH concentrations in sand and plants. Table 4 summarizes the results of the confirmation run on the optimal condition of the plant site pilot plant compared to the results from DOE. The results given by the DOE model for TPH concentrations in sand and plants were 17.1 (\downarrow 32.9 %) and 325.6 mg/kg, respectively. Meanwhile, through the confirmation run conducted, the results for TPH concentrations in sand and plants were 17.1 (\downarrow 32.9 %) and 325.6 mg/kg, respectively. Meanwhile, through the confirmation run conducted, the results for TPH concentrations in sand and plants, respectively. This RSM model can also be used for large-scale plant modeling, as long as the hydrocarbon concentrations used are still in the range of 50–3000 mg/kg. Previous research mentioned that *Scirpus grossus* was able to remove up to 81.5 % TPH, with the maximum extraction of diesel reaching 223.5 mg/kg [55]. Other plant species, *Festuca arundinacea* and *Lathyrus sativus*, achieved 54 % and 46 % of diesel removal from contaminated soil, respectively [56]. Diesel removal performance in phytoremediation is highly related to plant species and initial concentrations, which affect the degradation mechanisms and plant metabolism [16,57,58].



Fig. 3. Optimized Condition of TPH treatment in various operational parameters.



(a)



(b)



(c)

Fig. 4. (A) Desirability for optimized conditions during TPH removal; (b) TPH concentration in sand under optimized conditions; and (c) TPH concentration in plants under optimized conditions.

3.4. Effect of rhizobacterial addition

Growth changes expressed in wet and dry weight throughout the optimization study are depicted in Fig. 4. During the optimization study, the wet and dry weight of plants in the treatment with the addition of rhizobacteria was significantly higher than without the addition of rhizobacteria. This result indicated that the addition of rhizobacteria may support the growth of plants, as indicated by the

Table 4

Result of Confirmation run at optimum conditions.

Parameter	Predicted value by RSM model (mg/kg)	Experimental results from validation run (mg/kg)	Error (%)
TPH concentration in sand	17.1	18.7	9.1
TPH concentration in plants	325.6	325.2	0.1

significant increment in not only wet but also dry weight [5,24,28]. The increase in dry weight is clear evidence of cell growth, while the increase in wet weight might be biased due to the higher water uptake by plants [59–61]. Based on Fig. 4, at the end of the optimization period (Day 72), it was found that the wet and dry weight of plants given the addition of rhizobacteria was significantly higher than without the addition of rhizobacteria. Rhizobacteria may promote the growth of plants via several interactions, including phytostimulation, biofertilization, and biocontrol [62–64]. Phytostimulation is a phenomenon in which rhizobacteria release growth hormones, benefiting the host plant [65]. Biofertilization is a mechanism related to nitrogen fixation that converts nitrogen gas into ammonium, which is easier to uptake by plants [62]. In addition to that, rhizobacteria may also produce antibiotics and siderophores, which protect the host plant from phytopathogens and abiotic stress [62].

In general, the TPH concentration in the sand decreased with both treatments. In the treatment without the addition of rhizobacteria, the TPH concentration ranged between 18.7 ± 0.94 and $74.1 \pm 3.7 \text{ mg/kg}$ (Fig. 5). The TPH concentration in the sand at the beginning of the study was compared to that at the end of the study period, and the percentage of TPH removal in the sand was 42.3 ± 2.1 %. The TPH concentration range in sand on treatment with the addition of rhizobacteria was 16.2 ± 0.81 to $43.3 \pm 2.2 \text{ mg/kg}$. The percentage of TPH removal achieved on day 72 under rhizobacteria addition was 51.9 ± 2.6 % with an increment of 9.6 % (p > 0.05) compared to the non-rhizobacteria addition. Based on statistical analysis, the addition of rhizobacteria made a not-significant difference in the TPH concentration in the sand. This result might have occurred since the measurement of compounds was TPH. The non-complete degradation of hydrocarbon compounds by rhizobacteria may still be counted during the TPH measurement in soil, thus resulting in no significant difference in the TPH concentration of hydrocarbon compounds in plants [66] (see Fig. 6).

