

The Importance of Adopting Response Surface Methodology to Optimize the Flow and Heat Transfer of Carbon Nanotube Nanofluid over a Stretching or Shrinking Sheet

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1. Introduction

Research into optimizing heat transmission through nanofluids has greatly increased over the past five years. Our current understanding indicates that the optimization of heat transport in nanofluids has predominantly emphasized experimental studies compared to numerical data. Due to the challenges in visualizing heat transfer profiles through laboratory trials, the optimization process for heat transfer has transitioned to manipulating numerical simulations. In order to optimize the numerical results of heat transfer in nanofluid characteristics, researchers have utilized several

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prediction models, including response surface methodology (RSM) and artificial neural networks (ANN).

RSM is a robust technique for optimizing responses by integrating multiple factors or inputs using both mathematical and statistical analysis. As RSM is a critical tool to optimize and improve experimental designs, scientists such as Najiyah *et al.*, Mehmood *et al.*, Sheikh *et al.*, and Najiyah *et al.,* [\[1-](#page-16-0)[4\]](#page-17-0), have employed RSM to optimize the heat transfer characteristics of nanofluids across various geometries and effects. The quadratic regression model can be utilized to attain the optimal response point, specifically for heat transfer coefficients. Multiple studies and reviews, including those by Regi *et al.,* and Kim *et al.,* [\[5,](#page-17-1)[6\]](#page-17-2), have demonstrated that RSM delivers plenty of benefits for experimental design in optimization, as this method can be executed with a few and limited number of experimental trials. Despite offering diverse advantages, RSM also has some limitations, especially when we want to investigate beyond the range of evaluation factors. This is because, RSM has primarily focused on local analysis, as stated by Veza *et al.,* [\[7\]](#page-17-3).

Nanofluid, a powerful medium, acts as an engineered fluid to increase the rate of heat transfer through several devices. Akaje and Olajuwon, Samat *et al.*, and Yahaya *et al.,* [\[8-](#page-17-4)[10\]](#page-17-5) are among the most recent researchers investigating nanofluids. But research on nanofluids continues to exhibit empirical gaps, as Merkin *et al.,* [\[11\]](#page-17-6) assert that this field remains under development. Since the groundbreaking study by Choi and Eastman *et al.,* [\[12\]](#page-17-7), the number of studies on nanofluid flow and heat transfer capabilities has increased. The notable thermophysical properties, mainly thermal and electrical conductivity, have surpassed typical heat transfer fluids such as water and kerosene. Also, the powerful properties of nanofluid are mostly due to the large surface area of nanoparticles (NP), with copper (Cu) and aluminum oxide (Al₂O₃) becoming the most favorable NP. Sidik *et al.*, Japar *et al.,* Loon *et al*., and Aziz *et al.,* [\[13-](#page-17-8)[16\]](#page-17-9) extensively discussed the benefits of using nanofluid in numerous applications. Practically, the preparation of nanofluids which combine NP (with low concentration) and a base water can be done through the single and two-phase methods. Zafar *et al.,* [\[17\]](#page-17-10) recommended the application of the Tiwari and Das model (single-phase model) to mathematically formulate nanofluid models across various surfaces and physical situations. The suggestion from Zafar *et al.,* [\[17\]](#page-17-10) is beneficial for further exploration into thermal management systems. However, this team proposed redirecting the selection of NP based on Cu to an alternative possible NP.

Khoswan *et al.,* [\[18\]](#page-17-11) suggested focusing more on carbon nanotube (CNT) for selecting NP for nanofluid. Afrand *et al.,* [\[19\]](#page-17-12) had already made this choice because CNT, especially single (SWCNT) and multi (MWCNT)-walled CNT, was found to have the best thermal conductivity compared to other common NP. Despite having excellent thermal physical properties, the number of investigations using both SWCNT and MWCNT is considered low. Given the significant gap in research on CNT nanofluid, it is crucial to extensively formulate nanofluid flow-base CNT nanofluid, which has the potential to enhance nanofluid flow behavior and heat transfer.

