

www.jart.icat.unam.mx



Journal of Applied Research and Technology 21 (2023) 991-1018

Original

Modeling and parameters optimization of biocomposite using box-Behnken response surface methodology

M. Mittal^{a*} • K. Phutela^b

^aDepartment of Mechanical Engineering, Central University of Haryana, Mahendergarh (India)-123031 ^bDepartment of Food Technology, Ch. Bansilal Govt. Polytechnic, Bhiwani (India)-127021

> Received 06 24 2022; accepted 09 22 2022 Available 12 31 2023

Abstract: The primary objective of this work includes modeling and optimization of the mechanical properties of natural fiber biocomposites using three-factor, three-level Box-Behnken design (BBD). In this context, the effect of three independent performance parameters; pineapple leaf fiber (PALF) content, fiber length, and polyethylene-grafted-maleic anhydride (MAPE) compatibilizer load have been investigated on the mechanical properties of PALF/HDPE/MAPE biocomposite. The sequential model sum of squares, lack of fit, and normal probability plots showed a good agreement in between the experimental results and those predicted by mathematical models (95% confidence level). The optimization results obtained in Design-Expert software revealed that the most optimal value of tensile strength, tensile modulus, flexural strength, flexural modulus, and impact strength as 32.35 MPa, 1475 MPa, 49.21 MPa, 1659.04 MPa, and 58.24 J/m respectively, at fiber length of 13.67 mm, PALF content of 16.84 wt.%, and MAPE load of 2.95 wt.%. To verify the mathematical models, validation tests were also performed which showed that the response surface methodology (RSM) based BBD and ANOVA tools are adequate for analytically evaluating the performance of biocomposites.

Keywords: Box-Behnken design (BBD), response surface methodology (RSM), pineapple leaf fiber (PALF), high-density polyethylene (HDPE), mechanical properties, polyethylene-grafted-maleic anhydride (MAPE)

*Corresponding author. *E-mail address*: mohit.30mittal@gmail.com (M. Mittal). Peer Review under the responsibility of Universidad Nacional Autónoma de México.

1. Introduction

Environmental and economic concerns are stimulating research in the development of eco-friendly composites for several engineering applications. In this regard, researchers put their attention towards the utilization of low-cost lignocellulosic fibers, such as bamboo, jute, sisal, PALF, coir, ramie, etc. as reinforcements in petroleum-based thermoplastics. Owing to their exceptional features such as lightweight, renewability, biodegradability, easy availability, high specific strength & stiffness, good acoustic, thermal, and electrical insulation make them as promising candidates compared to inorganic fibers (Ali et al., 2017; Ali et al., 2018; Basu et al., 2017; Bodirlau et al., 2013; Holt et al., 2014; Khalil et al., 2007; Latif et al., 2015; Li et al., 2016; Qaiss et al., 2014; Salasinska et al., 2016; Shi et al., 2013).

Among all the natural cellulosic fibers, the PALF has significant potential to be used as a reinforcing agent in fiber or powder form. This is because of the presence of high cellulose content (70-85%), low-density, and low microfibrillar angle. Moreover, PALF is a waste product of pineapple cultivation and therefore relatively inexpensive which can be employed for industrial purposes (Arib et al., 2004; Mishra et al., 2001; Pavithran et al., 1987). The fibers derived from pineapple leaves have excellent characteristics for use in automotive, building & construction, packaging, and general engineering applications. According to the statistical database (2017) of 'Food and Agricultural Organization', the total production of pineapple fruit in the entire world is 25.8 million tons (FAOSTAT, 2017).

Studies showed that the PALF could be used effectively for polypropylene (PP), polyethylene (PE), thermoplastic starch, and rubber reinforcement (Kengkhetkit & Amornsakchai, 2012). In addition, its carbon footprint is much lower than that of other cultivated natural and synthetic fibers (Kengkhetkit & Amornsakchai, 2014). Although cellulosic fibers have number of advantageous features, they exhibit some problems such as hydrophilic nature, limited thermal stability, and poor dispersion characteristics within the non-polar thermoplastic matrix (Bledzki et al., 1998; Cantero et al., 2003; Kazayawoko et al., 1999; Raj et al.,1989). These limitations can be remedied by several methods like grafting functional moieties onto the fibers, introduction of coupling agents, or pre- treatment of fibers with suitable agents. There have been numerous studies conducted for improving the interfacial adhesion between natural fibers and the matrix.

Table 1 reported that the chemical treatment has profound influence on the mechanical properties of fiberreinforced composites (FRCs). It was observed that the use of a coupling agent containing maleic anhydride, polyethylenegrafted-maleic anhydride (MAPE) has not been addressed significantly. Therefore, in the present communication, the effect of maleic anhydride coupling agent on mechanical properties of PALF/HDPE/MAPE biocomposite was investigated. A review of the existing literature (Table 2) revealed that the fiber length and loading are the other critical parameters that can affect the thermo-mechanical properties of biocomposites. It was observed from literature review that most of the work includes one parameter effect at a time while keeping other at a fixed level. The interaction effect of various parameters has not been discussed so far. Therefore, to solve this problem, the design of experiment (DOE) method was used (Ashenai Ghasemi et al., 2016; Mhalla et al., 2017; Rostamiyan et al., 2014; Rostamiyan, Fereidoon, Mashhadzadeh et al., 2015; Rostamiyan, Fereidoon, Rezaeiashtiyani et al., 2015; Rostamiyan, Fereidoon, Nakhaei et al., 2017; Subasinghe et al., 2016; Ghasemi et al., 2016).

Several optimization techniques such as RSM, Taguchi method, full factorial, fractional factorial, ANN, fuzzy logic, and GA are available which have significant potential to optimize the performance parameters (Mohamed et al., 2015). Furthermore, these techniques have significant potential to develop models that can predict and established the relationship between different inputs and response variables. RSM is a promising analytical tool to determine the significance of interactions and square terms of parameters, 3D response surface generation, and optimize the parameters. A three-level BBD is economical and popular in industrial research for modeling and optimizing the parameters to satisfy the defined desirable response variables. Therefore, in this study, the Box-Behnken design (BBD) which is a subset of RSM was employed as a DOE method for optimizing the mechanical properties of HDPE/PALF/MAPE biocomposite. The individual and simultaneous effects of the fiber length, PALF loading, and MAPE compatibilizer content on tensile, flexural, and impact properties were investigated.

Authors	Chemical treatment of fibers	Results
(Siddique et al., 1984)	Grafting of jute fiber with vinyl polymer.	The moisture affinity of treated composite was less
		than the untreated one.
(Mwaikambo & Ansell,	Effect of alkaline treatment on	The thermal stability and mechanical properties of
2002)	properties of hemp, sisal, jute, and	cellulosic fibers were improved after alkaline
	kapok fibers.	treatment.
(Jandas et al., 2011)	Effect of alkalization and silane	Increase of tensile strength to 136%, and impact
	treatments on thermo-mechanical	strength to 49%. Thermal stability of BF treated
	properties of banana fiber (BF).	biocomposites also increased.
(John et al., 2008)	Effect of alkaline modification on the	The 4% NaOH treated composite exhibits maximum
	mechanical properties of Sisal/OPEFB	tensile strength and torque value.
	hybrid composite.	
(Tripathy et al., 2000)	Effect of cyanoethylation on moisture	The treated jute fiber exhibits better hydrophobicity
	absorption behavior of jute fiber.	than the untreated one.
(Dash et al., 2000)	Effect of alkaline treatment on	The Resin pick-up or wettability of jute fiber was
	interfacial wettability in Jute/Polyester	significantly improved after alkaline chemical
	composite.	treatment.
(Fung et al., 2003; Fung et	Effect of compatibilizer on the interfacial	The Interfacial adhesion between sisal fiber and
al., 2002; Joseph et al.,	bonding strength in sisal fiber reinforced	polyolefin matrix was improved after
1996; Mohanty, Verma et	polyolefin composites.	compatibilization.
al., 2004; Xie et al., 2002)		
(Mathew et al., 2004)	Effect of several chemical treatments	The mechanical properties of biocomposites were
	such as mercerization, acetylation,	significantly improved after chemical treatments.
	benzoylation, and silanation on the	
	mechanical properties of isora	
	fiber/natural rubber composites.	
(Venkateshappa et al.,	Effect of alkaline treatment on	The tensile, flexural, and compressive strengths of
2012)	mechanical properties of areca/epoxy	Areca/Epoxy composites were improved after the alkali
(Carcía Harpándaz at al	Effect of chemical treatments on	The interfacial adhesion and chear strength (IESS) of
	interfacial bonding strongth in	hagassa/polyactar compositos wara improved after
2004)	hagasse/polyester.composites	chemical treatments
(Maheswari et al. 2013)	Effect of alkali and alkali-silane	The tensile and flexural strengths of alkali-silane
	treatments of tamarind fiber on the	treated composites were higher than the untreated
	mechanical properties of	and other treated ones
	tamarind/polvester composites	
(Wong et al., 2004)	Treatment of flex fiber with 4.4'-	SEM revealed good adhesion between flax fiber and
	thiodiphenol (TDP)	poly (3-hydroxybutyrate) matrix after treatment
(Anand & Anbumalar,	Effect of alkaline treatment on	The alkali-treated composite has better mechanical
2014)	mechanical properties of hemp/epoxy	properties than the untreated one.
	composites.	
(Maffezzoli et al., 2004)	Treatment of hemp, ramie, flax, and jute	The void content decreased in composites containing
	fabrics with silane coupling agent	chemically treated fibers.
(Oushabi et al., 2017)	Effect of alkali treatment on thermos-	The tensile strength, thermal stability, and interfacial
	mechanical properties of date palm	shear strength (IFSS) of DPF reinforced polyurethane
	fiber (DPF)/polyurethane composites.	composites were increased after alkalization.
(Ismail et al., 2002)	Effect of silane-coupling agent on the	The mechanical properties were improved due to
	mechanical properties of bamboo	better fiber-matrix interfacial adhesion.
	fiber/natural rubber composites.	
(Mohanty, Nayak et al.,	Effect of compatibilizer on flexural	Treated composite exhibits 72.3% higher flexural
2004)	strength of jute fiber/PP composites.	strength than the untreated Jute/PP composite.
(Mishra et al., 2000)	Effect of compatibilizer on mechanical	The tensile modulus, flexural modulus, impact
	properties of natural fiber reinforced	strength, and hardness were improved after maleic
	composites.	anhydride compatibilization.

