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Article

Multiobjective Optimization of Weight Reduction Process Parameters of Micropolyester Woven Fabrics Using Taguchi-Grey Relational Analysis

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Abstract: The weight loss process variables of alkali-treated micropolyester woven fabric were optimized and reported in this study. The grey relational analysis (GRA) with the help of the Taguchi technique was efficiently used to optimize the key variables of this process. The caustic soda concentration, treatment temperature, and weight loss machine speed were considered the control or design parameters. The weight reduction percentage, air permeability, tensile strength, and thermal resistance of alkali-treated woven polyester fabrics were also considered as responses in this study. The experiments were implemented according to a 33 full factorial design. The levels of the control parameters which yield the maximum weight reduction, tensile strength, air permeability, and minimum thermal resistance of the treated polyester fabrics were found to be NaOH concentration and treatment temperature with the highest levels, and machine speed with the lowest level. This means that a 27% caustic soda concentration, treatment temperature of 125 OC, and machine speed of 40 m/min exhibited the optimum properties of the treated micropolyester fabrics. It is also proved that the treatment temperature is the most influential factor affecting the micropolyester fabric's properties. The confirmation test which was carried out in this study confirmed that the GRA improved the alkali-treated polyester fabric properties.

Keywords: multiobjective optimization; grey relational analysis; Taguchi technique; weight reduction process; polyethylene terephthalate; NaOH

1. Introduction

The production scale of polyester fabrics occupies the forefront of synthetic fibers around the globe. This is because of the excellent characteristics of this type of fabric, such as high strength, good elasticity, high chemical stability, good wear resistance, easy wear and wash, corrosion resistance, and good light and heat resistance [1–7]. Due to their prominent properties, polyester fabrics are widely used for clothing, home furnishing, medical textiles, technical applications, protective clothing, and sportswear [8–11].

Despite noteworthy properties, polyester fabrics have a waxy and clammy feel, are prone to forming high static charges, and tend to pill, especially with blends. Also, they have low moisture regain, are hydrophobic, and are flammable to a great extent [12–16]. These disadvantages adversely influence polyester fabrics' application in human daily life [17–19].

Many drawbacks of the polyester fabric have been enhanced through different pretreatments. One of the most popular techniques is the de-weighting (weight reduction process), or more precisely, the alkaline hydrolysis of polyethylene terephthalate (PET) fabric by a solution of sodium hydroxide with a specific concentration. The weight reduction of PET fabric is a finishing process that has long been recognized in the textile industry. This finishing process aimed to enhance the wettability, drape, and handling characteristics of polyester fabrics leading to a silky touch handle [20]. In this process, aqueous sodium hydroxide hydrolysis attacks the PET fibers. Over time, this hydrolysis

attack starts at the fibers' outer layers and works through the center. As a result of this hydrolysis, the ester bonds in the PET polymer chains are broken down at ester linkage, leading to the hydroxyl and carboxyl groups, which enhance polarity and to form hydrogen bonds with water molecules, which in turn improve fabric wettability [21–23].

The key parameters of the weight loss process include caustic soda concentration, squeezing rollers' pressure, and presence of an accelerator, the effect of pre-setting, fabric structure, time, and temperature of the treatment. The influence of the majority of these parameters on the physical, mechanical, handle, thermal, and electrical characteristics of polyester woven fabrics has been extensively investigated in numerous research papers.

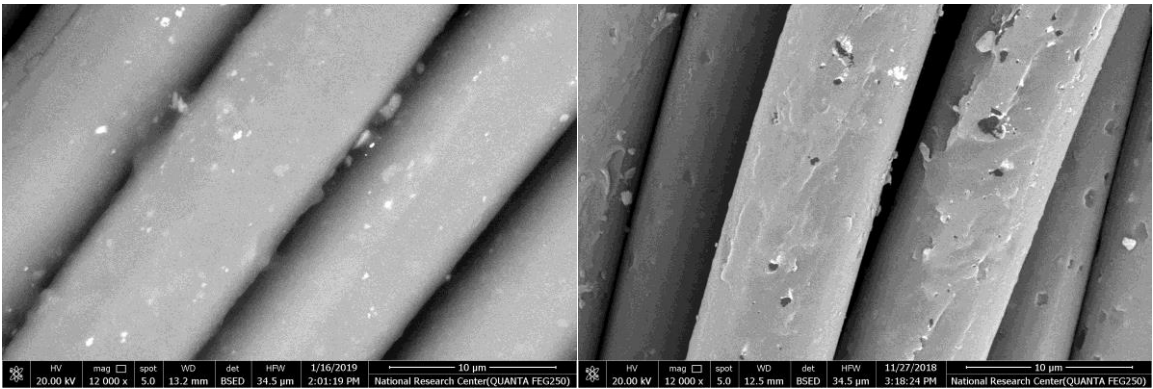
To the best of my knowledge, despite the importance of the process of weight reduction of the PET fabrics, none of the researchers optimized its operational parameters. Therefore, the overarching objective of this study is to conduct a multiobjective optimization of the weight loss process parameters in terms of PET fabric properties. The key parameters of the weight loss process to be optimized were sodium hydroxide concentration, treatment temperature, and machine speed. The optimization technique was conducted using the Taguchi technique and grey relational analysis in terms of alkaline-treated woven polyester fabric properties such as weight reduction percentage, thermal resistance, air permeability, and tensile strength.