The examination of nanofluid flow over stretchable and shrinkable sheets has substantially intensified since Crane's [\[20\]](#page-17-13) initial study in 1970. According to Swapna *et al*., [\[21\]](#page-17-14), a stretching sheet refers to a sheet that moves away from a stagnation point along the x -axis. A shrinking sheet can be defined as a movement of a sheet approaching the stagnation point along the x -axis. Both of the sheet movements can be displayed in Figure 1. Practically, innovations in nanofluid flow in this context can enhance applications in cooling systems, polymer processing, and the glass extrusion sector. Bachok *et al*., [\[22\]](#page-18-0) revealed that stagnation point flow across a stretching/shrinking sheet in nanofluid markedly enhanced the heat transfer process. Yashkun *et al.,* [\[23\]](#page-18-1) used different kinds of nanofluids, such as copper-water (Cu-H₂O), aluminum-water (Al₂O₃-H₂O), and titanium dioxide-water $(TiO₂-H₂O)$, to show that the suction and slip effects improved the flow of heat along a sheet that

could expand and contract. Recently, Mahabaleshwar *et al.,* [\[24\]](#page-18-2) utilized the combination of black iron oxide and water-based nanofluid ($Fe₃O₄-H₂O$) to show the efficiency of the thermal process over a stretching sheet under the radiation effect. The research, based on the Casson nanofluid model, revealed that increasing the stretching parameter reduced the velocity profile.

Norzawary *et al*., [\[25\]](#page-18-3) conducted one of the initial investigations of CNT nanofluid flow and heat transmission over a stretching and shrinking sheet. This team proved that an increased volume fraction of CNT, along with the effect of injection, accelerated flow separation. Furthermore, they observed that the performance of SWCNT surpassed that of MWCNT in terms of both skin friction and heat transfer coefficients. A year later, Mahabaleshwar *et al.,* [\[26\]](#page-18-4) executed an investigation of CNT flow over a similar surface under the mass transpiration effect. It was shown that the mass transpiration effect made the boundary layer much thicker in both SWCNT and MWCNT nanofluid flows. Recently, Mahabaleshwar *et al.,* [\[27\]](#page-18-5) completed a study on the flow of CNT through an extending and contracting sheet, accounted for the effects of thermal radiation. Their findings indicated that the velocity and temperature profiles of SWCNT water nanofluid surpassed those of MWCNT water nanofluid.

Fig. 1. CNT nanofluid flow over a (a) stretching sheet (b) shrinking sheet

Motivated by the above studies and the potential to contribute to a better understanding of CNT nanofluid flow and heat transfer characteristics, we decided to extend several previously worked studies. The debate over whether SWCNT or MWCNT performs better in heat transfer enhancement also influences our motivation. Samat *et al.,* [\[28\]](#page-18-6) concluded that SWCNT surpasses MWCNT in heat transfer rate, while Kang *et al*., [\[29\]](#page-18-7) reported opposing results.

The current model incorporates the influences of the magnetohydrodynamics (MHD) effect. Sahin and Namli [\[30\]](#page-18-8) reported experimentally that MHD can enhance the heat transfer rate up to 60% due to magnetic field and Lorentz force effects. To the best of our knowledge, the existing research has not yet examined CNT nanofluid motion on a stretching and shrinking plate under both impacts. The gap has created significant opportunities to investigate this effect through numerical and optimization methods. Consequently, by formulating a new mathematical correlation for the magnetic parameter related to the CNT nanofluid, our present study can address a substantial deficiency in prior models. The incorporation of both physical components is crucial for the establishment of predictive models for boundary layer separation. Many devices require flow controllers that have the capability to maintain the laminar phase for an extended duration. In developing the mathematical correlation of the magnetic effect, we take into account the electrical conductivity features of CNT as previously discussed in Jaafar *et al.,* [\[31\]](#page-18-9). Numerous models in literature have overlooked the impact of the electrical conductivity characteristics of nanoparticles. We compare the development of previous models with the current model, as shown in Table 1, in order to summarize the gap in boundary layer nanofluid flow over a stretching/shrinking sheet.

