Experimental design applied to improve the efficiency and the performance of the reverse osmosis process

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abstract

This research focuses on optimizing the reverse osmosis process applied to water desalination in the Noor 1 Ouarzazate plant. The purpose of this process is to remove salt from brackish water from the Mansour Eddahbi dam. A complete factorial design based on four factors, that is, 2⁴, has been used to evaluate the parameters affecting the desalination efficiency aiming to optimize the conductivity rejection rate, the calcium rejection rate, the magnesium rejection rate, and the transmembrane pressure. Furthermore, a linear mathematical model based on the experimental results has been carried out to estimate the impact of the different parameters considered and their relative interactions. As a result, this study reaches the optimal conditions for the reverse osmosis process, pH is 8, the antiscalant concentration is 6 ppm, the flow rate is 38 m³ h⁻¹, and the redox potential is 100 mV. It also shows that the pH, the antiscalant concentration, and the flow rate are the most statistically significant factors affecting the selectivity of metal ions, while the flow rate is the most influencing factor on the transmembrane pressure. Thus, the results of experience are applied to the process and verify the predicted optimal conditions.

Keywords: Noor 1 Ouarzazate; Water desalination; Reverse osmosis; Metal ions removal; Design experimental

1. Introduction

Over the last few decades, the available water resources have decreased due to excessive consumption [1,2]. To solve this issue, seawater or brackish water desalination is one of the most promising methods for producing freshwater [3–5].

Among the different desalination technologies, reverse osmosis (RO) is one of the leading filtration techniques currently available [3,5,6]. It is a demineralization process based on a semi-permeable membrane to remove the low molecular weight compounds from water [7,8]. Under the effect of a pressure gradient, which allows having two fractions with different concentrations, the first one that passes through the membrane is called permeate, and the second one, which is rejected, is called the concentrate [6,9].

The reverse osmosis applications are numerous. It is used for brackish water treatment, drinking production, seawater desalination, a ruse of wastewater, and industrial process water [6,10,11]. Moreover, reverse osmosis is often used to produce ultrapure water in the solar power plant [12,13].

Noor 1 is a good example. It is the first project within the solar energy complex of Ouarzazate City. It uses a parabolic concentrating solar power (CSP) technology with

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a capacity of 160 MW. The First National Operation & Maintenance Company (NOMAC) operates it [14–16].

This technology used in the plant consists of solar radiation that is concentrated by curved mirrors on a tube or collector through which a heat transfer fluid (HTF) circulates [17–19]. Then, the liquid is used to collect the heat as thermal energy, transport it to the steam generation system (SGS), and generate electricity through a turbine generator [13,19–21].

Water remains an essential element during this process. Therefore, effective treatment is required to remove all undesirable substances in order to obtain demineralized water [17,22].

Water pretreatment includes hypochlorite disinfection, coagulation-flocculation, dissolved air flotation, and multimedia system [23,24]. Demineralization of water goes through three essential steps, it begins with the first reverse osmosis 1 (RO1), followed by the second reverse osmosis (RO2), and it ends with electrodeionization (EDI) [14,25,26].

Improving the quality of demineralized water requires enhancing the quality of each step of the process [26]. In this study, particular emphasis is placed on the first step (RO1), considered a decisive stage in the treatment process. In order to evaluate and improve the efficiency of this process, it has been relying on an experimental design.

The experimental design is the set of specific experiments determined by a matrix composed of at least two factors and a minimum of two levels; it should be developed to obtain the responses [27,28]. The number of experiments and the levels of the factors studied depends on the established matrix. In addition, it allows a more accurate description of the process by considering the possible interactions between the different factors affecting the process [3,29].

Firstly, the physicochemical composition of the feed water, the permeate, and the concentrate has been analyzed. Secondly, an experimental design methodology based on four factors, the pH, the flow rate, the concentration of antiscalant, and the redox potential, has been developed to detect their optimum condition. Finally, this model optimizes conductivity rejection rate, calcium rejection rate, magnesium rejection rate, and transmembrane pressure.

2. Materials and methods

The experiment was carried at the water treatment plant (WTP), Noor 1 plant Ouarzazate City, to evaluate the efficiency and improve the performance of the reverse osmosis process for metal ions removal from the water.

2.1. Feedwater

The source of the water supply for the solar power station is the dam Mansour Eddahbi. The feed water reaches the first reverse osmosis membrane (RO1) after undergoing pretreatment and primary treatment; screening, sandblasting, coagulation–flocculation, dissolved air flotation (DAF), and multimedia filtration [14,15,24].

Reverse osmosis RO1 consists of three trains installed in parallel. Each train is composed of two stages; the feedwater passes through the first stage (made up of four modular series), and the rejection is filtered again through the second stage (consisting of three modular series) [14]. All the experiments were done on the first train of RO1.