The concentration of TPH in plants treated without the addition of rhizobacteria increased from day 0 to day 14. After that, the TPH concentration decreased and increased again until the 42nd day and decreased so that it reached a concentration of 325.2 ± 16.3 mg/ kg at the end of the study period (72 days). The TPH concentration in plants at the start of the study was 207.5 ± 10.4 mg/kg (Fig. 5), resulting in an increase of 56.8 % for the TPH concentration in plants. The TPH concentration in plants treated with the addition of rhizobacteria shows the same trend. The TPH concentration in plants increased from day 0 to day 14 and decreased on day 28. On day 42, the TPH concentration in plants increased and decreased at the end of the study period (day 72). The TPH concentration in plants on that day was 414 ± 20.7 mg/kg. If the TPH concentration in plants at the end of the study period was compared to the beginning of the study period, it shows that there is an increase in the concentration of 117.4 % with a significant difference of 60.6 % (p < 0.05). The concentration of TPH in plants for treatment with the addition of rhizobacteria is mostly located in the roots of plants, and the addition of rhizobacteria can increase TPH and polycyclic aromatic hydrocarbons (PAH) uptake by plants significantly. A similar result was obtained by Al-Baldawi et al. [24], which stated that the addition of three rhizobacteria assisted in the removal of TPH form soil by promoting the degradation of petroleum-related hydrocarbons into simpler compounds that can be absorbed more easily by plants. In addition, plants may provide a good environment for bacterial growth by excreting exudates, which promote rhizobacterial growth, resulting in the higher degradation of TPH in the rhizosphere area [9,59,67]. This is also indicated by the higher wet



Fig. 5. Effect of rhizobacterial addition on plant growth. The asterisk (*) symbol indicates a significant difference (p < 0.05) in weight between without and with rhizobacterial addition.



Fig. 6. Effect of rhizobacterial addition to the TPH concentration. The different letters above the bar (a–b) indicate a significant difference (p < 0.05) in TPH concentration between without and with rhizobacterial addition.

and dry weight of plants in the treatment with the addition of rhizobacteria versus without the addition of rhizobacteria [68–70]. However, based on statistical analysis, the addition of bacteria did not make a significant difference in the TPH concentration in plants.

4. Conclusions

Optimization of diesel-contaminated sand phytoremediation using Response Surface Methodology (RSM) showed that *Scirpus mucronatus* was feasible to use as a treatment agent. Under optimized conditions of an initial diesel concentration of 50 mg/kg, an aeration rate of 0.6 L/min, and a retention time of 72 days, a total of 42.3 ± 2.1 % total petroleum hydrocarbon (TPH) removal can be achieved. The model generated from the Box Behnken Design (BBD) showed a total 9.1 % error for TPH concentration in sand, while showing 0 % error for TPH concentration in plants when compared to the experimental data. The addition of rhizobacteria (*Bacillus subtilis* and *Bacillus licheniformis*) had no significant effect on the plant's growth parameter while giving a significant increment to the TPH removal from sand. A total of 9.6 % increment in TPH removal was obtained in the reactor with rhizobacteria addition. The obtained model and data were suggested to be adaptable to be scaled up with criteria of initial diesel concentration ranged between 50 and 3000 mg/kg.

CRediT authorship contribution statement

Ipung Fitri Purwanti: Conceptualization, Formal analysis, Investigation, Writing – original draft. **Siti Rozaimah Sheikh Abdullah:** Conceptualization, Data curation, Methodology, Supervision, Writing – original draft. **Ainon Hamzah:** Funding acquisition, Supervision. **Mushrifah Idris:** Funding acquisition, Supervision. **Hassan Basri:** Funding acquisition, Supervision. **Mohd Talib Latif:** Funding acquisition, Supervision. **Muhammad Mukhlisin:** Funding acquisition, Supervision. **Setyo Budi Kurniawan:** Data curation, Visualization, Writing – original draft, Writing – review & editing. **Muhammad Fauzul Imron:** Writing – original draft.

Declaration of competing interest

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

Acknowledgement

The authors would like to acknowledge Universiti Kebangsaan Malaysia for funding this research project through GUP-2022-022 grant.