To enhance the originality of our study, we conduct innovative work by integrating both numerical and RSM methodologies. The significance of the study lies in the potential enhancement of mathematical analysis and engineering interest through the integration of these approaches. To create a comprehensive model, we established the following objectives:

- i. To formulate a mathematical model of CNT nanofluid flow and heat transfer over a stretchable and shrinkable sheet under the influence of MHD effect;
- ii. To determine the range of solutions for the reduced skin friction, $f''(0)$, and heat transfer, $-\theta'(0)$, coefficients;
- iii. To estimate the boundary layer separation resulting from variations in several parameters;
- iv. To optimize the heat transfer coefficient due to changes in multiple factors.

2. Mathematical Framework

2.1 Mathematical Modelling

We develop the mathematical model for this research using non-linear partial differential equations (PDE). The PDE is formulated based on the subsequent assumptions:

- i. The model is based on the Tiwari and Das Model [\[32\]](#page-18-10) (the single-phase mathematical nanofluid model);
- ii. The model is formulated using the two-dimensional (2D) Cartesian coordinate (x, y) system;
- iii. The CNT nanofluid motion is under steady, laminar, incompressible, and at stagnation point flow conditions with a constant body sheet temperature;
- iv. Two varieties of CNT nanofluids are employed: SWCNT-water and MWCNT-water nanofluids;
- v. The velocity u, is greater than the velocity v, i.e., $u >> v$.

Once the assumptions are established, we express the laminar CNT flow of the boundary layer approximation in PDE forms using the Norzawary *et al*., Mahabaleshwar *et al.*, and Mahabaleshwar *et al.,* models [\[25-](#page-18-3)[27\]](#page-18-5) as follows:

$$
\frac{\partial u}{\partial x} + \frac{\partial v}{\partial y} = 0,\tag{1}
$$

$$
u\frac{\partial u}{\partial x} + v\frac{\partial v}{\partial y} = \frac{\mu_{Cnf}}{\rho_{Cnf}}\frac{\partial^2 u}{\partial y^2} + U_{\infty}\frac{dU_{\infty}}{dx} + \left(\frac{\sigma_{Cnf}}{\rho_{Cnf}}B^2\right)(U_{\infty} - u)
$$
\n(2)

$$
u\frac{\partial T}{\partial x} + v\frac{\partial T}{\partial y} = \alpha_{Cnf} \frac{\partial^2 T}{\partial y^2},
$$
\n(3)

where U_{∞} , T, μ_{cnf} , ρ_{cnf} , σ_{cnf} , ρ_{cnf} , α_{cnf} , μ_f , and ρ_f , are the velocity of free stream, CNT nanofluid temperature, dynamic viscosity of CNT nanofluid, density of CNT nanofluid, electrical conductivity of CNT nanofluid, thermal diffusivity of CNT nanofluid, dynamic viscosity of water, and density of water, respectively. The term of the magnetic field, B, in Eq. (2) is represented as $B = B_0\sqrt{x}$, (refer to Jaafar *et al.,* and Samat *et al.,* [\[31-](#page-18-9)[33\]](#page-18-11)) where B_0 is a constant of magnetic field strength. Eqs. (1) to (3) are formulated subject to the following boundary conditions: at $y = 0$,

$$
u = U_w, v = 0, T = T_w,
$$
\n(1)

and as
$$
y \to \infty
$$
,

$$
u \to U_{\infty}, T \to T_{\infty}.\tag{2}
$$

The terms U_w (Eq. (4)), T_w (Eq. (4)), and T_∞ (Eq. (5)) illustrate the velocity at the boundary layer, the sheet temperature, and the ambient temperature, respectively. The expression for U_{∞} in Eq. (5) is represented linearly as $U_{\infty} = cx$, where c is a positive constant.