2.2. Membrane treatment

The type of membrane used in each modular of reverse osmosis 1 was Filmtec BW30XFR-400/34i. Its specifications are shown in Table 1 [12,30]:

2.3. Chemicals reagents

The feedwater used for the desalination process is conditioned by adding a certain number of chemicals to improve downstream processing performance. The antiscalant with the commercial name Hypersperse MDC704, based on phosphonate [31], avoids scaling. Hydrochloric acid avoids scaling and setting the pH. The antifouling, SMAS Y-230, prevents biofouling. Moreover, the reducing agent, sodium bisulfite, removes residual free chlorine [14,25].

2.4. Analytical methods

The ion concentrations in the feedwater, the reverse osmosis permeate and concentrate solutions were measured using an analytical kit, HACH Reagents, using the DR3900 Laboratory VIS Spectrophotometer with RFID technology. A pH meter HQD Portable was used for pH measurements of the solution throughout the study. The electrical conductivity and the total dissolved solids (TDS) are measured by HQD Portable Meters. In addition, measuring and monitoring turbidity was carried out with a 2100Q Portable Turbidimeter.

2.5. Data analysis

2.5.1. Efficacy evaluation

The evaluation of the efficiency of treatment by the reverse osmosis (rejection rate) is calculated by the following formula [9,11]:

$$
R(\%) = \left(\frac{C_0 - C_p}{C_0}\right) \times 100 = \left(1 - \frac{C_p}{C_0}\right) \times 100\tag{1}
$$

where *R*: rejection rate, also called selectivity; C_0 : concentration of the species present in the feedwater (ppm); C_p : concentration of the same species in permeate water (ppm); C_n : concentration of the same species in concentrate water (ppm).

The membrane flux is calculated using Eq. (2) [32]:

$$
J_p = \frac{F_p}{A} \tag{2}
$$

The recovery rate R_r of the reverse osmosis is calculated by Eq. (3) [11]:

$$
R_r\left(\% \right) = \frac{F_p}{F_0} \times 100\tag{3}
$$

the mass of scale formed on the membrane surface can be calculated using the following mass balance [32]:

Table 1 Specifications of the reverse osmosis 1 (RO1) membrane

Brand	Model	Membrane type	Active area $(m2)$	Average salt rejection $(\%)$	Minimum salt rejection $(\%)$
FILMTEC Membranes	BW30XFR-400/34i	Polyamide thin-film composite	-37	99.65%	99.40%
Max. pressure (bar)	Max. temperature $(^{\circ}C)$	Permeate flow $(m^3 h^{-1})$	pH range, continuous operation	Maximum feed silt density index	Free chlorine tolerance
41	45.0	43.3	$2 - 11$	5	< 0.1 ppm

$$
M_t = (J_0 \times C_0) - (J_P \times C_P + J_R \times C_R)
$$
\n⁽⁴⁾

where *A*: active area of membrane (m²); $M_{\text{t/s}}$: mass of scale formed on the membrane surface per unit of time (g m⁻² h⁻¹); J_0 : Flow of water in the feed stream (L m⁻² h⁻¹); J_p : the flow of water in the permeate stream (L m⁻² h⁻¹); J_R : the flow of water in the concentrate stream (L m^{-2} h⁻¹).

2.5.2. Optimization method

A model based on experimental design methodology is used to evaluate the effect of parameters influencing the efficiency of the reverse osmosis process, using STATGRAPHICS Centurion XVI software [3].

The experimental design established is the two-level complete factorial design 2*ⁿ* , where the factor number n is equal to four; pH (X_1) , antiscalant concentration (X_2) , flow (X_3) , and redox (X_4) . Thus, this experimental design matrix has two levels (–1 and 1) and sixteen experiments [3,27].

In this study, four responses were taken into account: conductivity rejection rate (Y_1) , calcium rejection rate (Y_2) , magnesium rejection rate (Y_3) , and transmembrane pressure (Y_4) .

Tables 2 and 3 show the experimental domain of the design with values for each factor used in the complete factorial design as well as the low and high levels studied and the goal of each response measured.

The experimental design model is an equation that correlates the response of a plan with the experimental factors studied [3]; it is 2-factor interaction with 11 coefficients. The regression equation with four parameters and their interactions is as follows:

$$
Y_{i} = a_{i0} + a_{i1}X_{1} + a_{i2}X_{2} + a_{i3}X_{3} + a_{i4}X_{4} + a_{i12}X_{1}X_{2} + a_{i13}X_{1}X_{3} + a_{i14}X_{1}X_{4} + a_{i23}X_{2}X_{3} + a_{i24}X_{2}X_{4} + a_{i34}X_{3}X_{4}
$$
\n
$$
(5)
$$

where a_{i0} , a_{i1} , a_{i2} , a_{i3} , a_{i4} , a_{i12} , a_{i13} , a_{i14} , a_{i23} , a_{i24} , and a_{i34} are regression coefficients for each response.

3. Results and discussion

3.1. Water analysis

Feed, permeate and concentrate water were analyzed for six weeks (six samples each) from 23/10/2017 to 27/11/2017. The sample was taken every week. The flow rates are 53, 39.5, and 13.5 m^3 h⁻¹, respectively, with a rejection rate of 74.5% during operation.