References

- X. Han, X. Lu, R.D. Vogt, An optimized density-based approach for extracting microplastics from soil and sediment samples, Environ. Pollut. 254 (2019), https:// doi.org/10.1016/j.envpol.2019.113009.
- [2] T. Rasheed, S. Shafi, M. Bilal, T. Hussain, F. Sher, K. Rizwan, Surfactants-based remediation as an effective approach for removal of environmental pollutants—a review, J. Mol. Liq. 318 (2020), https://doi.org/10.1016/j.molliq.2020.113960.
- [3] E.R. Chellaiah, Cadmium (heavy metals) bioremediation by Pseudomonas aeruginosa: a minireview, Appl. Water Sci. 8 (2018) 154, https://doi.org/10.1007/ s13201-018-0796-5.
- [4] H.I. Abdel-Shafy, M.S.M. Mansour, A review on polycyclic aromatic hydrocarbons: source, environmental impact, effect on human health and remediation, Egypt, J. Petrol. 25 (2016) 107–123, https://doi.org/10.1016/j.ejpe.2015.03.011.
- [5] S.R.S. Abdullah, I.A. Al-Baldawi, A.F. Almansoory, I.F. Purwanti, N.H. Al-Sbani, S.S.N. Sharuddin, Plant-assisted remediation of hydrocarbons in water and soil: application, mechanisms, challenges and opportunities, Chemosphere 247 (2020), 125932, https://doi.org/10.1016/j.chemosphere.2020.125932.
- [6] I.A. Al-Baldawi, Removal of 1,2-Dichloroethane from real industrial wastewater using a sub-surface batch system with Typha angustifolia L, Ecotoxicol, Environ. Saf. 147 (2018) 260–265, https://doi.org/10.1016/j.ecoenv.2017.08.022.