Next, we convert the PDE in Eqs. (1) to (5) into non-dimensional ordinary differential equations (ODE) to simplify them into a practical explanation. We manipulate the following similarity variables to transform PDE into ODE (see Waqar and Pop [\[34\]](#page-18-12)):

$$
\eta = \left(\frac{c}{v_f}\right)^{1/2} y, \psi = \sqrt{v_f} x f(\eta), T = (T_w - T_\infty)\theta(\eta) + T_\infty,
$$
\n(3)

where η , ψ , f , θ , $\nu_f = \mu_f/\rho_f$ define as non-dimensional boundary layer thickness, non-dimensional stream function, non-dimensional velocity stream function, non-dimensional temperature function, and the kinematic viscosity of water, respectively. The substitution of Eq. (6) into Eqs. to (1) to (5) successfully satisfies the continuity equation in Eq. (1). Additionally, we generate the following expressions for the transformed momentum and energy equations, along with the boundary conditions:

$$
\frac{C_1}{C_2} f'''(\eta) + f''(\eta) f(\eta) + M(1 - f'(\eta)) + 1 = 0,
$$
\n(4)\n
$$
\frac{1}{\Pr} \frac{C_3}{C_4} \theta''(\eta) + f(\eta) \theta'(\eta) = 0,
$$
\n(5)

subject to:

at $\eta = 0$,

$$
f'(\eta) = \varepsilon, f(\eta) = 0, \theta(\eta) = 1,\tag{6}
$$

and as $\eta \to \infty$,

$$
f'(\eta) \to 1, \theta(\eta) \to 0,\tag{7}
$$

where ε is a non-dimensional stretching/shrinking parameter. We designate the non-dimensional magnetic parameter, $M = \frac{\sigma_{Cnf}}{2}$ ρ_{cnf} B_0^2 $\frac{a_0}{c}$. The terms \mathcal{C}_1 , \mathcal{C}_2 , \mathcal{C}_3 , and \mathcal{C}_4 are defined as follows:

$$
C_1 = \frac{\mu_{cnf}}{\mu_f}, C_2 = \frac{\rho_{cnf}}{\rho_f}, C_3 = \frac{k_{cnf}}{k_f}, C_4 = \frac{(\rho c_p)_{cnf}}{(\rho c_p)_f}.
$$
\n(8)

To complete the discussion on model development, we present the thermal-physical properties of SWCNT, MWCNT, and water, as illustrated in Table 2. In addition, we provide the correlation of SWCNT-water and MWCNT-water nanofluid as depicted in Table 3. In Table 3, the symbol ϕ refers to the volume fraction of CNT.

Table 2

Thermal physical properties of SWCNT, MWCNT, and water (see Khan *et al.,* and Samat *et al.,* [\[36](#page-18-13)[,37\]](#page-18-14))

Table 3

Correlations of SWCNT-water and MWCNT-water nanofluids (see Khan *et al.,* and Samat *et al.,* [\[36,](#page-18-13)[37\]](#page-18-14)) **Correlations**

Note: The subscription of CNT and f refer to CNT and water, respectively.

2.2 Physical Quantities

In this section, we derive the skin friction, C_f , and the local Nusselt number (heat transfer coefficient), Nu_{x} , in their simplified versions. Based on Norzawary *et al.*, [\[25\]](#page-18-3), C_f and Nu_{x} can be written as follows:

$$
C_f = \frac{\tau_w}{\rho_f U^2}, N u_x = \frac{x q_w}{k_f (T_w - T_\infty)},
$$
\n(9)

where $U = U_w + U_\infty$ is a composite velocity (see Azfal *et al.*, [\[35\]](#page-18-15)). The terms τ_w and q_w can be described as below equations as the sheet shear stress and the heat flux, respectively: at $y = 0$,

$$
\tau_{w} = \mu_{Cnf} \frac{\partial u}{\partial y}, q_{w} = -k_{nf} \frac{\partial T}{\partial y}.
$$
\n(10)