Table 1. Previous research work on chemical treatment of fibers.

Authors	Factors explored by researchers	Results
(Devi et al., 1997)	Effect of PALF length and content on the	The optimum mechanical properties are achieved at
	mechanical properties of PALF/Polyester	30 mm fiber length and 30% fiber content.
	composites.	
(Venkateshwaran et	Effect of sisal fiber addition on the mechanical	The mechanical properties of banana fiber composites
al., 2011)	properties of banana fiber composites.	were increased with the addition of sisal fiber up to
, ,		50%.
(Idicula et al., 2005)	Effect of fiber length and content on the	The composite consists of 40% fiber loading with fiber
	mechanical properties of banana/polvester	length of 30-40 mm exhibits better mechanical
	composites.	properties than the other.
(Dabade et al. 2006)	Effect of fiber length and weight ratio on	The optimum fiber length and weight ratio was 30 mm
(545446 66 61, 2000)	tensile properties of Sun hemp and	and around 55% respectively
	palmyra/polyester composites	
(Liu et al. 2007)	Influence of fiber length and content on	The modulus impact strength and heat deflection
(2.0.0000, 2001)	thermal and mechanical properties of kenaf-	temperature of biocomposites were increased with
	reinforced soy plastic biocomposites	increase of fiber length and content of kenaf fiber
(Das & Biswas, 2016)	Effect of fiber length and content on the	The optimum fiber length and content are 12 mm and
(2000020100,2010)	mechanical properties of coir/epoxy	15 wt % respectively
	composites	
(Mittal & Chaudhary	Effect of fiber content on thermal behavior of	The peak decomposition temperature of epoxy
2018)	coir-enoxy composites	thermoset was increased from 371.96°C to 386.03°C
2010)		after 23 vol % loading of coir fiber
(Chen et al. 2006)	Effect of wood particle size on mechanical	The plastic composites made of coarse wood particles
(01101101011, 2000)	properties of wood/HDPE composites	had higher strength than the fine particles composites
(Alvarez et al. 2004)	Effect of sisal fiber loading on the creep	The creep resistance of starch matrix was significant
(,, <u>200</u> ,)	properties of starch composites.	improved after loading of sisal fibers.
(Park & Balatinecz.	Effect of wood-fiber content on creep property	The creep resistance of polypropylene matrix was
1998)	of wood/PP composites.	improved with the increase of wood-fiber content.
(El-Shekeil et al.,	Effect of kenaf fiber content on tensile	The composite of 30% kenaf fiber yields maximum
2012)	properties of Kenaf/PU composites.	tensile strength.
(Nakagaito & Yano,	Effect of fiber loading on tensile modulus of	The tensile modulus was increased linearly up to 40
2008)	phenolic resin/micro fibrillated cellulose	wt.% fiber content.
	composites.	
(Özturk, 2010)	Effect of fiber loading on mechanical	The tensile and flexural strength was increased with
	properties of kenaf/phenol-formaldehyde (PF)	increase of kenaf and Fiberfrax content up to 43% and
	and Fiberfrax/PF composites.	36 vol.% respectively.
(Kalapakdee &	Effect of PALF content on mechanical	The modulus and tear strength were increased
Amornsakchai,	properties of PALF strengthened elastomer	significantly with increase of PALF content.
2014)	composites.	
(El-Shekeil et al.,	Influence of fiber content on the mechanical	The composite exhibits lower tensile strength, higher
2014)	properties of kenaf fiber reinforced PVC/PU	tensile modulus, and higher impact strength with the
,	blend composites.	increase of fiber content.
(Leblanc et al.,	Effect of green coconut fiber (GCF) content on	The impact strength and hardness were not
2007)	the mechanical properties of GCF/PVC	significantly influenced with the addition of GCF up to
- /	composites	30%.

Table 2. Literature studies on the effect of fiber length and content on properties of biocomposites.

2. Experimental

2.1. Materials

High-density polyethylene [HDPE, density=950 kg/m³, melt flow index (MFI)=12.3 g/10 min] and the coupling agent, polyethylene maleic anhydride (MAPE, Mw 26000) was obtained from M/s Solvay Chemicals Ltd. Kerala, India. The pineapple leaf fiber (PALF) with diameter ranging in between 60 to 100 μ m was collected from M/s Go Green products, Chennai, India. The collected fibers were thoroughly washed and then dried in an oven at 60°C to a final moisture content of 5%. The elemental composition and SEM micrograph of the studied PALF is shown in Table 3 and Figure 1, respectively.

2.2. Fabrication of biocomposite samples

Biocomposite samples of each formulation (Table 4) were obtained through melt-blending in a twin-screw extruder (Brabender plasticorder, Germany), which has a mixing chamber of 69 cm³ volumetric capacity. To improve the interfacial bonding strength between fiber and matrix resin, a pre-impregnation technique was utilized. The obtained prepregs were cut into 6 mm long pellets and further blended with pure HDPE to obtain the desired composition. The mixing was conducted at 190°C and 35 RPM for 10 min. The pre-mixed pellets were molded in TS-270 injection molding machine (Windsor, India) under the temperature setting of injection hopper and nozzle at 170°C and 180°C, respectively. Specimens were conditioned in a laboratory atmosphere of 23±5°C and 50% RH prior to testing.

2.3. Mechanical tests

Tensile and flexural (three-point bending) tests were conducted on a calibrated Tabletop Tinius Olsen Horizon H50KS, a Universal testing machine as per ASTM D638 and D790 standard, respectively. A digital pendulum impact tester was employed to determine impact strength. Four specimens for each composite sample were evaluated and their average values were reported.

2.4. Response surface method

RSM is a mathematical and statistical technique that can assess the effect of individual parameters and the interaction

of parameters on response variables. It has significant potential in modeling and analysis of problems with a small number of experimental data points (Myres et al., 2016). In RSM, a three-level Box Behnken design (BBD) was used to study the effect of linear, quadratic, cubic, and cross product models of three performance parameters and to develop an experimental design matrix. The design was built in Design-Expert software (version 6.0.8) with consideration of three critical variables i.e., fiber length (A), fiber loading (B), and MAPE content (C). The range and levels of the selected parameters are shown in Table 5. In this work, the second order polynomial equation was used for fitting the experimental data and find out the relevant model terms.

$$y = b_o + \Sigma b_i x_i + \Sigma b_{ii} x_i^2 + \Sigma b_{ij} x_i x_j \tag{1}$$

Where y represents the predicted response, b_o, regression equation constant; b_i, linear coefficient; b_i, square coefficient of each parameter; and b_i, first order interaction coefficient. To estimate the desired responses with reliable measurements, a total number of 17 experiments were conducted with 12 factorial points. Furthermore, the experimental sequence was randomized to minimize the effect of uncontrollable parameters. The regression (R²), adjusted (R²), predicted (R²), pure error sum of squares, lack of fit, response plots, and adequate precision were used in the determination of the robustness of the developed model.



Figure 1. Surface morphology of untreated PALF.

Table 3. Elemental composition of P/	۹LF.
--------------------------------------	------

С	0	Ν	Са	Р	Fe	K	Mg	Cu	O/C	References
									ratio	
73.13	24.17	2.70	0.00	-	-	-	-	0.00	0.33%	(Uhlig, 1998)
-	-	6.4-10	2.5-10	0.1-0.18	0.06-0.11	2.89	0.33	0.002-	-	(Heinicke &
								0.02		Gortner, 1957)

		Actual levels of variables					
Run no.	Name	Fiber length (mm)	Fiber loading (%)	MAPE content (%)			
1	P16L6M5	6	16	5			
2	P8L20M3	20	8	3			
3	P24L6M3	6	24	3			
4	P24L13M5	13	24	5			
5	P16L13M3	13	16	3			
6	P8L13M5	13	8	5			
7	P16L20M1	20	16	1			
8	P8L6M3	6	8	3			
9	P16L13M3	13	16	3			
10	P16L13M3	13	16	3			
11	P8L13M1	13	8	1			
12	P24L20M3	20	24	3			
13	P16L6M1	6	16	1			
14	P16L13M3	13	16	3			
15	P16L13M3	13	16	3			
16	P24L13M1	13	24	1			
17	P16L20M5	20	16	5			

Table 4. Biocomposite samples according to box-Behnken experimental design.