- [7] A.F. Almansoory, H.A. Hasan, S.R.S. Abdullah, M. Idris, N. Anuar, W.M. Al-Adiwish, Biosurfactant produced by the hydrocarbon-degrading bacteria: characterization, activity and applications in removing TPH from contaminated soil, Environ. Technol. Innov. 14 (2019), https://doi.org/10.1016/j. eti.2019.100347.
- [8] I.A. Allamin, M.I.E. Halmi, N.A. Yasid, S.A. Ahmad, S.R.S. Abdullah, Y. Shukor, Rhizodegradation of petroleum oily sludge-contaminated soil using Cajanus cajan increases the diversity of soil microbial community, Sci. Rep. 10 (2020), https://doi.org/10.1038/s41598-020-60668-1.
- [9] I.A. Allamin, N.A. Yasid, S.R.S. Abdullah, M.I.E. Halmi, M.Y. Shukor, Phyto-tolerance degradation of hydrocarbons and accumulation of heavy metals by of cajanus cajan (Pigeon pea) in petroleum-oily-sludge-contaminated soil, Agronomy 11 (2021), https://doi.org/10.3390/agronomy11061138.
- [10] M.F. Imron, S.B. Kurniawan, H.S. Titah, Potential of bacteria isolated from diesel-contaminated seawater in diesel biodegradation, Environ. Technol. Innov. 14 (2019), 100368, https://doi.org/10.1016/j.eti.2019.100368.
- [11] M.F. Imron, H.S. Titah, Optimization of diesel biodegradation by vibrio alginolyticus using Box-Behnken design, Environ. Eng. Res. 23 (2018) 374–382, https:// doi.org/10.4491/eer.2018.015.
- [12] S. Trapp, A. Köhler, L.C. Larsen, K.C. Zambrano, U. Karlson, Phytotoxicity of fresh and weathered diesel and gasoline to willow and poplar trees, J. Soils Sediments 1 (2001) 71–76, https://doi.org/10.1007/bf02987712.
- [13] T.J. Mooney, C.K. King, J. Wasley, N.R. Andrew, Toxicity of diesel contaminated soils to the subantarctic earthworm Microscolex macquariensis, Environ. Toxicol. Chem. 32 (2013) 370–377, https://doi.org/10.1002/etc.2060.
- [14] T.F. Gibson, W.O. Watanabe, T.M. Losordo, R.F. Whitehead, P.M. Carroll, Evaluation of chemical polymers as coagulation aids to remove suspended solids from marine finfish recirculating aquaculture system discharge using a geotextile bag, Aquacult. Eng. 90 (2020), https://doi.org/10.1016/j.aquaeng.2020.102065.
 [15] S. Gluhar, A. Kaurin, D. Lestan, Soil washing with biodegradable chelating agents and EDTA: technological feasibility, remediation efficiency and environmental
- [15] S. Gluhar, A. Kaurin, D. Lestan, Soil washing with biodegradable chelating agents and EDTA: technological feasibility, remediation efficiency and environmental sustainability, Chemosphere 257 (2020), https://doi.org/10.1016/j.chemosphere.2020.127226.
 [16] M.F. Imron, N. I. Ismail, S.B. Kurniawan, S.B.S. Abdullah, Future challenges in diesel biodegradation by bacteria isolates: a review, J. Clean, Prod. 251 (2020).
- [16] M.F. Imron, N.'.I. Ismail, S.B. Kurniawan, S.R.S. Abdullah, Future challenges in diesel biodegradation by bacteria isolates: a review, J. Clean. Prod. 251 (2020), 119716, https://doi.org/10.1016/j.jclepro.2019.119716.
- [17] A.A. Khadayeir, A.H. Wannas, F.H. Yousif, Effect of applying cold plasma on structural, antibacterial and self cleaning properties of α-Fe2O3 (HEMATITE) thin film, Emerg. Sci. J. 6 (2022) 75–85, https://doi.org/10.28991/ESJ-2022-06-01-06.
- [18] W.N. Wan Ismail, M.I. Arif Irwan Syah, N.H. Abd Muhet, N.H. Abu Bakar, H. Mohd Yusop, N. Abu Samah, Adsorption behavior of heavy metal ions by hybrid inulin-TEOS for water treatment, Civ. Eng. J. 8 (2022) 1787–1798, https://doi.org/10.28991/CEJ-2022-08-09-03.