Applying results from Section 2.1, we derive the skin friction and heat transfer coefficients in diminished forms related to the local Reynolds number, Re_x , as follows:

$$
C_f \sqrt{Re_x} = C_1 f''(0), \frac{Nu_x}{\sqrt{Re_x}} = -C_3 \theta'(0).
$$
\n(11)

2.3 Numerical Procedure

We solve the model using the bvp4c method in MATLAB version R2022b. Before accomplishing them numerically, we turn the higher-order ODE delineated in Eqs. (7) to (10) into first-order ODE. We organize the first-order ODE in Eqs. (7) to (10) as follows:

$$
y(1) = f(\eta), y(2) = f'(\eta), y(3) = f''(\eta), y(4) = \theta(\eta), y(5) = \theta'(\eta),
$$

\n
$$
f'''(\eta) = -\frac{C_2}{C_1} (f''(\eta)f(\eta) + M(1 - f'(\eta)) + 1),
$$

\n
$$
\theta''(\eta) = -Pr \frac{C_4}{C_3} f(\eta) \theta'(\eta).
$$
\n(12)

subject to

$$
ya(1) - \varepsilon = 0, ya(2) = 0, ya(4) - 1 = 0,
$$

\n
$$
yb(2) - 1 = 0, yb(4) = 0.
$$
\n(16)

The terms a is the boundary conditions near the body sheet, i.e., $\eta = 0$, and b is the boundary conditions for body sheet, i.e., $\eta \to \infty$. To achieve the convergence properties for the velocity, $f'(\eta)$, and temperature, $\theta(\eta)$, profiles, we set the tolerance limit of the model approximately to 10^{-6} .

2.4 Response Surface Methodology (RSM)

To carry out the RSM analysis of heat transmission over the stretching/shrinking sheet, we use the procedures established by Yahaya *et al.,* and Samat *et al.,* [\[38,](#page-18-16)[39\]](#page-18-17). The procedures are mentioned below:

- i. Identify independent factor(s) and response(s);
- ii. Develop a design of experimental (DOE) consists of (i);
- iii. Formulate the prediction models using (i);
- iv. Determine the optimal value of response(s).

The screening process for (i) includes choosing three independent factors that maximize two responses. The heat transfer coefficients for SWCNT-water and MWCNT-water nanofluids represent these responses.

In order to perform the RSM analysis with a sufficient number of simulation trials, we choose the second-order polynomial prediction model, as suggested previously by Husien *et al.,* [\[40\]](#page-18-18). Since we utilize the second-order polynomial prediction model, we express mathematically both SWCNTwater and MWCNT-water nanofluid prediction models using linear and quadratic terms. In addition, we conduct the RSM using the face-centered composite design (FCCD) method.

3. Results

3.1 Code Validation

To verify the accuracy of the programming code developed in section 2.3, we compare the data with the model of Bachok *et al.*, [\[22\]](#page-18-0). The comparison data is based on the solution $f''(0)$ with the values of $\varepsilon = \phi = 0$. Because we have arrived at an excellent agreement with the previous model as displayed in Table 4, we are confident that we can proceed with the generation of solutions with varying key parameters in this model.

3.2 Solutions f''(0)*and* − θ '(0)

In this section, we focus on determining the solutions $f''(0)$ and $-\theta'(0)$ due to the change in ε and M. We vary ε into two cases as follows:

- i. $\varepsilon > 0$ is defined as the sheet with stretching velocity;
- ii. $\varepsilon < 0$ is defined as the sheet with shrinking velocity.

To set the variation of M and ε , we select $M = 0.0.02,0.04$ and $-2 \le \varepsilon \le 2$, respectively. In addition, we establish Pr and ϕ at the constant values. We opt for a mixture of MWCNT and water as the main nanofluid in this section.