2. Experimental work

2.1. Materials

Throughout this study, 100% bleached polyester woven fabrics with plain weave structure, warp yarn density of 32 ends/cm, weft yarn density of 25 picks/cm, and mass per unit area of 198m g/m² were used accordingly. These types of fabrics were produced on a Picanol Rapier (GamMax 6- R-190) weaving machine from drawn-textured yarns DTY with counts of 135d/150f for both warp and weft yarns. This means that the woven types of yarns are made from micro polyester filaments with a linear density of 0.9 denier per filament. After bleaching, the undertaken micro polyester filament woven fabric has undergone alkaline hydrolysis with caustic soda under different conditions.

The scanning electron microscope of treated and untreated (blank) micropolyester woven fabric samples was displayed in Figure 1. It can be shown from this figure that the alkaline hydrolysis polyester fabric has elliptical and elongated pits or cavities toward the polyester filament axis. It was reported that the cavities become wider and deeper with the increase in caustic soda concentration. In comparison to untreated fabric, the treated one is thinner and rougher. The FTIR of the untreated (blank) and treated polyester fabric was also presented in Figure 2.



Untreated polyester fabric

Treated polyester fabric

Figure 1. Scanning Electron Microscope of treated and untreated micropolyetser woven fabrics.

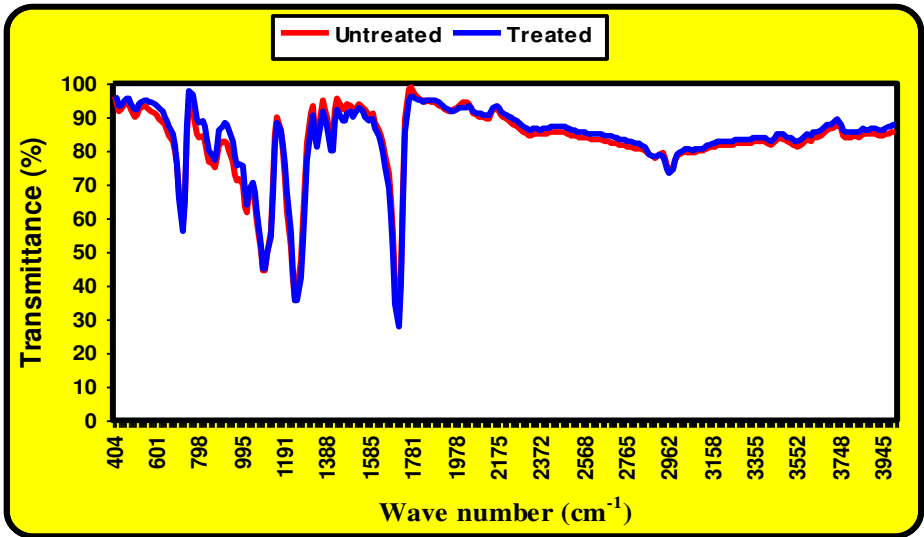


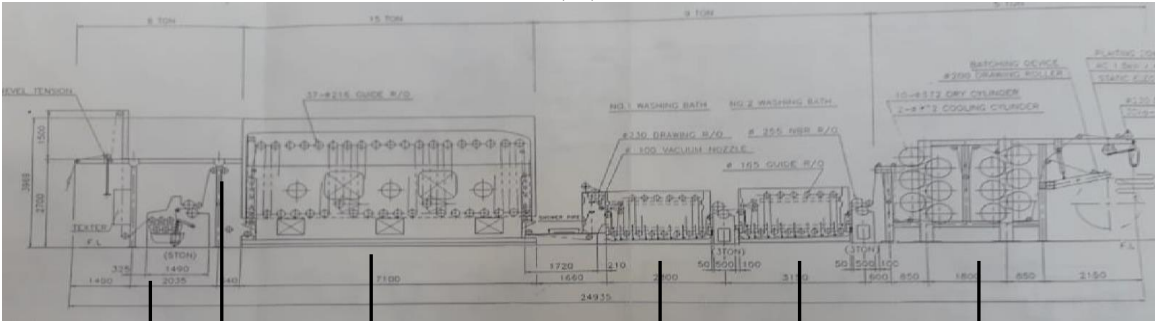
Figure 2. FTIR of untreated and treated micropolyester woven fabric.

2.2. Weight reduction process

In the course of this study, alkaline hydrolysis of drawn textured polyester fabric was carried out using JSSR-AW/2W continuous weight reduction machine. Figure 3A and 3B respectively depict the general view and sketch diagram of the used weight reduction machine.



(A)



(B)

The levels of control parameters of the weight loss process were tabulated in the following Table 1.

Independent factors	Factor code	Levels codes and values		
		-1	0	1
Caustic soda concentration (X_1), %	A	19	23	27
Machine speed (X_3), m/min	B	20	30	40
Treatment temperature (X_4), °C	C	90	110	125

Polyester filaments are mostly subjected to alkaline hydrolysis in the steamer at high temperatures. During the hydrolysis process between NaOH and polyester filament, PET will be divided into its monomers, Ethylene Glycol (EG), and Terephthalic Acid (TA), as shown in Figure 4. It has been confirmed that caustic soda only affects the surface of the filament, and not the filament core. Because of the cross-linking and degree of crystallinity of polyester, the hydrolysis reaction with caustic soda is not violent and occurs slowly at the filament surface. It was found that the treatment temperature has a huge influence on the hydrolysis reaction rate and its degree as well [31].