- [19] P. Tunsagool, P. Kruaweangmol, A. Sunpapao, A. Kuyyogsuy, J. Jaresitthikunchai, S. Roytrakul, W. Vongsangnak, Global metabolic changes by Bacillus cyclic lipopeptide extracts on stress responses of para rubber leaf, Emerg. Sci. J. 7 (2023) 974–990, https://doi.org/10.28991/ESJ-2023-07-03-022.
- [20] M. Idris, N. Anuar, A.F. Almansoory, S.R.S. Abdullah, S.B. Kurniawan, Response and capability of Scirpus mucronatus (L.) in phytotreating petrol-contaminated soil, Chemosphere 269 (2021), 128760, https://doi.org/10.1016/j.chemosphere.2020.128760.
- [21] A.A. Kadir, S.R.S. Abdullah, B.A. Othman, H.A. Hasan, A.R. Othman, M.F. Imron, N. 'Izzati Ismail, S.B. Kurniawan, Dual function of lemna minor and Azolla pinnata as phytoremediator for palm oil mill effluent and as feedstock, Chemosphere 259 (2020), 127468, https://doi.org/10.1016/j. chemosphere.2020.127468.
- [22] L.P. Garcia, F.M.L. Gomes, S. Tfouni, E. Vicente, G.D. Savi, K. Santos, V.M. Scussel, Polycyclic aromatic hydrocarbons in commercial brands of dry whole soybeans for direct human consumption, Food Addit. Contam. Part B Surveill. 10 (2017) 15–20, https://doi.org/10.1080/19393210.2016.1240244.
- [23] T. Steliga, D. Kluk, Application of Festuca arundinacea in phytoremediation of soils contaminated with Pb, Ni, Cd and petroleum hydrocarbons, Ecotoxicol. Environ. Saf. 194 (2020), https://doi.org/10.1016/j.ecoenv.2020.110409.
- [24] I.A. Al-Baldawi, S.R.S. Abdullah, N. Anuar, I. Mushrifah, Bioaugmentation for the enhancement of hydrocarbon phytoremediation by rhizobacteria consortium in pilot horizontal subsurface flow constructed wetlands, Int. J. Environ. Sci. Technol. 14 (2017) 75–84, https://doi.org/10.1007/s13762-016-1120-2.
- [25] W.S. Alves, N.S. Santos, F.F. Baroca, B.P.D. Alves, R.O. Nunes, G.C.D. Abrahão, E.A. Manoel, M.R. Soares, The influence of polycyclic aromatic hydrocarbons in protein profile of Medicago sativa L, Int. J. Phytoremediation 23 (2021) 426–435, https://doi.org/10.1080/15226514.2020.1825324.
- [26] W. Subramonian, T.Y. Wu, S.P. Chai, A comprehensive study on coagulant performance and floc characterization of natural Cassia obtusifolia seed gum in treatment of raw pulp and paper mill effluent, Ind. Crops Prod. (2014), https://doi.org/10.1016/j.indcrop.2014.06.055.
- [27] B.V. Tangahu, S.R. Sheikh Abdullah, H. Basri, M. Idris, N. Anuar, M. Mukhlisin, A review on heavy metals (As, Pb, and Hg) uptake by plants through phytoremediation, Int. J. Chem. Eng. 2011 (2011) 1–31, https://doi.org/10.1155/2011/939161.
- [28] M. Idris, M.I. Effendi Halmi, N. Izzati Ismail, S.R.S. Abdullah, S.B. Kurniawan, N.H. AL Sbani, O.H. Jehawi, H.A. Hasan, Applying rhizobacteria consortium for the enhancement of Scirpus grossus growth and phytoaccumulation of Fe and Al in pilot constructed wetlands, J. Environ. Manag. 267 (2020), 110643, https:// doi.org/10.1016/j.jenvman.2020.110643.
- [29] O.H. Jehawi, I.N. Ismail, M. Idris, N.H. Al Sbani, M.H. Muhamad, H.A. Hasan, M. Idris, S.R.S. Abdullah, S.B. Kurniawan, Performance of pilot Hybrid Reed Bed constructed wetland with aeration system on nutrient removal for domestic wastewater treatment, Environ. Technol. Innov. 19 (2020), 100891, https://doi. org/10.1016/j.eti.2020.100891.
- [30] I.F. Purwanti, A. Obenu, B.V. Tangahu, S.B. Kurniawan, M.F. Imron, S.R.S. Abdullah, Bioaugmentation of Vibrio alginolyticus in phytoremediation of aluminium-contaminated soil using Scirpus grossus and Thypa angustifolia, Heliyon 6 (2020), e05004, https://doi.org/10.1016/j.heliyon.2020.e05004.