Based on the results in Figure 2 and Figure 3, we observe that the solutions $f''(0)$ and $-\theta'(0)$ consist of a single solution (the first solution) and multiple solutions (the first and second solutions). The single solution is produced in the stretching region, i.e., $\varepsilon > 0$, while the multiple solution is

generated when the sheet is shrunk, i.e., $\varepsilon_c \leq \varepsilon < 0$. The term ε_c in both Figure 2 and Figure 3 denote the critical point where the first and second solutions intersect. The creation of multiple solutions is advantageous in this model, as these solutions can be utilized to forecast flow separation resulting from variations in M . The postponement of flow separation caused by the presence of M may suggest that the magnetic effect serves as a flow regulator, potentially benefiting various industries. According to Figure 2 and Figure 3, we also see that as the value of M grows, the rate of flow detachment diminishes. Additionally, the increase in M leads to an expansion of the solutions $f''(0)$ and $-\theta'(0)$.

Fig. 2. Variation of solution $f''(0)$ due to the changes in M and ε

Fig. 3. Variation of solution $-\theta'(0)$ due to the changes in M and ε

3.3 Velocity and Temperature Profiles

This section aims to visualize the velocity $f'(\eta)$, and temperature, $\theta(\eta)$, profiles. The profiles are depicted as a result of alterations in M and η . We adjust the quantity of M within the range of 0 to 0.02, while leaving η grows up to a maximum of 15. In this numerical experiment, we choose SWCNTwater nanofluid by applying the constant values Pr , ϕ , and ε , as indicated in Figure 4 and Figure 5.

Fig. 4. Variation of velocity profile due to the changes in M and η

Fig. 5. Variation of temperature profile due to the changes in M and η

The outcomes provided in Figure 4 and Figure 5 clearly demonstrate that both profiles adhere to the convergence properties established in the boundary conditions (Eqs. (9) to (10)). Furthermore, the first and second solutions tend to be upward trend for thermal and velocity profiles, respectively. According to Khatun and Islam [\[44\]](#page-19-0), the magnetic field effect can influence the generation of the Lorentz force, which in turn has a positive effect on both profiles. The analysis of boundary layer thickness reveals that the second solution, as depicted in Figure 4 and Figure 5, is thicker than the first solution.

3.4 Skin Friction and Heat Transfer Coefficients

To examine the variation of skin friction and heat transfer coefficients in response to alterations in different parameters, we intend to modify the value of M . Since the model is adapted from the Tiwari and Das model [\[32\]](#page-18-10), we also take into account the variable value of ϕ . The range of values of M and ϕ are set at $M = 0.1, 0.2, 0.3$, while $0 \le \phi \le 0.1$. The other parameters are fixed unchanged at $Pr = 6.2$ and $\varepsilon = 0.5$. In addition, we employ both SWCNT-water and MWCNT-water nanofluids in order to evaluate their performance in terms of both coefficients. The comparison analysis between SWCNT-water and MWCNT-water nanofluids is conducted to provide engineers with insights for selecting the most effective CNT with optimal performance.

Based on the outcomes produced in Figure 6 and Figure 7, we can see that the positive impact for both coefficients is contributed due to the upward trends of M and ϕ . The rise in M induces the strength of the Lorenz force, which leads to an increase in both coefficients. The findings presented in Figure 6 and Figure 7 corroborate the results previously obtained by Sahin and Namli [\[30\]](#page-18-8) through experimental research. This team demonstrated that the heat transfer rate increased by up to 60% due to the sustained influence of the magnetic effect. The great influence of the magnetic field on both engineering interests potentially to be applied in real applications and devices. In addition, the growth in the value of ϕ increases the conductivity of both types of nanofluids, which contributes to the higher value of skin friction and heat transmission coefficients. The positive trend for both coefficients due to the rise in ϕ is contributed to by the excellent properties of CNT, particularly in thermal conductivity. However, in real practice, many applications should keep the volume fraction of CNT in low amounts to avoid the nanoparticle agglomeration problem. Omeiza *et al.,* [\[45\]](#page-19-1) described that the agglomeration issue is one of the major difficulties in applying nanofluids in real applications. The findings in Figure 6 and Figure 7 also demonstrate that SWCNT-water nanofluid outperforms MWCNT-water nanofluid in terms of skin friction coefficient and heat transport through the stretching/shrinking sheet.