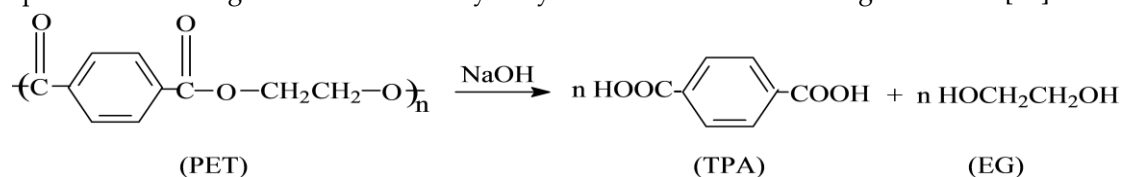


Figure 4. A consequence of polyester hydrolysis by caustic soda.

2.3. Laboratory testing

Before the measurement, the treated and untreated (blank) fabric samples were placed in standard conditions for a full day to be dried and to prepare them for measuring their intended properties. Each fabric's property has examined ten times in the warp direction, and the average of individual readings was calculated.

The mass per unit area of the blank and treated polyester fabrics was measured in accordance with ASTM D3766/D3776M-20. Fabric samples with a surface area of 100 cm² were accurately cut and their weights were precisely measured on an electronic balance. The results of fabric weight were converted into g/m².

The weight reduction percentages of all treated polyester fabrics were determined according to the following formula:

$$\text{Weight reduction (\%)} = \frac{m_1 - m_2}{m_1} \times 100 \quad (1)$$

where m_1 and m_2 are the masses per unit area of the blank and the treated fabric samples respectively.

Thermal resistance refers to the ability of a substance to withstand heat flow through it. As the thermal resistance increases, the heat loss through the fabric decreases. The air that is trapped within and between individual fibers is the main cause to give the fabric heat resistance. The thermal resistance equals the reciprocal of thermal conductivity times the fabric thickness. The following formulas can be used to calculate the fabric's thermal resistance [20,32].

$$R = \frac{t}{\lambda} \quad (2)$$

where R indicates the fabric's thermal resistance (W⁻¹m²K), λ denotes the thermal conductivity, and t is the fabric thickness in centimeters.

The effective thermal fabric conductivity can also be measured and calculated using the following equation:

$$\lambda = \frac{W \times h}{A \Delta T} \quad (\text{W/cm} \cdot ^\circ\text{C}) \quad (3)$$

where W is the heat loss (Watt), h is the fabric thickness (cm), A is the area of the B.T-heat plate (cm²), and ΔT is the temperature difference across the sample (°C).

Air permeability is a measure of air flow in cubic centimeters perpendicularly through the fabric surface area of one square centimeter per second at a differential pressure of 12.5 cm of water head. In addition to fabric comfort, air permeability is most influential property for different applications, such as tents, industrial filters, parachutes, sail fabrics, raincoat materials, airbags, etc. In this paper, the air permeability of the blank and de-weighted fabrics was evaluated according to the standard test method ASTM D737 using an air permeability tester. The tensile strength of the fabric samples under study was also investigated according to ASTM D5034 using the Instron tensile strength instrument of model 4411.

2.4. Experimental design

According to the chosen control factors and their intended levels, a 3³ full factorial design was implemented to address these variables. Therefore, twenty-seven fabric samples were produced and treated with different conditions. Besides, one fabric sample (blank sample) will not be undergone any treatment. As a result, the final total number of the produced fabric samples is 28 samples.

The experimental arrangement using 3^3 factorial design which shows how the treated fabric samples were produced throughout this investigation was tabulated in Table 2. According to this table, the sequences of experiments were carried out in this study.

Table 2. Arrangement of the experiments to treat the drawn textured polyester using a 3^3 full factorial design.

Sample No.	Caustic soda concentration (%) - (A)	Temperature (°C) - (B)	Machine Speed (m/min) - (C)
1	19	90	20
2	19	90	30
3	19	90	40
4	19	110	20
5	19	110	30
6	19	110	40
7	19	125	20
8	19	125	30
9	19	125	40
10	23	90	20
11	23	90	30
12	23	90	40
13	23	110	20
14	23	110	30
15	23	110	40
16	23	125	20
17	23	125	30
18	23	125	40
19	27	90	20
20	27	90	30
21	27	90	40
22	27	110	20
23	27	110	30
24	27	110	40
25	27	125	20
26	27	125	30
27	27	125	40
28	Untreated (Blank) sample		

The results of the statistical analysis will concentrate on the main effects and their interaction effects will be excluded. For each trial, the analysis was conducted using the average of ten individual readings. Table 3 shows the intended control factors, their levels, and their respective fabric properties, namely the percentage of fabric weight reduction, tensile strength, air permeability, and thermal resistance. The untreated fabric properties were also listed in Table 4.

Table 3. Experimental layout using L_9 orthogonal array for weight reduction process parameters and corresponding their fabric properties.