Table 5. Actual and coded experimental variables in Box-Behnken design.

			Experimental values			
Variables	Units	Symbol code	Lower (-1)	Center (0)	Higher (+1)	
Fiber length	mm	А	6	13	20	
Fiber loading	wt.%	В	8	16	24	
MAPE content	wt.%	С	1	3	5	

3. Results and discussion

3.1. ANOVA and regression models

The experimental test results were used to generate the mathematical models for each response variable. Among different mathematical models (linear, quadratic, cubic and 2FI), the quadratic was selected according to three different tests - the sequential model sum of squares, adequacy, and lack-of-fit (Table 6). The sum of square and mean square in ANOVA results (Tables 7-11) also revealed the adequacy of quadratic model for fitting the experimental data. The secondorder equations (ii-vi) express the overall predictive model in terms of variables:

Tensile strength = 32.19 - 0.15 * A + 2.86 * B + $0.96 * C - 2.88 * A^2 - 6.62 * B^2 - 1.63 * C^2 + 0.24 * A *$ B + 0.097 * A * C + 0.62 * B * C(ii)

Tensile modulus = 1475.93 - 31.27 * A + 35.60 * $B + 30.64 * C - 23.18 * A^2 - 58.43 * B^2 - 37.96 * C^2 +$ 22.17 * A * B + 15.76 * A * C + 36.35 * B * C (iii)

Flexural strength = 48.98 - 1.33 * A + 6.15 * B + $5.32 * C - 6.41 * A^2 - 7.05 * B^2 - 4.79 * C^2 + 1.24 * A * A^2$ B + 0.81 * A * C + 3.62 * B * C(iv)

Flexural modulus = 1661.91 - 16.93 * *A* + 33.41 * $B + 17.10 * C - 35.05 * A^2 - 14.22 * B^2 - 8.46 * C^2 -$ 19.37 * A * B + 6.22 * A * C + 8.01 * B * C (v)

Impact strength = 58.70 + 3.95 * A - 5.56 * B - $4.99 * C + 1.58 * A^2 + 1.85 * B^2 - 1.04 * C^2 + 0.55 * A *$ B - 3.26 * A * C + 2.54 * B * C(vi)

where A, B, and C are fiber length, fiber loading, and MAPE content, respectively. The significance of each model term was explained in terms of probability value (*p*-value). To eliminate non-effective terms and make regression model best fitted, ANOVA was repeated, and the results are presented in Tables 12-14. A fitted regression model with statistical significance is presented in the following equations:

Tensile strength = 32.19 - 0.15 * A + 2.86 * B + $0.96 * C - 2.88 * A^2 - 6.62 * B^2 - 1.63 * C^2$ (vii) *Flexural modulus* = 1658.35 - 16.93 * *A* + 33.41 * $B + 17.10 * C - 35.49 * A^2 - 14.66 * B^2 - 19.37 * A * B$ (viii) Impact strength = 58.27 + 3.95 * A - 5.56 * B - $4.99 * C + 1.53 * A^2 + 1.79 * B^2 - 3.26 * A * C + 2.54 *$ B * C

(ix)

validation of regression models at 95% confidence interval was explained in terms of p, F, and R² values. The insignificant

"Lack-of-Fit" and p-values less than 0.05 confirmed the rejection of null-hypothesis. The model F (107.22) and p (<0.0001) values for tensile strength, F (560.03) and p (<0.0001) values for tensile modulus, F (475.55) and p (<0.0001) values for flexural strength, F (36.64) and p (<0.0001) values for flexural modulus, and F (53.86) and p (<0.0001) values for impact strength showed that the quadratic model was significant. The regression model was further analyzed by evaluating R², adjusted R^2 , and predicted R^2 which indicates the proportion of total variation in response variable predicted by model. The higher correlation coefficients confirm the suitability and correctness of the model. The adjusted R² can be used to prevent probability error while predicted R² indicates how well the model predicts responses for new observations. The adjusted R² and predicted R² are in reasonable agreement with the values of 0.9755 and 0.9433 for tensile strength, 0.9968 and 0.9816 for tensile modulus, 0.9963 and 0.9820 for flexural strength, 0.9304 and 0.8446 for flexural modulus, and 0.9586 and 0.9256 for impact strength, respectively. The R² value for response variables implying that a high correlation exists between observed and predicted values. In addition, the adequacy of the model was confirmed using normal probabili-ty plots of the residuals, predicted versus actual values, and residuals versus predicted values plots. Figures 2-4 revealed that the error points are normally distributed along a straight line, implying that the model is adequate, and it represents the experimental data. The correlation between predicted response values and the actual values is shown in Figures 5-7. presenting uniformly distributed data points around the mean of the response variables. The linear regression fit is obtained with an R² values of 0.9847, 0.9986, 0.9984, 0.9565, and 0.9767 for the tensile strength, tensile modulus, flexural strength, flexural modulus, and impact strength respectively, indicating that the model is accurately describing the experimental observations. In the end, the final plots of residuals versus predicted values (Figures 8-10) concluded that the residuals scattering for all mechanical responses were not significant which confirms that the proposed model was suitable. The maximum error (Tables 15-17) lies in between predicted and measured values were 4.10%, 0.26%, 1.51%, 1.01%, and 4.02% for the tensile strength, tensile modulus, flexural strength, flexural modulus, and impact strength, respectively.

Tensile strength (MPa) Linear 0.3313 <0.0001	
Tensile strength (MPa) Linear 0.3313 <0.0001 0.2242 0.0451 - 397.21 Insufficient (MPa) 2FI 0.9947 <0.0001	
strength (MPa) 2FI 0.9947 <0.0001 0.2297 - - 739.41 Insufficient Quadratic <0.0001	
(MPa) 2FI 0.9947 <0.0001 0.2297 - - 739.41 Insufficient Quadratic <0.0001	
Quadratic <0.0001 0.0637 0.9902 0.9776 0.8704 42.29 Sufficient Suggest Cubic 0.0637 - 0.9981 0.9925 - - Insufficient Aliase Tensile Linear 0.0538 <0.0001	
Quadratic <0.0001 0.0637 0.9902 0.9776 0.8704 42.29 Sufficient Suggest Cubic 0.0637 - 0.9981 0.9925 - - Insufficient Aliase Tensile Linear 0.0538 <0.0001	
Cubic 0.0637 - 0.9981 0.9925 - - Insufficient Aliase Tensile Linear 0.0538 <0.0001	ed
Tensile Linear 0.0538 <0.0001 0.4336 0.3029 0.0747 54345.97 Insufficient modulus 2FI 0.3944 <0.0001	Ł
modulus 2FI 0.3944 <0.0001 0.5740 0.3184 - 65006.07 Insufficient	
(MPa) 0.1068	
Quadratic <0.0001 0.0621 0.9986 0.9968 0.9816 1081.94 Sufficient Suggest	ed
Cubic 0.0621 - 0.9997 0.9990 Insufficient Aliase	b
Flexural Linear 0.0334 <0.0001 0.4765 0.3557 0.2169 892.27 Insufficient	
strength 2FI 0.7691 <0.0001 0.5301 0.2482 - 1269.06 Insufficient	
(MPa) 0.1138	
Quadratic <0.0001 0.41 0.9984 0.9963 0.9820 20.50 Sufficient Suggest	ed
Cubic 0.1957 - 0.9994 0.9977 Insufficient Aliase	b
Flexural Linear 0.0062 <0.0001 0.6018 0.5100 0.3252 15204.63 Insufficient	
modulus	
(MPa) 2FI 0.4738 <0.0001 0.6867 0.4987 0.0499 21410.35 Insufficient	
Quadratic <0.0001 0.0085 0.9881 0.9728 0.8214 4023.30 Sufficient Suggest	ed
Cubic 0.0085 - 0.9992 0.9968 Insufficient Aliase	b
Impact Linear <0.0001 0.0790 0.8400 0.8030 0.6877 212.25 Insufficient	
strength 2FI 0.0141 0.2534 0.9420 0.9072 0.7964 138.40 Insufficient	
(J/m) Quadratic 0.0178 0.9766 0.9851 0.9660 0.9670 22.41 Sufficient Suggest	ed
Cubic 0.9766 - 0.9858 0.9431 Insufficient Aliase	

Table 6. Summary of the models.

Source	Sum of squares	DF	Mean square	F-value	<i>p</i> -value prob>F	
Model	323.22	9	35.91	78.74	< 0.0001	Significant
A - fiber length	0.19	1	0.19	0.41	0.5401	
B – fiber loading	65.61	1	65.61	143.85	< 0.0001	
C - MAPE	7.37	1	7.37	16.17	0.0051	
A ²	34.91	1	34.91	76.55	< 0.0001	
B ²	184.50	1	184.50	404.52	< 0.0001	
C ²	11.21	1	11.21	24.59	0.0016	
AB	0.24	1	0.24	0.53	0.4916	
AC	0.038	1	0.038	0.083	0.7811	
BC	1.53	1	1.53	3.34	0.1102	
Residual	3.19	7	0.46			
Lack of fit	2.58	3	0.86	5.66	0.0637	Not significant
Pure error	0.61	4	0.15			
Cor total	326.41	16				
			R ² =0.9902	Adjusted	Predicted	
				R ² =0.9776	R ² =0.8704	

Table 7. Initial ANOVA results and statistical parameters for tensile strength.