In this section, we also extend our investigation by assessing the performance of mono-nanofluid and hybrid nanofluid regarding the skin friction coefficient and transfer rate. We assume that the hybrid nanofluid is synthesized by mixing both SWCNT and MWCNT in water to create a hybrid SWCNT-MWCNT-water nanofluid. Based on our previous discovery of the excellent performance of SWCNT-water nanofluid in Figure 6 and Figure 7, we have selected this combination to represent a mono CNT nanofluid. Since this model prioritizes the magnetic effect, we vary the value of \dot{M} by altering it from $M = 0$ to $M = 1$. Meanwhile, we hold onto constant values for Pr, ε , and the volume fractions of mono-CNT and hybrid CNT. Visualization in Figure 8 and Figure 9 indicates that the hybrid CNT nanofluid excels the mono-CNT nanofluid in both coefficients. The exceptional effectiveness of the hybrid CNT nanofluid has fulfilled the potential for future research, as highlighted by Navrotskaya *et al.,* [\[46\]](#page-19-2). This team encourages researchers to enhance their understanding of hybrid CNT nanofluid flow behavior to broaden their applications in biological and ecological sectors.

Fig. 6. Variation of skin friction coefficient due to the changes in M and ϕ

Fig. 7. Variation of heat transfer coefficient due to the changes in M and ϕ

Fig. 8. Comparison between the mono-CNT and hybrid CNT nanofluids for skin friction coefficient due to the changes in M

Fig. 9. Comparison between the mono-CNT and hybrid CNT nanofluids for heat transfer coefficient due to the changes in M

3.5 Optimization of Heat Transfer Coefficient

In this section, we develop the DOE for optimizing the heat transfer coefficient as required in Section 2.4. We display the DOE in Table 5 which consists of three main factors with their different limits. To select the factors, we select them based on Eqs(1) to (5) and the most significant parameter in the Tiwari and Das model [\[32\]](#page-18-10).

Table 5

Note: The symbol [] indicates the coded parameter in Minitab

Next, by referring to the Yahaya *et al.,* model [\[38\]](#page-18-16), we formulate the general quadratic model to predict the heat transfer coefficients for both SWCNT-water and MWCNT-water nanofluids. The models that consist of factors as in Table 5 are formulated below:

$$
y_{SWCNT} = D_0 + D_1 x_1 + D_2 x_2 + D_3 x_3 + D_{11} x_1^2 + D_{22} x_2^2 + D_{33} x_3^2 + D_{12} x_1 x_2 + D_{13} x_1 x_3 + D_{23} x_2 x_3 + \epsilon_1,
$$
\n(13)

and

$$
y_{MWCNT} = E_0 + E_1 x_1 + E_2 x_2 + E_3 x_3 + E_{11} x_1^2 + E_{22} x_2^2 + E_{33} x_3^2 + E_{12} x_1 x_2 + E_{13} x_1 x_3 + E_{23} x_2 x_3 + \epsilon_2,
$$
\n(14)

where y_{SWCNT} and y_{MWCNT} illustrate the heat transfer coefficients for SWCNT-water and MWCNTwater nanofluids, respectively. We provide the description of terms expressed in Eqs. (17) to (18) in Table 6.

To determine the number of trials for conducting the optimization process of the DOE in Minitab, we employ the following formula:

$$
N = 2F + 2F + C,
$$
\n⁽¹⁵⁾

where N, F, and C are the number of trials, factors, and center points, respectively. By replacing $F =$ 3 and $C = 6$ in Eq. [\(15\),](#page-13-2) we obtain $N = 20$. The arrangement of DOE with $N = 20$ can be viewed in Table 7.