Ex pe	Levels of the control factors			Fabric properties			
	A	B	C	Weight reduction (%)	Air permeability	Tensile strength	Thermal resistance
1	1	1	1	8.7	9.7	753.4	4.7

2	1	1	2	8.2	9.4	892.7	4.6
3	1	1	3	4.9	9.7	861.9	5.7
4	1	2	1	14.8	10.9	777.0	4.6
5	1	2	2	13.0	11.8	751.4	4.7
6	1	2	3	10.3	11.8	803.4	4.7
7	1	3	1	19.1	16.8	754.4	4.4
8	1	3	2	13.5	13.0	757.3	4.1
9	1	3	3	12.7	10.7	804.4	4.6
10	2	1	1	11.9	12.3	786.8	4.9
11	2	1	2	8.3	11.4	803.4	5.1
12	2	1	3	8.7	11.2	802.5	4.9
13	2	2	1	23.9	17.8	666.1	4.6
14	2	2	2	15.2	12.5	760.3	4.3
15	2	2	3	12.3	13.2	735.8	4.6
16	2	3	1	16.7	18.1	696.5	4.5
17	2	3	2	16.1	15.7	685.7	4.1
18	2	3	3	15.2	10.8	734.8	4.4
19	3	1	1	14.1	15.8	750.5	4.6
20	3	1	2	11.2	13.7	757.3	4.4
21	3	1	3	9.9	12.9	773.0	5.0
22	3	2	1	22.4	16.9	625.9	4.4
23	3	2	2	14.6	15.7	755.4	3.9
24	3	2	3	11.9	14.2	799.5	4.3
25	3	3	1	36.8	28.6	492.5	3.3
26	3	3	2	21.6	15.6	645.5	2.5
27	3	3	3	19.6	15.4	718.1	3.5

A: Concentration of caustic soda – B: Treatment temperature – C: Machine speed

Table 4. Properties of untreated micropolyester woven fabric.

Properties	Value
Weight (g/m ²)	198.3
Tensile strength (Newton)	835
Air permeability (cm ³ /cm ² .sec)	6.796
Thermal resistance (W ⁻¹ m ² K)	5.42

2.5. Optimization technique using Taguchi

The optimization of any process parameters is the primary step in the Taguchi approach to obtain excellent quality without raising the cost. It should be noted that the Taguchi approach is originally used to optimize single performance characteristics [33].

In this sophisticated technique, the optimal parameters can be obtained using the signal-to-noise ratios (S/N ratios). In general, there are three different modes of S/N ratios; these are the nominal-the-best, the higher-the-better, and the smaller-the-better. The following equations can be used to evaluate each mode.

- The nominal- the- best

$$\eta = 10 \log \left[\frac{\bar{y}^2}{S} \right] \quad (4)$$

- The higher, the better

$$\eta = -10 \log \left[\frac{1}{n} \sum_{i=1}^n \frac{1}{y_{ij}^2} \right] \quad (5)$$

- The smaller, the better

$$\eta = -10 \log \left[\frac{1}{n} \sum_{i=1}^n y_{ij}^2 \right] \quad (6)$$

where η is the S/N ratio, y_{ij} is the i^{th} result of the experiment for j^{th} factor, \bar{S}^2 , and \bar{y} denote the sample variance and mean respectively, and n is the number of replications of the i^{th} experiment.

Since the aim of this study is to establish alkali-treated micropolyester woven fabrics with high weight reduction, high tensile strength, high air permeability, and low thermal resistance, thus it is interested in achieving larger values for weight reduction, tensile strength, and air permeability and a smaller value for thermal resistance.

2.6. Grey relational analysis (GRA)

The term grey refers to information that is either undetermined or incomplete. The GRA technique is used effectively to solve complex relationships between many performance characteristics. Using this technique, the multi-response characteristics are transformed into single-response characteristics. To perform this analysis, the following stages should be completed in order: normalization step, obtaining the grey relational coefficient (GRC), and getting the grey relational grade (GRG).

To reduce the variability and overcome the impact of using diverse units for the response characteristics, the S/N ratio of each response characteristic is normalized to be in the range between zero and one. Generally speaking, in accordance with the kind of performance characteristics, the normalization is accomplished and an appropriate equation is used. For the higher-the- better and the smaller-the- better, the following equations can be used.

$$y_i^*(k) = \frac{y_i^0(k) - \min y_i^0(k)}{\max y_i^0(k) - \min y_i^0(k)} \quad \text{For higher the-better} \quad (7)$$

$$y_i^*(k) = \frac{\max y_i^0(k) - y_i^0(k)}{\max y_i^0(k) - \min y_i^0(k)} \quad \text{For smaller the-better} \quad (8)$$

where $\min y_i^0(k)$, and $\max y_i^0(k)$ denote the smallest and largest values of the original experimental data for the k^{th} response respectively. Also, $y_i^0(k)$ denotes the original experimental value in the i^{th} experiment for the k^{th} response. The value of $y_i^*(k)$ indicates the normalized data in the i^{th} experiment and k^{th} response. Typically, the greatest value of the normalized data, which is equal to one, was depicted as a superior performance property [34].