- [31] S. Mohan, A. Tippa, Role of wetland soil bacteria in enhancing the phytoremediation process through bioavailability phenomenon, 2019, World Environ. Water Resour. Congr. 2019 Groundwater, Sustain. Hydro-Climate/Climate Chang. Environ. Eng. - Sel. Pap. from World Environ. Water Resour. Congr. (2019) 1–10, https://doi.org/10.1061/9780784482346.001.
- [32] D.A. Ningsih, M.F. Imron, B.V. Tangahu, S.B. Kurniawan, Study of BOD and COD removal in batik wastewater using Scirpus grossus and Iris pseudacorus with intermittent exposure system, J. Ecol. Eng. 20 (2019) 130–134, https://doi.org/10.12911/22998993/105357.
- [33] I.A. Al-Baldawi, S.R.S. Abdullah, F. Suja, N. Anuar, I. Mushrifah, Effect of aeration on hydrocarbon phytoremediation capability in pilot sub-surface flow constructed wetland operation, Ecol. Eng. 61 (2013) 496–500, https://doi.org/10.1016/j.ecoleng.2013.10.017.
- [34] B.V. Tangahu, S.R.S. Abdullah, H. Basri, M. Idris, N. Anuar, M. Mukhlisin, Phytoremediation of wastewater containing lead (Pb) in pilot reed bed using Scirpus grossus, Int. J. Phytoremediation 15 (2013) 663–676, https://doi.org/10.1080/15226514.2012.723069.
- [35] I.F. Purwanti, Identification of diesel-tolerant rhizobacteria of Scirpus mucronatus, Afr. J. Microbiol. Res. 6 (2012), https://doi.org/10.5897/AJMR11.1454.
- [36] P.P. Pranowo, H.S. Titah, Isolation and screening of diesel-degrading bacteria from the diesel contaminated seawater at Kenjeran beach, Surabaya, EnvironmentAsia, 7 (2014) 104–111, https://doi.org/10.14456/ea.2016.21.
- [37] I.F. Purwanti, S.R.S. Abdullah, A. Hamzah, M. Idris, H. Basri, M. Mukhlisin, M.T. Latif, Biodegradation of diesel by bacteria isolated from Scirpus mucronatus rhizosphere in diesel-contaminated sand, Adv. Sci. Lett. 21 (2015) 140–143, https://doi.org/10.1166/asl.2015.5843.
- [38] I.F. Purwanti, D.Y. Simanjuntak, S.B. Kurniawan, Toxicity test of aluminium to Vibrio alginolyticus as a preliminary test of contaminated soil remediation, in: AIP Conf. Proc, 2018, https://doi.org/10.1063/1.5082435.
- [39] I.F. Purwanti, S.B. Kurniawan, D.Y. Simanjuntak, Removal of aluminium in contaminated soil using locally isolated vibrio alginolyticus, J. Ecol. Eng. 20 (2019) 135–140, https://doi.org/10.12911/22998993/99742.
- [40] M. Lister, E. Stevenson, D. Heeg, N.P. Minton, S.A. Kuehne, Comparison of culture based methods for the isolation of Clostridium difficile from stool samples in a research setting, Anaerobe 28 (2014) 226–229, https://doi.org/10.1016/j.anaerobe.2014.07.003.
- [41] N. Zhang, W. Lan, Q. Wang, X. Sun, J. Xie, Antibacterial mechanism of Ginkgo biloba leaf extract when applied to Shewanella putrefaciens and Saprophytic staphylococcus, Aquac. Fish. 3 (2018) 163–169, https://doi.org/10.1016/j.aaf.2018.05.005.
- [42] M.F. Imron, S.B. Kurniawan, The effect of tidal fluctuation on the accumulation of plastic debris in the Wonorejo River Estuary, Surabaya, Indonesia, Environ. Technol. Innov. 15 (2019), 100420, https://doi.org/10.1016/j.eti.2019.100420.
- [43] M.F. Imron, S.B. Kurniawan, Seasonal variation of plastic debris accumulation in the estuary of Wonorejo River, Surabaya, Indonesia, Environ. Technol. Innov. 16 (2019), 100490, https://doi.org/10.1016/j.eti.2019.100490.