Table 7

Design of experiment for the heat transfer coefficients of SWCNT-water and MWCNT-water nanofluids

Analysis of variance (ANOVA) is applicable for evaluating the significance of the DOE, according to Chan *et al.,* [\[41\]](#page-18-19). The properties of ANOVA consist of the degree of freedom (DF), adjusted sum of squares (Adj SS), adjusted mean square (Adj MS), F -value and p -value. By depending on p -value, Mahanthesh *et al.,* and Samat *et al.*, [\[42](#page-19-3)[,43\]](#page-19-4) determined that a model is statistically significance if pvalue is less than 0.05. As displayed in Table 8, all sources for the ANOVA finding in y_{SWCNT} exhibit significant terms, with the p-value < 0.05 , except for the term x_2^2 . Interestingly, in Table 9, we observe that the ANOVA outcome for y_{MWCNT} classifies all sources as significant elements.

Table 9

Because the term x_2^2 in Table 8 possesses the p-value > 0.05 , we remove this term from Table 8. The elimination of the term x_2^2 in Table 8 produces the reduced model for y_{SWCNT} . We demonstrate the ANOVA result for the reduced model for y_{SWCNT} in Table 10. Given the presence of significant sources in the ANOVA results presented in Table 9 and Table 10, we can develop comprehensive prediction models for both y_{SWCNT} and y_{MWCNT} . The mathematical formulations of these prediction models can be viewed in Eqs. (20) to (21).

Table 10

ANOVA result for the reduced model of heat transfer coefficient of SWCNT-water nanofluid

 $y_{SWCNT} = 1.60369 + 0.107210 x_1 + 0.004160 x_2 + 0.089730 x_3 - 0.002225 x_1^2$ $-$ 0.001125 x_3^2 + 0.000238 x_1x_2 + 0.002638 x_1x_3 + $-$ 0.000762 x_2x_3 , (16)

and

 $y_{MWCNT} = 1.57850 + 0.095450 x_1 + 0.004100 x_2 + 0.089640 x_3 - 0.001841 x_1^2$ $-0.000091x_2^2 - 0.001091x_3^2 + 0.000225x_1x_2 + 0.002600x_1x_3$ $-0.000750x_2x_3$. (17)

After developing the complete prediction models for both SWCNT-water and MWCNT-water, which incorporate statistically important variables as illustrated in Eqs. (20) to (21), we can proceed to identify the optimal solutions for each model. The optimal process is conducted using the response optimizer in Minitab. The outcomes of optimal solutions for both y_{SWCNT} and y_{MWCNT} are depicted in Table 11. With both models portraying 100% composite desirability values, the maximum heat transfer coefficients for both models arrive at the highest values of ϕ , M, and ε . As shown in the numerical approach in Section 3.4, we also confirm that SWCNT-water nanofluid works better than MWCNT-water nanofluid at transporting heat along the stretching/shrinking sheet using RSM analysis.

Table 11

4. Conclusions

We have conducted research on the boundary-layer flow of CNT-water nanofluid through the stretching/shrinking sheet under the MHD effect. We perform the investigation by employing numerical and RSM approaches. We have arrived at the following conclusions:

- i. If the sheet shrinks along the x -axis, the model generates multiple solutions.
- ii. The enhancement of the magnetic parameter expands the solution range and delays flow separation.
- iii. A boost in the volume fraction of CNT and magnetic parameters improves both skin friction and heat transfer coefficients.
- iv. The optimal heat transfer coefficient for CNT-water nanofluid is attained at the greatest values of CNT volume fraction, magnetic, and stretching parameters.
- v. Both numerical and RSM analyses confirm that SWCNT-water nanofluid outperforms MWCNT-water nanofluid in terms of heat transfer coefficient.

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