The normalized data were then used to calculate the grey relational coefficient (GRC), which represents the relationship between the optimal and actual normalized experimental data. Typically, the following equation is used to calculate the GRC:

$$\zeta_i(k) = \frac{\Delta_{\min} + \zeta \Delta_{\max}}{\Delta_{oi}(k) + \zeta \Delta_{\max}} \quad (9)$$

where $\Delta_{oi}(k)$ refers to the deviation sequence of the reference and comparability sequences, and it can be calculated using the equation 10.

$$\Delta_{oi}(k) = \|y_0^*(k) - y_i^*(k)\| \quad (10)$$

where ζ is referred to as the distinguishing coefficient, which can take any value ranging between zero and one. In this study, ζ is equal to one. The $y_0^*(k)$, and $y_i^*(k)$ are the sequence and comparability sequence respectively.

The GRC for each performance characteristic is averaged to evaluate the grey relational grade. The following equation is used to calculate the grey relational grade:

$$\gamma_i = \frac{1}{n} \sum_{k=1}^n w_i \zeta_i(k) \quad (11)$$

where γ_i indicates the final grey relational grade for the i^{th} experiment and n refers to the number of response variables. Also, w_i denotes the weighting factor for the i^{th} experiment.

The calculation of the weight factor for each performance characteristic plays a vital role in determining the final grey relational grade. It is worth noting that the impacts of responses on the multiple performance characteristics for any engineering system are not equal. However, to calculate the final grey relational grade of multiple characteristics, most researchers utilize equal weight which yields imprecise results. Therefore, it is very important to use an applicable approach to calculate the weight factor for each response variable according to its importance and effect degree. This means that the weight factors for weight reduction, tensile strength, air permeability, and thermal conductivity of alkali-treated fabrics will differ from each other.

In general, the weight factor for each response variable can be calculated using the following formula [35,36]:

$$W_i = \frac{\sum_{j=1}^p \Delta_{ai,j}}{\sum_{i=1}^m \sum_{j=1}^p \Delta_{ai,j}} \quad (12)$$

In this equation, delta refers to the S/N ratio ranges. P denotes the number of responses and m is the number of parameters.

As the grey relational grade increases, the parameter approaches the optimum sequence. Typically, the best multi-performance characteristic is that has the highest value of the grey relational grade. Consequently, the grey relational grade can be utilized to determine the best level of each control factor as well as each factor effect [37–39].

2.7. Analysis of variance

To identify the significant influence of each control factor on the grey relational grade the analysis of variance was implemented using Minitab version 18 statistical software. In this statistical analysis, the variability of the grey relational grade was separated into two different components.

After that, the sum of squares of the deviation of each component from the overall average of the grey relational grade was then calculated

Using this statistical analysis, the importance of the effect of each control parameter on the multi-performance characteristics was also evaluated. The control parameter which has the greatest influence on the multi-performance characteristics is one that has the highest contribution percentage. It should be noted that the significance of each control variable is assessed according to the significance level $0 \leq \alpha \leq 0.05$.

3. Results and discussion

As previously disclosed in the experimental part, this study analyzes the various parameters involved in the alkaline hydrolysis of micropolyester woven fabrics to raise its quality. On the basis of the control parameters, namely caustic soda concentration, treatment temperature, and machine speed, some of the important responses such as percentage of weight reduction, air permeability, tensile strength, and thermal resistance were measured and then optimized. In order to get the best combination of the control factors that yield the optimum response variables, the grey relation analysis was carried out.

The best indicator of better performance of the treated woven fabrics lies in the high weight reduction percentage, tensile strength, air permeability values, and low thermal conductivity value. Therefore, weight reductions, tensile strength, and air permeability are considered as the higher-the-better criterion, and thermal resistance is considered as the smaller-the- better criterion.

3.1. S/N ratios and grey relational coefficients and their grades

The values of S/N ratios for the alkaline-treated micropolyester woven fabrics' properties and their normalized values were depicted in Table 5. These values were calculated for high weight reduction percentage, high air permeability, high tensile strength, and low thermal resistance values of the treated woven fabrics according to equations 4 through 8.

The normalized values of signal-to-noise ratios were transformed into grey relational coefficients in accordance with the different steps in the grey relation analysis especially using equations 7 through 10. In calculating the grey relational coefficients, the distinguishing coefficient has taken the value of one. After determining the grey relational coefficients, their grade values were evaluated using equation No. 11. It is worth mentioning that the weighting factor in determining grey relation grades has different values according to the importance of each response variable. The equation No. 12 was efficiently used to determine the different weighting factors corresponding to response variables. The weighting factors for the weight reduction percentage, tensile strength, air permeability, and thermal resistance of the treated woven fabrics were found to be 47%, 12%, 26%, and 15% respectively. According to the weight factors of responses under study, the grey relational grades were calculated using the following equation:

$$GRG = 0.47 GRC_A + 0.26 GRC_B + 0.12 GRC_C + GRC_D \tag{13}$$

where GRC_A , GRC_B , GRC_C , and GRC_D are the grey relational coefficients of weight reduction, air permeability, tensile strength, and thermal resistance of alkaline-treated polyester fabrics.

The GRC values, grade values (GRG) and their ranks were tabulated in Table 6. Generally, the highest value of the GRG corresponds to the optimum multi-response characteristics. Different grey relational grades versus the number of experiments were depicted in Figure 5.