- [44] N.K. Sharma, E.A. Cudney, Signal-to-noise ratio for operating window using unified methodology, Concurr. Eng. Res. Appl. 17 (2009) 173–181, https://doi.org/ 10.1177/1063293X09343334.
- [45] S. Rheem, I. Rheem, S. Oh, Response surface methodology using a fullest balanced model: a Re-analysis of a dataset in the Korean journal for food science of animal resources, Korean J. Food Sci. Anim. Resour. 37 (2017) 139–146, https://doi.org/10.5851/kosfa.2017.37.1.139.
- [46] J. Liu, J. Wang, C. Leung, F. Gao, A multi-parameter optimization model for the evaluation of shale gas recovery enhancement, Energies 11 (2018) 654, https:// doi.org/10.3390/en11030654.
- [47] I.L. Motta, A.N. Marchesan, R.M. Filho, M.R.W. Maciel, Optimization of Biomass Circulating Fluidized Bed Gasifier for Synthesis Applications Using Simulation and Response Surface Methodology, 2020, pp. 1585–1590, https://doi.org/10.1016/B978-0-12-823377-1.50265-2.
- [48] N.M. Sidek, M.R. Othman, Exergoeconomic assessment of the optimised vapour-recompression assisted column for palm-based fatty acid fractionation (2022) 433–438, https://doi.org/10.1016/B978-0-323-95879-0.50073-4.
- [49] T.-H. Hejazi, A scenario-based desirability function for correlated multi-response optimization problems considering modeling and implementation errors, J. Comput. Sci. 63 (2022), 101764, https://doi.org/10.1016/j.jocs.2022.101764.
- [50] G.L. Boylan, B.R. Cho, Solving the multidisciplinary robust parameter design problem for mixed type quality characteristics under asymmetric conditions, Qual. Reliab. Eng. Int. 30 (2014) 681–695, https://doi.org/10.1002/qre.1520.
- [51] F. Subari, M.A. Kamaruzzaman, S.R. Sheikh Abdullah, H.A. Hasan, A.R. Othman, S.R.S. Abdullah, H.A. Hasan, A.R. Othman, Simultaneous removal of ammonium and manganese in slow sand biofilter (SSB) by naturally grown bacteria from lake water and its diverse microbial community, J. Environ. Chem. Eng. 6 (2018) 6351–6358, https://doi.org/10.1016/j.jece.2018.09.053.
- [52] T. Taghizadeh, A. Talebian-Kiakalaieh, H. Jahandar, M. Amin, S. Tarighi, M.A. Faramarzi, Biodegradation of bisphenol A by the immobilized laccase on some synthesized and modified forms of zeolite Y, J. Hazard Mater. 386 (2020), https://doi.org/10.1016/j.jhazmat.2019.121950.
- [53] Y. Peng, U. Khaled, A.A.A.A. Al-Rashed, R. Meer, M. Goodarzi, M.M. Sarafraz, Potential application of Response Surface Methodology (RSM) for the prediction and optimization of thermal conductivity of aqueous CuO (II) nanofluid: a statistical approach and experimental validation, Phys. A Stat. Mech. Its Appl. 554 (2020), https://doi.org/10.1016/j.physa.2020.124353.
- [54] M. Kumari, S.K. Gupta, Response surface methodological (RSM) approach for optimizing the removal of trihalomethanes (THMs) and its precursor's by surfactant modified magnetic nanoadsorbents (sMNP) - an endeavor to diminish probable cancer risk, Sci. Rep. 9 (2019), https://doi.org/10.1038/s41598-019-54902-8.
- [55] I.A. Al-Baldawi, S.R.S. Abdullah, N. Anuar, F. Suja, I. Mushrifah, Phytodegradation of total petroleum hydrocarbon (TPH) in diesel-contaminated water using Scirpus grossus, Ecol. Eng. 74 (2015) 463–473, https://doi.org/10.1016/j.ecoleng.2014.11.007.
- [56] S. Mottaghi, O. Bahmani, V.A. Pak, Phytoremediation of diesel contaminated soil using urban wastewater and its effect on soil concentration and plant growth, Water Supply 22 (2022) 8104–8119, https://doi.org/10.2166/ws.2022.312.
- [57] S.B. Kurniawan, A. Ahmad, N.S.M. Said, M.F. Imron, S.R.S. Abdullah, A.R. Othman, I.F. Purwanti, H.A. Hasan, Macrophytes as wastewater treatment agents: nutrient uptake and potential of produced biomass utilization toward circular economy initiatives, Sci. Total Environ. 790 (2021), 148219, https://doi.org/ 10.1016/j.scitotenv.2021.148219.