Table 8. ANOVA results and statistical parameters for tensile modulus.

Source	Sum of squares	DF	Mean square	F-value	<i>p</i> -value prob>F	
Model	58651.48	9	6516.83	560.03	< 0.0001	Significant
A - fiber length	7823.75	1	7823.75	672.34	< 0.0001	
B – fiber loading	10136.03	1	10136.03	871.04	< 0.0001	
C - MAPE	7509.25	1	7509.25	645.31	< 0.0001	
A ²	2263.10	1	2263.10	194.48	< 0.0001	
B ²	14376.86	1	14376.86	1235.48	< 0.0001	
C ²	6068.41	1	6068.41	521.49	< 0.0001	
AB	1966.48	1	1966.48	168.99	< 0.0001	
AC	993.83	1	993.83	85.40	< 0.0001	
BC	5284.56	1	5284.56	454.13	< 0.0001	
Residual	81.46	7	11.64			
Lack of fit	66.12	3	22.04	5.75	0.0621	Not significant
Pure error	15.33	4	3.83			
Cor total	58732.93	16				
			R ² =0.9986	Adjusted	Predicted	
				R ² =0.9968	R ² =0.9816	

Table 9. ANOVA results and statistical parameters for flexural strength.

Source	Sum of squares	DF	Mean square	F-value	<i>p</i> -value prob>F	
Model	1137.56	9	126.40	475.55	< 0.0001	Significant
A - fiber length	14.07	1	14.07	52.94	0.0002	
B – fiber loading	302.09	1	302.09	1136.59	< 0.0001	
C - MAPE	226.74	1	226.74	853.09	< 0.0001	
A ²	172.84	1	172.84	650.30	< 0.0001	
B ²	209.54	1	209.54	788.39	< 0.0001	
C ²	96.69	1	96.69	363.78	< 0.0001	
AB	6.18	1	6.18	23.23	0.0019	
AC	2.62	1	2.62	9.87	0.0163	
BC	52.35	1	52.35	196.95	< 0.0001	
Residual	1.86	7	0.27			
Lack of fit	1.22	3	0.41	2.53	0.1957	Not significant
Pure error	0.64	4	0.16			
Cor total	1139.42	16				
			R ² =0.9984	Adjusted R ² =0.9963	Predicted R ² =0.9820	

Source	Sum of squares	DF	Mean square	F-value	<i>p</i> -value prob>F	
Model	22265.74	9	2473.97	64.63	< 0.0001	Significant
A - fiber length	2293	1	2293	59.91	0.0001	
B – fiber loading	8930.49	1	8930.49	233.31	< 0.0001	
C - MAPE	2338.25	1	2338.25	61.09	0.0001	
A ²	5172.35	1	5172.35	135.13	< 0.0001	
B ²	850.98	1	850.98	22.23	0.0022	
C ²	301.46	1	301.46	7.88	0.0263	
AB	1500.40	1	1500.40	39.20	0.0004	
AC	154.63	1	154.63	4.04	0.0844	
BC	256.32	1	256.32	6.70	0.0361	
Residual	267.94	7	38.28			
Lack of fit	249.68	3	83.23	18.23	0.0685	Not significant
Pure error	18.26	4	4.56			
Cor total	22533.68	16				
			R ² =0.9881	Adjusted R ² =0.9728	Predicted R ² =0.8214	

Table 10. Initial ANOVA results and statistical parameters for flexural modulus.

Table 11. Initial ANOVA results and statistical parameters for impact strength.

Source	Sum of squares	DF	Mean square	F-value	<i>p</i> -value prob>F	
Model	669.50	9	74.39	51.47	< 0.0001	Significant
A - fiber length	124.98	1	124.98	86.47	< 0.0001	
B – fiber loading	246.98	1	246.98	170.87	< 0.0001	
C - MAPE	198.90	1	198.90	137.61	< 0.0001	
A ²	10.52	1	10.52	7.28	0.0307	
B ²	14.38	1	14.38	9.95	0.0161	
C ²	4.53	1	4.53	3.13	0.1201	
AB	1.20	1	1.20	0.83	0.3927	
AC	42.45	1	42.45	29.37	0.0010	
BC	25.70	1	25.70	17.78	0.0040	
Residual	10.12	9	1.45			
Lack of fit	0.46	5	0.15	0.063	0.9766	Not significant
Pure error	9.66	4	2.42			
Cor total	679.62	16				
			R ² =0.9851	Adjusted R ² =0.9660	Predicted R ² =0.9670	

Table 12. Final ANOVA results and statistical parameters for tensile strength.

Source	Sum of squares	DF	Mean square	F-value	<i>p</i> -value prob>F	
Model	321.41	6	53.57	107.22	< 0.0001	Significant
A - fiber length	0.19	1	0.19	0.38	0.5521	
B – fiber loading	65.61	1	65.61	131.32	< 0.0001	
C - MAPE	7.37	1	7.37	14.76	0.0033	
A ²	34.91	1	34.91	69.88	< 0.0001	
B ²	184.95	1	184.50	369.29	< 0.0001	
C ²	11.21	1	11.21	22.45	0.0008	
Residual	5	10	0.50			
Lack of fit	4.39	6	0.73	4.80	0.0753	Not significant
Pure error	0.61	4	0.15			
Cor total	326.41	16				
			R ² =0.9847	Adjusted	Predicted	
				R ² =0.9755	R ² =0.9433	

Source	Sum of squares	DF	Mean square	F-value	<i>p</i> -value prob>F	
Model	21553.33	6	3592.22	36.64	< 0.0001	Significant
A - fiber length	2293	1	2293	23.39	0.0007	
B – fiber loading	8930	1	8930	91.10	< 0.0001	
C - MAPE	2338.25	1	2338.25	23.85	0.0006	
A ²	5319.36	1	5319.36	54.26	< 0.0001	
B ²	907.65	1	907.65	9.26	0.0124	
AB	1500.40	1	1500.40	15.30	0.0029	
Residual	980.35	10	98.03			
Lack of fit	962.09	6	160.35	35.13	0.0920	Not significant
Pure error	18.26	4	4.56			
Cor total	22533.68	16				
			R ² =0.9565	Adjusted	Predicted	
				R ² =0.9304	R ² =0.8446	

Table 13. Final ANOVA results and statistical parameters for flexural modulus.

Table 14. Final ANOVA results and statistical parameters for impact strength.

Source	Sum of squares	DF	Mean square	F-value	<i>p</i> -value prob>F	
Model	663.78	7	94.83	53.86	< 0.0001	Significant
A - fiber length	124.98	1	124.98	70.99	< 0.0001	
B – fiber loading	246.98	1	246.98	140.29	< 0.0001	
C - MAPE	198.90	1	198.90	112.98	< 0.0001	
A ²	9.83	1	9.83	5.58	0.0424	
B ²	13.58	1	13.58	7.71	0.0215	
AC	42.45	1	42.45	24.11	0.0008	
BC	25.70	1	25.70	14.60	0.0041	
Residual	15.84	9	1.76			
Lack of fit	6.18	5	1.24	0.51	0.7598	Not significant
Pure error	9.66	4	2.42			
Cor total	679.62	16				
			R ² =0.9767	Adjusted R ² =0.9586	Predicted R ² =0.9256	

Table 15. Comparison between measured and predicted values for tensile strength and modulus.

	Tensile	strength (MF	Pa)	Tensile	modulus (M	Pa)
Name	Experimental	Predicted	Error (%)	Experimental	Predicted	Error (%)
P16L6M5	19.75	19.98	-1.16	1415.80	1412.16	0.25
P8L20M3	20.01	19.68	1.64	1303.46	1305.27	-0.14
P24L6M3	24.89	25.71	-3.29	1440.82	1439.01	0.13
P24L13M5	26.13	25.41	2.75	1417.17	1420.81	-0.26
P16L13M3	27.30	26.88	1.53	1428.37	1431.18	-0.196
P8L13M5	25.74	26.57	-3.22	1339.75	1337.11	0.197
P16L20M1	29.43	28.80	2.14	1458.29	1460.93	-0.18
P8L6M3	28.26	28.49	-0.81	1432.72	1429.91	0.196
P16L13M3	20.89	20.12	3.68	1348.82	1349.65	-0.061
P16L13M3	25.48	25.85	-1.42	1349.14	1348.14	0.074
P8L13M1	21.17	22.04	-4.10	1337.23	1338.23	-0.074
P24L20M3	28.23	27.77	1.62	1482.94	1482.11	0.055
P16L6M1	31.92	32.19	-0.84	1477.09	1475.93	0.078
P16L13M3	32.49	32.19	0.92	1475.52	1475.93	-0.027
P16L13M3	31.69	32.19	-1.57	1472.92	1475.93	-0.20
P24L13M1	32.24	32.19	0.142	1478.11	1475.93	0.15
P16L20M5	32.63	32.19	1.34	1476.01	1475.93	0.005