Table 5. S/N ratios and their normalized values for the treated polyester fabric properties.

Experiment No.	Weight reduction		Air permeability		Tensile strength		Thermal resistance	
	S/N ratio	Normaliz ed S/N	S/N ratio	Normaliz ed S/N	S/N ratio	Normaliz ed S/N	S/N ratio	Normaliz ed S/N

1	18.78	0.29	19.73	0.04	57.25	0.66	-13.44	0.74
2	18.27	0.26	19.39	0.00	59.01	1.00	-13.23	0.71
3	13.75	0.00	19.69	0.03	58.70	0.94	-15.30	1.00
4	23.38	0.55	20.61	0.13	57.80	0.77	-13.29	0.72
5	22.27	0.49	21.42	0.21	57.49	0.71	-13.41	0.74
6	20.22	0.37	21.40	0.21	58.09	0.82	-13.44	0.74
7	25.62	0.68	24.40	0.52	57.55	0.72	-12.88	0.67
8	22.60	0.50	22.21	0.30	57.58	0.72	-12.32	0.59
9	22.07	0.47	20.58	0.12	58.11	0.83	-13.30	0.72
10	21.51	0.44	21.57	0.23	57.91	0.79	-13.90	0.81
11	18.33	0.26	21.10	0.18	58.10	0.82	-14.18	0.85
12	18.75	0.28	20.99	0.17	58.08	0.82	-13.83	0.80
13	27.57	0.79	24.89	0.58	56.44	0.51	-13.27	0.72
14	23.64	0.56	21.83	0.25	57.61	0.73	-12.71	0.64
15	21.78	0.46	22.31	0.31	57.32	0.67	-13.30	0.72
16	24.45	0.61	25.10	0.60	56.86	0.59	-13.03	0.69
17	24.13	0.59	23.87	0.47	56.72	0.56	-12.26	0.58
18	23.61	0.56	20.65	0.13	57.31	0.67	-12.91	0.67
19	22.98	0.53	23.94	0.48	57.50	0.71	-13.27	0.72
20	20.98	0.41	22.70	0.35	57.57	0.72	-12.88	0.67
21	19.83	0.35	22.18	0.29	57.75	0.76	-14.07	0.83
22	27.01	0.76	24.51	0.53	55.87	0.40	-12.88	0.67
23	23.26	0.54	23.89	0.47	57.56	0.72	-11.87	0.53
24	21.48	0.44	23.04	0.38	58.05	0.82	-12.78	0.65
25	31.30	1.00	28.96	1.00	53.81	0.00	-10.49	0.34
26	26.66	0.74	23.78	0.46	56.06	0.43	-8.05	0.00
27	25.83	0.69	23.15	0.39	57.12	0.63	-10.81	0.38

Table 6. Grey relational coefficients (GRC) and their grade values (GRG) for treated micropolyester woven fabric properties.

Experiment No.	Grey relational coefficients (GRC)				Grey Relational grade (GRG)	Rank
	Weight reduction	Air permeability	Tensile strength	Thermal conductivity		
1	0.5837	0.5091	0.7465	0.7962	0.615734	27
2	0.5739	0.5	1	0.7777	0.63639	25
3	0.5	0.5079	0.9429	1	0.630191	26
4	0.6891	0.534	0.8111	0.7833	0.677547	12
5	0.6604	0.5592	0.7733	0.7929	0.667542	16
6	0.613	0.5588	0.8493	0.7963	0.654749	22
7	0.7555	0.6773	0.78	0.7499	0.737271	4
8	0.6687	0.5865	0.7843	0.7086	0.667177	17
9	0.6553	0.5332	0.8518	0.7837	0.666397	18
10	0.6419	0.5642	0.8245	0.8387	0.673156	14
11	0.575	0.549	0.8502	0.8659	0.644931	23
12	0.583	0.5457	0.8482	0.832	0.642496	24
13	0.8247	0.7018	0.6692	0.7812	0.76759	2
14	0.6961	0.573	0.7874	0.7372	0.68124	11
15	0.6483	0.5901	0.7543	0.7838	0.666199	19
16	0.7193	0.7128	0.7069	0.7614	0.722451	5

17	0.7102	0.6527	0.6939	0.7046	0.692434	8
18	0.6955	0.5353	0.7537	0.7525	0.669392	15
19	0.6783	0.6558	0.7745	0.7816	0.699512	7
20	0.6298	0.6046	0.7825	0.7499	0.659573	21
21	0.6048	0.5853	0.8044	0.8551	0.661256	20
22	0.8038	0.6824	0.6233	0.7495	0.742429	3
23	0.6859	0.6535	0.7819	0.6788	0.687924	10
24	0.6412	0.6177	0.8439	0.7422	0.674562	13
25	1	1	0.5	0.6014	0.880208	1
26	0.7909	0.6487	0.6374	0.5	0.691882	9
27	0.7625	0.6224	0.7326	0.6178	0.700792	6