- [58] J. Alias, M.F. Imron, A.R. Othman, I.F. Purwanti, H.A. Hasan, S.B. Kurniawan, N.N. Ramli, N.S.M. Said, S.R.S. Abdullah, Practical limitations of bioaugmentation in treating heavy metal contaminated soil and role of plant growth promoting bacteria in phytoremediation as a promising alternative approach, Heliyon 8 (2022), e08995, https://doi.org/10.1016/j.heliyon.2022.e08995.
- [59] A.F. Al-Mansoory, M. Idris, S.R.S. Abdullah, N. Anuar, Phytoremediation of contaminated soils containing gasoline using Ludwigia octovalvis (Jacq.) in greenhouse pots, Environ. Sci. Pollut. Res. 24 (2017) 11998–12008, https://doi.org/10.1007/s11356-015-5261-5.
- [60] Y. Qian, X. Jia, T. Ding, M. Yang, B. Yang, J. Li, Occurrence and removal of bisphenol analogues in wastewater treatment plants and activated sludge bioreactor, Sci. Total Environ. 758 (2021), 143606, https://doi.org/10.1016/j.scitotenv.2020.143606.
- [61] A.F. Miranda, N.R. Kumar, G. Spangenberg, S. Subudhi, B. Lal, A. Mouradov, Aquatic Plants, Landoltia punctata, and Azolla filiculoides as Bio-Converters of Wastewater to Biofuel, Plants 9 (2020) 437, https://doi.org/10.3390/plants9040437.
- [62] S. Mushtaq, M. Shafiq, M.R. Tariq, A. Sami, M.S. Nawaz-ul-Rehman, M.H.T. Bhatti, M.S. Haider, S. Sadiq, M.T. Abbas, M. Hussain, M.A. Shahid, Interaction between bacterial endophytes and host plants, Front. Plant Sci. 13 (2023), https://doi.org/10.3389/fpls.2022.1092105.
- [63] H. Abu Hasan, M.H. Muhamad, S. Budi Kurniawan, J. Buhari, O. Husain Abuzeyad, Managing bisphenol A contamination: advances in removal technologies and future prospects, Water 15 (2023) 3573, https://doi.org/10.3390/w15203573.
- [64] M.F. Imron, Z.O. Flowerainsyah, D. Rosyidah, N. Fitriani, Y.G. Wibowo, A.A.F. Firdaus, S.B. Kurniawan, S.R.S. Abdullah, H.A. Hasan, Phytotechnology for domestic wastewater treatment: performance of Pistia stratiotes in eradicating pollutants and future prospects, J. Water Process Eng. 51 (2023), https://doi.org/ 10.1016/j.jwpe.2022.103429.
- [65] M. Kai, U. Effmert, B. Piechulla, Bacterial-plant-interactions: approaches to unravel the biological function of bacterial volatiles in the rhizosphere, Front. Microbiol. 7 (2016), https://doi.org/10.3389/fmicb.2016.00108.
- [66] W. Zhang, H. Duo, S. Li, Y. An, Z. Chen, Z. Liu, Y. Ren, S. Wang, X. Zhang, X. Wang, An overview of the recent advances in functionalization biomass adsorbents for toxic metals removal, Colloids Interface Sci. Commun. 38 (2020), https://doi.org/10.1016/j.colcom.2020.100308.
- [67] N.H. Al Sbani, S.R.S. Abdullah, M. Idris, H.A. Hasan, M.I.E. Halmi, O.H. Jehawi, N.I. 'Izzati Ismail, PAH-degrading rhizobacteria of Lepironia articulata for phytoremediation enhancement, J. Water Process Eng. 39 (2021), 101688, https://doi.org/10.1016/j.jwpe.2020.101688.
- [68] D.A.H. Nash, S.R.S. Abdullah, H.A. Hasan, M. Idris, N.F. Muhammad, I.A. Al-Baldawi, N.I. Ismail, Phytoremediation of nutrients and organic carbon from sago mill effluent using water hyacinth (Eichhornia crassipes), J. Eng. Technol. Sci. (2019), https://doi.org/10.5614/j.eng.technol.sci.2019.51.4.8.
- [69] S.Y. Taha, A.F. Almansoory, I.A. Al-Baldawi, S.R.S. Abdullah, N. 'Izzati Ismail, M. Hazaimeh, S.S.N. Sharuddin, Hybrid constructed wetland for treatment of power plant effluent polluted with hydrocarbons, J. Water Process Eng. 56 (2023), 104372, https://doi.org/10.1016/j.jwpe.2023.104372.
- [70] I.A. Al-Baldawi, A.A. Mohammed, Z.H. Mutar, S.R.S. Abdullah, S.S. Jasim, A.F. Almansoory, N. 'Izzati Ismail, Application of phytotechnology in alleviating pharmaceuticals and personal care products (PPCPs) in wastewater: source, impacts, treatment, mechanisms, fate, and SWOT analysis, J. Clean. Prod. 319 (2021), 128584, https://doi.org/10.1016/j.jclepro.2021.128584.