	Flexural strength (MPa)			Flexural modulus (MPa)		
Name	Experimental	Predicted	Error (%)	Experimental	Predicted	Error (%)
P16L6M5	31.56	31.95	-1.24	1576.28	1572.34	0.25
P8L20M3	27.07	26.81	0.96	1580.25	1577.22	0.19
P24L6M3	41.49	41.75	-0.62	1683.77	1677.90	0.35
P24L13M5	41.97	41.58	0.93	1610.27	1605.30	0.31
P16L13M3	35.13	34.60	1.51	1629.48	1622.68	0.42
P8L13M5	30.21	30.32	-0.36	1584.09	1588.82	-0.29
P16L20M1	43.74	43.63	0.25	1640.27	1656.88	-1.01
P8L6M3	42.06	42.59	-1.26	1619.75	1623.02	-0.20
P16L13M3	29.14	29.29	-0.51	1592.21	1593.18	-0.06
P16L13M3	34.07	34.34	-0.79	1641.09	1660	-1.15
P8L13M1	32.97	32.70	0.81	1621.36	1627.37	-0.37
P24L20M3	52.37	52.22	0.29	1702.26	1694.19	0.47
P16L6M1	48.32	48.98	-1.37	1659.81	1658.35	0.088
P16L13M3	49.01	48.98	0.06	1661.08	1658.35	0.16
P16L13M3	48.99	48.98	0.02	1665.05	1658.35	0.40
P24L13M1	49.28	48.98	0.61	1660.52	1658.35	0.13
P16L20M5	49.32	48.98	0.69	1663.08	1658.35	0.28

Table 16. Comparison between measured and predicted values for flexural strength and modulus.

Table 17. Comparison between measured and predicted values for impact strength.

	Impact strength (J/m)					
Name	Experimental	Predicted	Error (%)			
P16L6M5	64.31	63.19	1.74			
P8L20M3	71.25	71.10	0.21			
P24L6M3	51.92	52.08	-0.31			
P24L13M5	61.05	59.98	1.75			
P16L13M3	57.30	57.57	-0.47			
P8L13M5	71.59	71.99	-0.56			
P16L20M1	53.42	54.11	-1.29			
P8L6M3	54.68	55.50	-1.5			
P16L13M3	72.29	73.14	-1.18			
P16L13M3	56.29	56.96	-1.19			
P8L13M1	57.67	58.10	-0.75			
P24L20M3	51.81	52.05	-0.46			
P16L6M1	60.71	58.27	4.02			
P16L13M3	59.67	58.27	2.35			
P16L13M3	56.98	58.27	-2.26			
P24L13M1	57.39	58.27	-1.53			
P16L20M5	58.77	58.27	0.85			



Figure 2. Normal probability plot of the residuals for (a) tensile strength and (b) tensile modulus.



Figure 3. Normal probability plot of the residuals for (a) flexural strength and (b) flexural modulus.



Figure 4. Normal probability plot of the residuals for impact strength.



Figure 5. Plots of predicted versus actual values for (a) tensile strength and (b) tensile modulus.



Figure 6. Plots of predicted versus actual values for (a) flexural strength and (b) flexural modulus.



Figure 7. Plots of predicted versus actual values for impact strength.



Figure 8. Residuals versus predicted values plot for (a) tensile strength and (b) tensile modulus.



Figure 9. Residuals versus predicted values plot for (a) flexural strength and (b) flexural modulus.



Figure 10. Residuals versus predicted values plot for impact strength.

3.2. Effect of design parameters on tensile properties of biocomposites

Figure 11 (a)-(d) illustrate the 3D surface response plots for tensile strength and modulus as a function of fiber length and content, keeping the MAPE load fixed at 1 and 5 wt.%. The tensile strength was increased to a maximum value and then decreased

slowly with the increase of fiber length. However, the tensile modulus was varied inversely with fiber length, and it was due to the severe fiber breakage and fibrillation of longer PALF during composite compounding. Irrespective of fiber length, the incorporation of PALF beyond a specified limit did not produce any significant reinforcing effect. This was because of the agglomeration and poor interfacial adhesion of fibers within the polymer matrix.

The variation in tensile properties with fiber length and compatibilizer content is shown in Figure 12(a)-(d). The tensile strength and stiffness were increased to maximum values and then

decreased with the increase of MAPE content. It was due to the excess removal of lignin compound in highly concentrated solution. Figure 13 (c)-(d) reveals the significant effect of fiber loading and MAPE content on tensile strength and modulus. The compatibilizer effect was pronounced only under high fiber loading condition (24 wt.%) which results in an increase of tensile modulus with the increase of MAPE content. It was due to the formation of rigid networks which constraint the movement of polymeric chains. The 3.6 wt.% MAPE compatibilized composite having 17% fiber content with 13 mm fiber length exhibits maximum tensile strength (Table 18).

The main effect plot of each parameter on tensile properties of biocomposites is shown in Figure 14. Among all three critical variables, the fiber loading has highest degree of influence on tensile properties. The strength and stiffness of biocomposites were increased to maximum values and then decreased with the increase of fiber content.



Figure 11. 3D surface plots for the effect of fiber length and fiber loading on tensile strength (a) 1 wt.% MAPE, (b) 5 wt.% MAPE, and tensile modulus (c) 1 wt.% MAPE, (d) 5 wt.% MAPE.



Figure 12. 3D surface plots for the effect of fiber length and MAPE on tensile strength (a) 8 wt.% PALF, (b) 24 wt.% PALF, and tensile modulus (c) 8 wt.% PALF, (d) 24 wt.% PALF.



Figure 13. 3D surface plots for the effect of fiber loading and MAPE on tensile strength (a) 6 mm fiber length, (b) 20 mm fiber length, and tensile modulus (c) 6 mm fiber length, (d) 20 mm fiber length.



Figure 14. Main effects plot for (a) tensile strength and (b) tensile modulus.

			Properties		
Fiber length (mm)	Fiber loading (%)	MAPE content (%)	Predicted	Experimental	
13	17	3.6	Max tensile strength: 32.64 MPa	32.63 MPa	
11	16	4	Max tensile modulus: 1488 MPa	1481 MPa	
14	22	4.5	Max flexural strength: 52.72 MPa	51.59 MPa	
9	24	5	Max. flexural modulus: 1702 MPa	1701.01 MPa	
14	9	1	Max. impact strength: 72.69 MPa	70.89 MPa	

Table 18. Optimum values of design parameters for maximum mechanical properties.

3.3. Effect of design parameters on flexural properties of biocomposites

The interaction effect of fiber length and content on flexural properties of biocomposites is shown in Figure 15 (a)-(d). Like tensile strength, the flexural strength as well as flexural modulus were increased to maximum values and then gradually decreased with the increase of fiber length. The flexural modulus of biocomposites was increased with the increase of fiber content and it was due to the presence of hydroxyl groups in PALF which facilitate in binding of polymeric chains and the chains entanglement.

Figure 16(a)-(d) reveals the combined effect of fiber length and MAPE content on flexural properties of biocomposites. It was observed that for all fiber length, the flexural strength and modulus were increased with the increase of compatibilizer load, and it was due to the formation of covalent linkages in between anhydride and hydroxyl (-OH) groups of fibers. The interaction effect of fiber loading and MAPE content on flexural properties of biocomposites is shown in Figure 17 (a)-(d). It is worth to noted that the reinforcement efficiency of PALF was significantly increased after the addition of compatibilizer. The interaction between fiber loading and MAPE content significantly affects the flexural strength (*p*-value BC<0.05). The 4.5 wt.% MAPE compatibilized composite having 22% fiber content with 14 mm length exhibits maximum flexural strength (Table 18).

Figure 18 illustrates the main effect plot of each individual parameter on flexural strength and modulus. It was observed that the fiber volume content has highest degree influence on the flexural behavior of developed composites. The addition of fibers beyond a limiting volume could not increase the strength of composite. However, the flexural modulus was increased progressively with the increase of fiber volume fraction. The fiber aspect ratio (length to diameter ratio) is a crucial parameter which dictates the reinforcing efficiency of fiber. The bending strength and stiffness were increased to maximum values and then decrease with the increase of fiber length. This kind of behavior was found in kenaf fiber-filled poly (butylene succinate) biocomposites (Thirmizir et al., 2011).



Figure 15. 3D surface plots for the effect of fiber length and fiber loading on flexural strength (a) 1 wt.% MAPE, (b) 5 wt.% MAPE, and flexural modulus (c) 1 wt.% MAPE, (d) 5 wt.% MAPE.



Figure 16. 3D surface plots for the effect of fiber length and MAPE on flexural strength (a) 8 wt.% PALF, (b) 24 wt.% PALF, and flexural modulus (c) 8 wt.% PALF, (d) 24 wt.% PALF.



Figure 17. 3D surface plots for the effect of fiber loading and MAPE on flexural strength (a) 6 mm fiber length, (b) 20 mm fiber length, and flexural modulus (c) 6 mm fiber length, (d) 20 mm fiber length.



Figure 18. Main effects plot for (a) flexural strength and (b) flexural modulus.