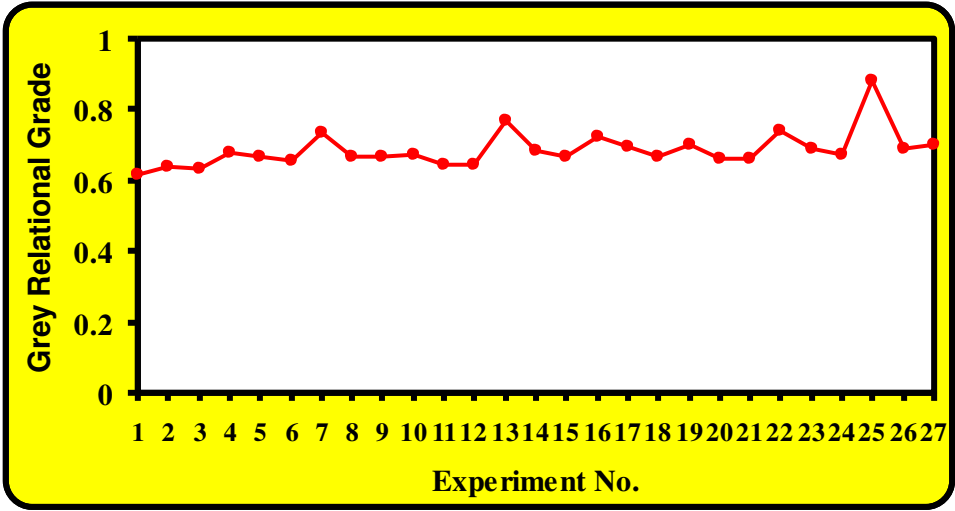


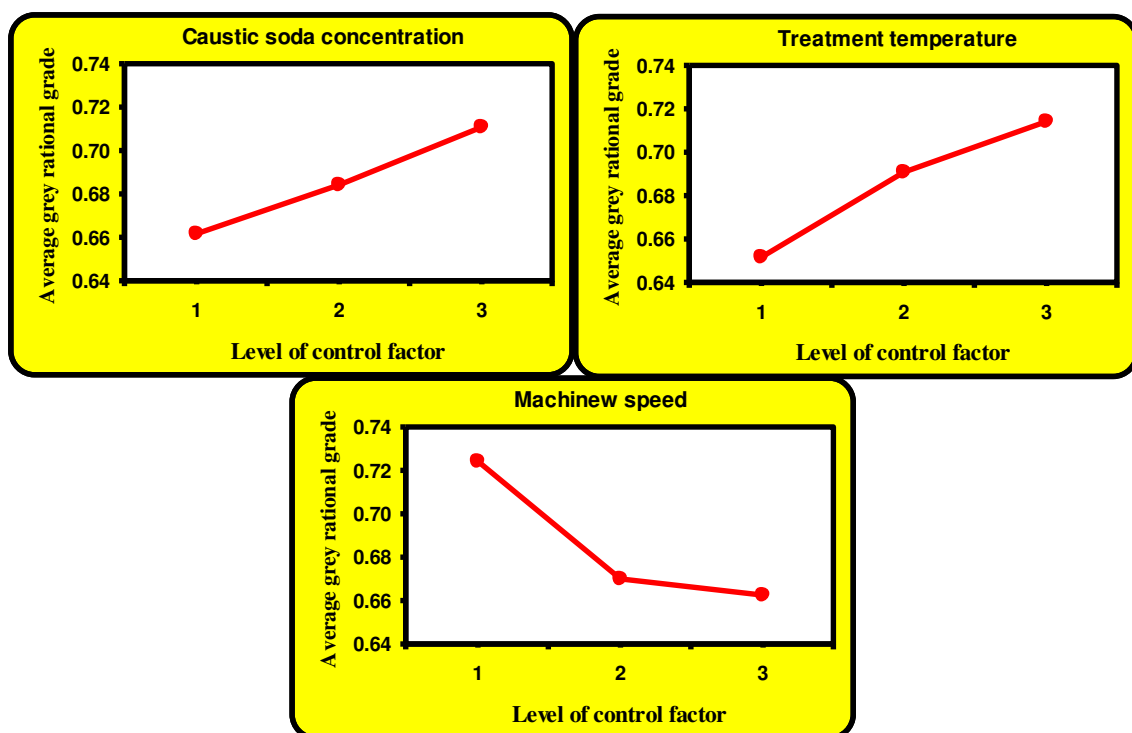
Figure 5. Values of grey relational grades versus experiment numbers.

From Figure 5 and Table 6, it can be noticed that the highest value of the grey relational grade was associated with the alkaline hydrolyzed polyester fabric with parameters stated in experiment number 25. Therefore, among the 27 experiments, experiment number 25 gave the best multi-performance characteristics. It is also observed that experiment number one has the lowest value of the grey relational grade among all cases. Response Table 7 shows the average values of GRG at different control factor levels. It should be noted that the grey relational grade refers to the degree of association between referential and comparative sequences. The higher the grey relational grade, the stronger correlation between the two sequences is. Consequently, the highest value of the grey relational grade yields the best result where maximum weight reduction, maximum air permeability, maximum tensile strength, and minimum thermal resistance are achieved for this study. From Table 7, it can be proved that the highest grey relational grade values for the different control factors, namely A, B, and C are A₃, B₃, and C₁. Therefore, A₃B₃C₁ expresses the optimum combination of alkaline-treated micropolyester fabric parameters to maximize weight reduction percentage, tensile strength, and air permeability and minimize their thermal resistance as well. Besides, it has been confirmed that the factor with the highest gain value has the most impact on the characteristic performance. Table 7 further shows that the most important factor influencing the performance qualities of treated polyester fabrics is the treatment temperature.