3.4. Effect of design parameters on impact strength of biocomposites

Figure 19 (a)-(b) illustrates the effect of fiber length and MAPE content on impact strength of biocomposites, keeping the fiber content was fixed at 8 and 24 wt.%. It was observed that the composite of higher aspect ratio (L/D) yields better impact toughness than the composite of low L/D ratio. Moreover, the low aspect ratio results in stress concentration and poor dispersion of fibers in HDPE matrix (Gamstedt et al., 2007). It is worth noted that the impact fracture strength of composites was decreased with the increase of compatibilizer content. This was attributed to the predominant action of fiber-fracture than the fiber pull-out.

In fiber composites having strong interfacial adhesion, fiber fracture is more common and dissipates lesser energy than the fiber pull-out (Wambua et al., 2003). The overall impact toughness of a fiber-reinforced composite (FRP) depends on the nature of the constituent elements, internal structure and geometry of the composite, fiber morphology, chemical composition, and interfacial adhesion between filler element and the matrix.

The interaction effect of fiber loading and MAPE content on impact strength of biocomposites is shown in Figure 20 (a)-(b). It was observed that the impact strength of composites was decreased with the increase of PALF content. This implies that the loading of PALF results in transition from ductile to brittle behavior. The important toughening mechanism in FRP is crack bridging by fibers associated with frictional sliding during fiber pull-out. It is worth noted that the composite shows poor mechanical strength at high fiber content (24 wt%) The 1 wt.% MAPE compatibilized composite having 9% fiber content with 14 mm length exhibits maximum impact strength (Table 18).

The main effect plot of each individual parameter on impact strength of biocomposites is shown in Figure 21. The PALF content has highest degree of influence on impact strength. Moreover, the F value of fiber content (140.29) at 0.05 probability level confirms its highest significance on impact strength. The decrement in impact strength with increase of PALF content may be due to the agglomeration of fibers. Table 14 reported that the compatibilizer content is another crucial parameter with a significant F value (112.98). It was observed that the impact strength was decreased with the increase of MAPE content. The stronger interfacial adhesion results in the major occurrence of fiber fracture than that of fiber pull-out under loading condition.

3.5. Optimization of response variables

The numerical optimization method was employed to generate the optimal condition for each response variable. The goal was to maximize strength and modulus (Table 19); therefore, the target was set at highest value obtained from experimental results. The pre-defined goal, importance level, optimum and desirable values of each parameter are shown in Figures 22-23. To validate the Box-Behnken design model, a minimum of four samples were developed at the optimum condition of performance parameters. It was observed that the obtained experimental results (Table 20) are within a 5% difference from predicted values which proves the adequacy, reliability, and significance of current model.



Figure 19. 3D surface plots for the effect of fiber length and MAPE on impact strength



Figure 20. 3D surface plots for the effect of fiber loading and MAPE on impact strength (a) 6 mm fiber length, (b) 20 mm fiber length.

DESIGN-EXPERT Plot

Impact strength

Actual Factors A: Fiber length = 13.00 B: Fiber loading = 16.00 C: MAPE content = 3.00





Figure 21. Main effects plot for impact strength.

Response	Lower value	Upper Value	Goal	Importance level
Tensile strength (MPa)	19.75	32.63	Maximize	****
Tensile modulus (MPa)	1303.46	1482.94	Maximize	****
Impact strength (J/m)	51.81	72.29	Maximize	****
Flexural strength (MPa)	27.07	52.37	Maximize	****
Flexural modulus (MPa)	1576.28	1702.26	Maximize	****

Table 19. Optimization criteria and importance level

Response	Test 1	Test 2	Test 3	Test 4	Mean
Tensile strength (MPa)	33.15	32.06	33.86	31.98	33.04
Tensile modulus (MPa)	1472.62	1477.89	1471.05	1473.22	1475.27
Flexural strength (MPa)	48.64	46.69	48.31	48.96	50.21
Flexural modulus (MPa)	1654.71	1662.24	1660.07	1657.33	1660.58
Impact strength (J/m)	60.21	61.74	59.83	59.04	60.24

Table 20. Experimental results at optimum values of performance parameters.



Figure 22. Optimum values of input and response variables.





4. Conclusions

The primary objective of this work was to optimize the mechanical properties of biocomposites using Box-Behnken RSM technique. The effects of fiber length, fiber content, and compatibilizer load on mechanical properties of PALF/HDPE biocomposites as summarized below.

• The quadratic model was suitable and showed reasonable agreement in correlation coefficients (R^2 , adj. R^2 , and pred. R^2) for predicting the mechanical responses. Moreover, the verification of model fitness using statistical ANOVA technique confirmed its adequacy and reliability for navigating the design space.

• The experimental and statistical results showed the significance of all three influential variables, i.e., fiber length, fiber loading, and MAPE content on tensile, flexural, and impact properties. Furthermore, the interaction of fiber loading and MAPE were highly related to the mechanical properties of biocomposites.

• Based on final ANOVA results, the PALF loading had the greatest effect on modulus of rupture (MOR) and modulus of elasticity (MOE) of HDPE/PALF/MAPE biocomposites.

• The most improvements of tensile and flexural properties (strength and modulus) were obtained in the medium levels of fiber length and high levels of fiber loading and MAPE content. However, the maximum impact strength was attained in low levels of fiber load and MAPE content and a medium level of fiber length. Under the synergistic combination of these optimal conditions; the tensile strength, tensile modulus, flexural strength, flexural modulus, and impact strength were predicted to be 32.35 MPa, 1475 MPa, 49.21 MPa, 1659.04 MPa, and 58.24 J/m, respectively.

Conflict of interest

The authors have no conflict of interest to declare.

Acknowledgments

The authors extend their gratitude to the Delhi Technological University, Delhi (India) for supporting this research work.

Funding

The authors received no specific funding for this work.

References

Ali, A., Yu, L., Liu, H., Khalid, S., Meng, L., & Chen, L. (2017). Preparation and characterization of starch-based composite films reinforced by corn and wheat hulls. *Journal of Applied Polymer Science*, *134*(32), 45159. https://doi.org/10.1002/app.45159

Ali, A., Xie, F., Yu, L., Liu, H., Meng, L., Khalid, S., & Chen, L. (2018). Preparation and characterization of starch-based composite films reinfoced by polysaccharide-based crystals. *Composites*

https://doi.org/10.1016/j.compositesb.2017.09.017

Part B: Engineering, 133, 122-128.

Alvarez, V. A., Kenny, J. M., & Vázquez, A. (2004). Creep behavior of biocomposites based on sisal fiber reinforced cellulose derivatives/starch blends. *Polymer Composites*, *25*(3), 280-288. https://doi.org/10.1002/pc.20022

Anand, P., & Anbumalar, V. (2014). Mechanical properties of cellulose-filled epoxy hybrid composites reinforced with alkali-treated hemp fiber. *39*(1), 46-55.

Arib, R. M. N., Sapuan, S. M., Hamdan, M. A. M. M., Paridah, M. T., & Zaman, H. M. D. K. (2004). A literature review of pineapple fibre reinforced polymer composites. *Polymers and Polymer Composites*, *12*(4), 341-348.

https://doi.org/10.1177/096739110401200408

Ashenai Ghasemi, F., Daneshpayeh, S., Ghasemi, I., & Ayaz, M. (2016). An investigation on the Young's modulus and impact strength of nanocomposites based on polypropylene/linear low-density polyethylene/titan dioxide (PP/LLDPE/TiO 2) using response surface methodology. *Polymer Bulletin*, 73, 1741-1760.

https://doi.org/10.1007/s00289-015-1574-2

Basu, A., Kundu, S., Sana, S., Halder, A., Abdullah, M. F., Datta, S., & Mukherjee, A. (2017). Edible nano-bio-composite film cargo device for food packaging applications. *Food Packaging and Shelf Life*, *11*, 98-105.

https://doi.org/10.1016/j.fpsl.2017.01.011

Bledzki, A. K., Gassan, J., & Theis, S. (1998). Wood-filled thermoplastic composites. *Mechanics of composite materials*, *34*(6), 563-568. https://doi.org/10.1007/BF02254666

Bodirlau, R., Teaca, C. A., & Spiridon, I. (2013). Influence of natural fillers on the properties of starch-based biocomposite films. Composites Part B: Engineering, 44(1), 575-583. https://doi.org/10.1016/j.compositesb.2012.02.039

Cantero, G., Arbelaiz, A., Llano-Ponte, R., & Mondragon, I. (2003). Effects of fibre treatment on wettability and mechanical behaviour of flax/polypropylene composites. Composites science and technology, 63(9), 1247-1254. https://doi.org/10.1016/S0266-3538(03)00094-0

Chen, H. C., Chen, T. Y., & Hsu, C. H. (2006). Effects of wood particle size and mixing ratios of HDPE on the properties of the composites. European Journal of Wood and Wood Products, 64(3), 172-177.

Dabade, B. M., Reddy, G. R., Rajesham, S., & Kiran, C. U. (2006). Effect of fiber length and fiber weight ratio on tensile properties of sun hemp and palmyra fiber reinforced polyester of composites. Journal reinforced plastics and composites, 25(16), 1733-1738. https://doi.org/10.1177/07316844060684

Dash, B. N., Rana, A. K., Mishra, S. C., Mishra, H. K., Nayak, S. K., & Tripathy, S. S. (2000). Novel low-cost jute-polyester composite. II. SEM observation of the fractured surfaces. Polymer-Plastics Technology and Engineering, 39(2), 333-350.

https://doi.org/10.1081/PPT-100100033

Das, G., & Biswas, S. (2016). Effect of fiber parameters on physical, mechanical and water absorption behaviour of coir fiber-epoxy composites. Journal of Reinforced Plastics and Composites, 35(8), 628-637.

https://doi.org/10.1088/1757-899X/115/1/012012

Devi, L. U., Bhagawan, S. S., & Thomas, S. (1997). Mechanical properties of pineapple leaf fiber-reinforced polyester composites. Journal of Applied Polymer Science, 64(9), 1739-1748. https://doi.org/10.1002/(SICI)10974628(19970531)64:9<1739:: AID-APP10>3.0.CO;2-T

El-Shekeil, Y. A., Sapuan, S. M., Abdan, K., & Zainudin, E. S. (2012). Influence of fiber content on the mechanical and thermal properties of Kenaf fiber reinforced thermoplastic polyurethane composites. Materials & Design, 40, 299-303. https://doi.org/10.1016/j.matdes.2012.04.003

El-Shekeil, Y. A., Sapuan, S. M., Jawaid, M., & Al-Shuja'a, O. M. (2014). Influence of fiber content on mechanical. morphological and thermal properties of kenaf fibers reinforced poly (vinyl chloride)/thermoplastic polyurethane poly-blend composites. Materials & Design, 58, 130-135. https://doi.org/10.1016/j.matdes.2014.01.047

FAOSTAT, F. (2017). Food and agriculture organization of the United Nations (FAO). FAO Statistic Database. http://www.fao.org/statistics/databases/en/

Fung, K. L., Xing, X. S., Li, R. K. Y., Tjong, S. C., & Mai, Y. W. (2003). An investigation on the processing of sisal fibre reinforced polypropylene composites. Composites Science and Technology, 63(9), 1255-1258. https://doi.org/10.1016/S0266-3538(03)00095-2

Fung, K. L., Li, R. K. Y., & Tjong, S. C. (2002). Interface modification on the properties of sisal fiber-reinforced polypropylene composites. Journal of Applied Polymer Science, 85(1), 169-176.

https://doi.org/10.1002/app.10584

García-Hernández, E., Licea-Claveríe, A., Zizumbo, A., Alvarez-Castillo, A., & Herrera-Franco, P. J. (2004). Improvement of the interfacial compatibility between sugar cane bagasse fibers and polystyrene for composites. Polymer composites, 25(2), 134-145.

https://doi.org/10.1002/pc.20011

Gamstedt, E. K., Nygård, P., & Lindström, M. (2007). Transfer of knowledge from papermaking to manufacture of composite materials. In Proceedings of the 3rd wood fibre polymer composites international symposium, Bordeaux (p. 12).

Ghasemi, F. A., Ghasemi, I., Menbari, S., Ayaz, M., & Ashori, A. (2016). Optimization of mechanical properties of polypropylene/talc/graphene composites using response surface methodology. *Polymer Testing*, 53, 283-292. https://doi.org/10.1016/j.polymertesting.2016.06.012

Heinicke, R. M., & Gortner, W. A. (1957). Stem bromelain—a new protease preparation from pineapple plants. Economic Botany, 11(3), 225-234. https://doi.org/10.1007/BF02860437

Holt, G. A., Chow, P., Wanjura, J. D., Pelletier, M. G., & Wedegaertner, T. C. (2014). Evaluation of thermal treatments to improve physical and mechanical properties of biocomposites made from cotton byproducts and other agricultural fibers. *Industrial Crops and Products*, *52*, 627-632. https://doi.org/10.1016/j.indcrop.2013.11.003

Idicula, M., Neelakantan, N. R., Oommen, Z., Joseph, K., & Thomas, S. (2005). A study of the mechanical properties of randomly oriented short banana and sisal hybrid fiber reinforced polyester composites. *Journal of applied polymer science*, *96*(5), 1699-1709.

https://doi.org/10.1002/app.21636

Ismail, H., Shuhelmy, S., & Edyham, M. R. (2002). The effects of a silane coupling agent on curing characteristics and mechanical properties of bamboo fibre filled natural rubber composites. *European Polymer Journal*, *38*(1), 39-47. https://doi.org/10.1016/S0014-3057(01)00113-6

Jandas, P. J., Mohanty, S., Nayak, S. K., & Srivastava, H. (2011). Effect of surface treatments of banana fiber on mechanical, thermal, and biodegradability properties of PLA/banana fiber biocomposites. *Polymer Composites*, *32*(11), 1689-1700. https://doi.org/10.1002/pc.21165

John, M. J., Francis, B., Varughese, K. T., & Thomas, S. (2008). Effect of chemical modification on properties of hybrid fiber biocomposites. *Composites Part A: Applied Science and Manufacturing*, *39*(2), 352-363.

https://doi.org/10.1016/j.compositesa.2007.10.002

Joseph, K., Thomas, S., & Pavithran, C. (1996). Effect of chemical treatment on the tensile properties of short sisal fibre-reinforced polyethylene composites. *Polymer*, *37*(23), 5139-5149.

https://doi.org/10.1016/0032-3861(96)00144-9

Kazayawoko, M., Balatinecz, J. J., & Matuana, L. M. (1999). Surface modification and adhesion mechanisms in woodfiberpolypropylene composites. *Journal of materials science*, *34*, 6189-6199.

https://doi.org/10.1023/A:1004790409158

Kalapakdee, A., & Amornsakchai, T. (2014). Mechanical properties of preferentially aligned short pineapple leaf fiber reinforced thermoplastic elastomer: Effects of fiber content and matrix orientation. *Polymer testing*, *37*, 36-44.

https://doi.org/10.1016/j.polymertesting.2014.04.008

Kengkhetkit, N., & Amornsakchai, T. (2012). Utilisation of pineapple leaf waste for plastic reinforcement: 1. A novel extraction method for short pineapple leaf fiber. *Industrial Crops and Products*, *40*, 55-61.

https://doi.org/10.1016/j.indcrop.2012.02.037

Kengkhetkit, N., & Amornsakchai, T. (2014). A new approach to "Greening" plastic composites using pineapple leaf waste for performance and cost effectiveness. *Materials & Design*, *55*, 292-299.

https://doi.org/10.1016/j.matdes.2013.10.005

Khalil, H. A., Issam, A. M., Shakri, M. A., Suriani, R., & Awang, A. Y. (2007). Conventional agro-composites from chemically modified fibres. *Industrial Crops and Products*, *26*(3), 315-323. https://doi.org/10.1016/j.indcrop.2007.03.010

Latif, S. S., Nahar, S., & Hasan, M. (2015). Fabrication and electrical characterization of bamboo fiber-reinforced polypropylene composite. Journal of Reinforced Plastics and Composites, 34(3), 187-195.

Leblanc, J. L., Furtado, C. R., Leite, M. C., Visconte, L. L., & de Souza, A. M. (2007). Effect of the fiber content and plasticizer type on the rheological and mechanical properties of poly (vinyl chloride)/green coconut fiber composites. *Journal of applied polymer science*, *106*(6), 3653-3665. https://doi.org/10.1002/app.26567

Li, M. C., Wu, Q., Song, K., Cheng, H. N., Suzuki, S., & Lei, T. (2016). Chitin nanofibers as reinforcing and antimicrobial agents in carboxymethyl cellulose films: Influence of partial deacetylation. *ACS Sustainable Chemistry & Engineering*, 4(8), 4385-4395.

https://doi.org/10.1021/acssuschemeng.6b00981

Liu, W., Drzal, L. T., Mohanty, A. K., & Misra, M. (2007). Influence of processing methods and fiber length on physical properties of kenaf fiber reinforced soy based biocomposites. *Composites Part B: Engineering*, *38*(3), 352-359. https://doi.org/10.1016/j.compositesb.2006.05.003

Maheswari, C. U., Reddy, K. O., Muzenda, E., Shukla, M., & Rajulu, A. V. (2013). Mechanical properties and chemical resistance of short tamarind fiber/unsaturated polyester composites: Influence of fiber modification and fiber content. *International Journal of Polymer Analysis and Characterization*, *18*(7), 520-533.

https://doi.org/10.1080/1023666X.2013.816073

Maffezzoli, A., Calo, E., Zurlo, S., Mele, G., Tarzia, A., & Stifani, C. (2004). Cardanol based matrix biocomposites reinforced with natural fibres. *Composites Science and Technology*, 64(6), 839-845. https://doi.org/10.1016/j.compscitech.2003.09.010

Mathew, L., Joseph, K. U., & Joseph, R. (2004). Isora fibres and their composites with natural rubber. Progress in Rubber Plastics and Recycling Technology, 20(4), 337-349.

Mhalla, M. M., Bahloul, A., & Bouraoui, C. (2017). Analytical models for predicting tensile strength and acoustic emission count of a glass fiber reinforced polyamide using response surface method. *Journal of Alloys and Compounds*, 695, 2356-2364. https://doi.org/10.1016/j.jallcom.2016.11.108

Mishra, S., Naik, J. B., & Patil, Y. P. (2000). The compatibilising effect of maleic anhydride on swelling and mechanical properties of plant-fiber-reinforced novolac composites. *Composites Science and Technology*, *60*(9), 1729-1735. https://doi.org/10.1016/S0266-3538(00)00056-7

nttps://doi.org/10.1016/S0266-3538(00)00056-7

Mishra, S., Misra, M., Tripathy, S. S., Nayak, S. K., & Mohanty, A. K. (2001). Potentiality of pineapple leaf fibre as reinforcement in PALF-polyester composite: Surface modification and mechanical performance. Journal of Reinforced Plastics and Composites, 20(4), 321-334.