Table 7. Average values of grey relational grades at different factors levels.

Control factors	Level1	Level 2	Level 3	Gain (Max-Min)
Caustic soda concentration	0.6614	0.6844	0.7109 ^a	0.0495
Treatment temperature	0.6515	0.6911	0.7142 ^a	0.0627
Machine speed	0.7240 ^a	0.6699	0.6629	0.0611
Total mean grey relational grade= 0.6856 – a is the optimal level				

Figure 6 illustrates the effects of each control factor on the average grades of the grey relational analysis. This figure demonstrates that the third level of NaOH concentration and treatment temperature, along with the first level of weight reduction machine speed are the optimum levels to maximize tensile strength, air permeability, and weight reduction and minimize the thermal resistance of the treated micropolyester fabrics.

**Figure 6.** Levels of control factors versus their corresponding average grey relational grades.

3.2. Results of the analysis of variance (ANOVA)

Using analysis of variance (ANOVA), the impact of each control factor on the grey relational grade was assessed, and the contribution of each factor was also shown in Table 8. From this table, it can be noticed that all control factors have a significant influence on the grey relational grade at a 0.01 significant level. It is also seen that the treatment temperature has the most influential effect on the multiple performance characteristics. It was estimated that the treatment temperature accounted for 29% of the effects on the grey relational grade, while caustic soda concentration and machine speed accounted for 15% and 26% respectively of the effects on the grey relational grade. This means that treatment temperature affects the alkaline-treated polyester fabric properties more than other control parameters. It is also seen that the contribution percentage of each control factor can be confirmed using the value of significant levels (p-values) in Table 8. As the percentage contribution of the control factor on the multi-performance characteristics increases, the p-value decreases. It is also noticed that the contribution percentage of each control factor is agreeing with the gain values listed in Table 7.

Table 8. Analysis of variance ANOVA for the grey relational grades.

Source of variation	DF	SS	MS	F	P-value	Contribution %
Caustic soda concentration	2	0.01103	0.0055	5.19	0.015	15
Treatment temperature	2	0.02012	0.1006	9.48	0.001	29
Machine speed	2	0.0183	0.0091	8.54	0.002	26
Error	20	0.02123	0.0011			30
Total	26	0.07051				

3.3. Confirmation test

After determining the optimal process control factors, the confirmation test is conducted to validate the analysis. The control factors are incorporated in the confirmation experiment at their optimal levels. The following equation can be used to forecast the grey relational analysis:

$$\gamma_{pred} = \gamma_t + \sum(\gamma_i - \gamma_t) \quad (14)$$

where γ_t represents the overall average of GRG values, γ_i denotes the average of GRG values at optimal levels as obtained from Table 9. From the above equation, it was estimated that the forecasted value of the GRG is about 0.778. The prediction of percentage error refers to the closeness of both experimental and predicted of GRG values to each other. It was determined that the prediction error percentage is about 11%. In comparison to the initial condition, the grey relational grade was improved by around 42%. Also, using the grey relational analysis, the weight reduction of the treated micropolyester fabrics increased from 8.7% to 36.8%, and air permeability also increased from 9.7 cm³/cm².sec to 28.6 cm³/cm².sec. Regarding the thermal resistance of the treated fabrics, it was found to be improved by approximately 5%. In the case of tensile resistance, it was decreased from 753 Newton to 493 Newton. This result is natural because the alkaline treatment of the polyester fabric makes the fabric becomes thinner, which in turn reduces its tensile strength.

Table 9. Confirmation experiment results for initial, experimental, and predicted grey relational grades.

Levels	Initial conditions A ₁ B ₁ C ₁	Optima conditions	
		Predicted A ₃ B ₃ C ₁	Experimental A ₃ B ₃ C ₁
Weight reduction	8.7	---	36.8
Air permeability	9.7	----	28.6
Tensile strength	753.4	----	492.6
Thermal resistance	4.7	-----	3.34
GRG	0.6157	0.778	0.88

4. Conclusion

In this study, a 3³ full factorial design with the help of the Taguchi methodology and the grey relational analysis were effectively utilized to optimize the control parameters of the weight loss process of the alkaline-treated micropolyester woven fabrics. The essential design parameters of this process were NaOH concentration, treatment temperature, and weight loss machine speed. The weight reduction percentage, air permeability, tensile strength, and thermal resistance of alkali-treated polyester fabrics were taken as response variables. This study's findings reveal that all the control parameters significantly impact the properties of the treated polyester fabrics. It was found that the treatment temperature has the greatest impact on the treated fabric properties. The highest grey relational grade was found to be associated with the polyester fabrics treated with the highest

NaOH concentration, highest treatment temperature, and lowest weight loss machine speed. The confirmation test detected and predicted the grey relational grade which was found to equal 0.778. It was estimated that the prediction error percentage of optimum GRG and the corresponding predicted one is about 11%. It was also found that the grey relational analysis improved the treated fabric properties with substantial values.

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