Mittal, M., & Chaudhary, R. (2018). Effect of fiber content on thermal behavior and viscoelastic properties of PALF/Epoxy and COIR/Epoxy composites. Materials Research Express, 5(12), 125305.

Mwaikambo, L. Y., & Ansell, M. P. (2002). Chemical modification of hemp, sisal, jute, and kapok fibers by alkalization. *Journal of applied polymer science*, 84(12), 2222-2234. https://doi.org/10.1002/app.10460

Mohanty, S., Verma, S. K., Nayak, S. K., & Tripathy, S. S. (2004). Influence of fiber treatment on the performance of sisalpolypropylene composites. *Journal of Applied Polymer Science*, 94(3), 1336-1345. https://doi.org/10.1002/app.21161

Mohanty, S., Nayak, S. K., Verma, S. K., & Tripathy, S. S. (2004). Effect of MAPP as coupling agent on the performance of sisal– PP composites. *Journal of reinforced plastics and composites*, *23*(18), 2047-2063. https://doi.org/10.1177/0731684404041711

111ps://doi.org/10.11/7/0731684404041711

Mohamed, O. A., Masood, S. H., & Bhowmik, J. L. (2015). Optimization of fused deposition modeling process parameters: a review of current research and future prospects. *Advances in manufacturing*, *3*, 42-53. https://doi.org/10.1007/s40436-014-0097-7

Myers, R. H., Montgomery, D. C., & Anderson-Cook, C. M. (2016). Response surface methodology: process and product optimization using designed experiments. John Wiley & Sons.

Nakagaito, A. N., & Yano, H. (2008). The effect of fiber content on the mechanical and thermal expansion properties of biocomposites based on microfibrillated cellulose. *Cellulose*, *15*, 555-559.

https://doi.org/10.1007/s10570-008-9212-x

Nakhaei, M. R., Mostafapour, A., & Naderi, G. (2017). Optimization of mechanical properties of PP/EPDM/clay nanocomposite fabricated by friction stir processing with response surface methodology and neural networks. *Polymer Composites*, *38*, E421-E432.

https://doi.org/10.1002/pc.23942

Qaiss, A. E. K., Bouhfid, R., & Essabir, H. (2014). Natural fibers reinforced polymeric matrix: thermal, mechanical and interfacial properties. *Biomass and bioenergy: processing and properties*, 225-245.

https://doi.org/10.1007/978-3-319-07641-6_14

Oushabi, A., Sair, S., Hassani, F. O., Abboud, Y., Tanane, O., & El Bouari, A. (2017). The effect of alkali treatment on mechanical, morphological and thermal properties of date palm fibers (DPFs): Study of the interface of DPF–Polyurethane composite. *South African Journal of Chemical Engineering*, *23*, 116-123.

https://doi.org/10.1016/j.sajce.2017.04.005

Özturk, S. (2010). Effect of fiber loading on the mechanical properties of kenaf and fiberfrax fiber reinforced phenol-formaldehyde composites. *Journal of Composite Materials*. 44, 2265-2288. https://doi.org/10.1177/0021998310364265

Park, B. D., & Balatinecz, J. J. (1998). Short term flexural creep behavior of wood-fiber/polypropylene composites. *Polymer composites*, *19*(4), 377-382. https://doi.org/10.1002/pc.10111 Pavithran, C., Mukherjee, P. S., Brahmakumar, M., & Damodaran, A. D. (1987). Impact properties of natural fibre composites. *Journal of Materials Science Letters*, *6*, 882-884. https://doi.org/10.1007/BF01729857

Raj, R. G., Kokta, B. V., Dembele, F., & Sanschagrain, B. (1989). Compounding of cellulose fibers with polypropylene: Effect of fiber treatment on dispersion in the polymer matirx. *Journal of applied polymer science*, *38*(11), 1987-1996. https://doi.org/10.1002/app.1989.070381103

Rostamiyan, Y., Fereidoon, A., Mashhadzadeh, A. H., Ashtiyani, M. R., & Salmankhani, A. (2015). Using response surface methodology for modeling and optimizing tensile and impact strength properties of fiber orientated quaternary hybrid nano composite. *Composites Part B: Engineering*, 69, 304-316. https://doi.org/10.1016/j.compositesb.2014.09.031

Rostamiyan, Y., Fereidoon, A., Rezaeiashtiyani, M., Mashhadzadeh, A. H., & Salmankhani, A. (2015). Experimental and optimizing flexural strength of epoxy-based nanocomposite: effect of using nano silica and nano clay by using response surface design methodology. *Materials & Design*, 69, 96-104.

https://doi.org/10.1016/j.matdes.2014.11.062

Rostamiyan, Y., Fereidoon, A., Ghalebahman, A. G., Mashhadzadeh, A. H., & Salmankhani, A. (2015). Experimental study and optimization of damping properties of epoxy-based nanocomposite: Effect of using nanosilica and high-impact polystyrene by mixture design approach. *Materials & Design (1980-2015)*, 65, 1236-1244.

https://doi.org/10.1016/j.matdes.2014.10.022

Rostamiyan, Y., Mashhadzadeh, A. H., & SalmanKhani, A. (2014). Optimization of mechanical properties of epoxy-based hybrid nanocomposite: Effect of using nano silica and high-impact polystyrene by mixture design approach. *Materials & Design (1980-2015), 56,* 1068-1077. https://doi.org/10.1016/j.matdes.2013.11.060

https://d0i.0ig/10.1010/j.matues.2015.11.000

Salasinska, K., Polka, M., Gloc, M., & Ryszkowska, J. (2016). Natural fiber composites: the effect of the kind and content of filler on the dimensional and fire stability of polyolefin-based composites. *Polimery*, *61*(4), 255-265 https://doi.org/10.14314/polimery.2016.255

Shi, A. M., Wang, L. J., Li, D., & Adhikari, B. (2013). Characterization of starch films containing starch nanoparticles: Part 1: Physical and mechanical properties. *Carbohydrate Polymers*, *96*(2), 593-601. https://doi.org/10.1016/j.carbpol.2012.12.042 Siddique, F. R., Khan, A. U., & Sheikh, R. A. (1984). *Wood Text Abs.* 1, 4196.

Subasinghe, A. D. L., Das, R., & Bhattacharyya, D. (2016). Parametric analysis of flammability performance of polypropylene/kenaf composites. *Journal of materials science*, *51*, 2101-2111. https://doi.org/10.1007/s10853-015-9520-0

Thirmizir, M. A., Ishak, Z. M., Taib, R. M., Rahim, S., & Jani, S. M. (2011). Kenaf-bast-fiber-filled biodegradable poly (butylene succinate) composites: Effects of fiber loading, fiber length, and maleated poly (butylene succinate) on the flexural and impact properties. *Journal of Applied Polymer Science*, *122*(5), 3055-3063.

https://doi.org/10.1002/app.34046

Tripathy, S. S., Di Landro, L., Fontanelli, D., Marchetti, A., & Levita, G. (2000). Mechanical properties of jute fibers and interface strength with an epoxy resin. *Journal of applied polymer science*, *75*(13), 1585-1596. https://doi.org/10.1002/(SICI)1097-4628(20000328)75:13<1585::AID-APP4>3.0.CO;2-Q

Uhlig, H. (Ed.). (1998). Industrial enzymes and their applications. John Wiley & Sons.

Venkateshappa, S. C., Jayadevappa, S. Y., & Puttiah, P. K. W. (2012). Mechanical behavior of areca fiber reinforced epoxy composites. *Advances in Polymer Technology*, *31*(4), 319-330. https://doi.org/10.1002/adv.20255

Venkateshwaran, N., ElayaPerumal, A., Alavudeen, A., & Thiruchitrambalam, M. (2011). Mechanical and water absorption behaviour of banana/sisal reinforced hybrid composites. *Materials & Design*, *32*(7), 4017-4021. https://doi.org/10.1016/j.matdes.2011.03.002

Wambua, P., Ivens, J., & Verpoest, I. (2003). Natural fibres: can they replace glass in fibre reinforced plastics?. *Composites science and technology*, *63*(9), 1259-1264. https://doi.org/10.1016/S0266-3538(03)00096-4

Wong, S., Shanks, R., & Hodzic, A. (2004). Interfacial improvements in poly (3-hydroxybutyrate)-flax fibre composites with hydrogen bonding additives. *Composites science and technology*, *64*(9), 1321-1330. https://doi.org/10.1016/j.compscitech.2003.10.012 Xie, X. L., Fung, K. L., Li, R. K. Y., Tjong, S. C., & Mai, Y. W. (2002). Structural and mechanical behavior of polypropylene/maleated styrene-(ethylene-co-butylene)styrene/sisal fiber composites prepared by injection molding. *Journal of Polymer Science Part B: Polymer Physics*, 40(12), 1214-1222.

https://doi.org/10.1002/polb.10175