3.1.1. Physical parameters

Physical parameters monitored are temperature, pH, conductivity, and turbidity as shown in Fig. 2.

The mass of scale of TDS formed on the membrane surface of each sample is presented in Table 4 using Eq. (4).

3.1.2. Chemical parameters

Chemical parameters monitored are calcium, magnesium, sulfate, iron, chloride, and orthophosphates, as shown in Fig. 3.

Table 3

Definition of the responses measured

The average temperature of the water varies between 19°C and 25°C, which is decreased in the last two samples because of the low temperature these days. The pH of the feed water ranges from 7.1 to 7.2. The turbidity at the inlet of the membranes is generally greater than 1 NTU, which leads to very rapid organic clogging of the membranes due to colloidal material, thus reducing their yield. This high value is mainly due to the pretreatment not put into service. The conductivity of feedwater is about 1680 and $43.4 \,\mu s \text{ cm}^{-1}$ for permeate water; the average efficiency is 97.54%.

From the above results, we will deduce that the major elements present in water with high concentrations are calcium, magnesium, chloride, and sulfate. On the other hand, iron and orthophosphates are present at low concentrations. Therefore, the average rejection rates for eliminating major ions in water are 99.652% for calcium, 99.656%

Table 4 The mass of scale of TDS

for magnesium, 97.522% for sulfate, and 97.295% for chloride.

3.2. Optimizing the performance

3.2.1. Experimental results

The performance can be improved by looking for optimal conditions for all parameters using the experimental design method. Table 5 shows a worksheet containing the 16 experiments performed in the order they were executed, and each sample was taken after 10 min of flushing and 4 h of operation.

From these experiments, it is noted as a preliminary remark that the pH 8 and antiscalant concentration of 6 ppm gives the best retention, and the flow rate of $38 \text{ m}^3 \text{ h}^{-1}$ gives a low transmembrane pressure.

Table 5 Worksheet for experiments

Exp. no. Factors Responses X_i : pH X_2 : antiscalant X_3 $X₃$: flow *X*₄: redox Y_i : conductivity rejection *Y*₂: calcium rejection *Y*3 : magnesium rejection *Y*4 : transmembrane pressure ppm $m^3 h^{-1}$ mV % % % % bars 1 8.0 0.0 38.0 100.0 98.691 99.756 99.754 6.06 2 8.0 6.0 41.0 50.0 98.736 99.783 99.765 6.79 3 7.0 6.0 41.0 100.0 98.110 99.712 99.728 6.59 4 7.0 0.0 41.0 100.0 98.148 99.685 99.718 6.67 5 7.0 6.0 38.0 50.0 98.074 99.714 99.726 6.33 6 7.0 0.0 38.0 100.0 98.007 99.718 99.719 6.11 7 7.0 6.0 41.0 50.0 98.185 99.716 99.739 6.76 8 8.0 0.0 41.0 50.0 98.651 99.734 99.750 6.77 9 8.0 6.0 41.0 100.0 98.749 99.797 99.760 6.82 10 8.0 6.0 38.0 50.0 98.738 99.781 99.758 6.42 11 7.0 0.0 41.0 50.0 98.152 99.693 99.738 6.79 12 7.0 0.0 38.0 50.0 98.077 99.702 99.714 6.15 13 7.0 6.0 38.0 100.0 98.111 99.724 99.725 6.13 14 8.0 6.0 38.0 100.0 98.702 99.783 99.761 6.32 15 8.0 0.0 38.0 50.0 98.566 99.752 99.757 6.06 16 8.0 0.0 41.0 100.0 98.688 99.741 99.735 6.42

3.2.2. Analyze the experimental results

According to the complete factorial design for responses, estimated effects, standard errors, variance inflation factor (VIF), sum of squares (SS), degree of freedom (Df), mean square (MS), *F*-ratios, and *P*-values, standardized effects are calculated in Table 6.

The ANOVA table shows the significate (standardized) effects of each response. The effect's statistical significance can be tested by comparing the MS against an estimate of the experimental errors. It is significant if the *P*-value is lower than *F*-ratio and less than 5%, indicating that it is significantly different from zero at the 95.0% confidence level, except the main effects involved in significant interactions. Models have *P*-values below 5%, indicate that the model as the fit is statistically significant. The standardized effects are well illustrated on the Pareto chart.

3.2.3. Standardized effects and the Pareto chart

The Pareto graph is frequently used to evaluate the results of experimental designs. The effects of the factors and their interactions are presented as standardized effects (SE). Besides, a vertical line is drawn to show the factors and interactions that are significant. The red line on the *x*-axis corresponds to the critical value to indicate the minimum level [27].

Fig. 4 shows that the parameters influencing the conductivity rejection are pH, flow rate, and antiscalant. The parameters influencing the calcium rejection are pH, antiscalant, flow, pH-antiscalant interaction, and antiscalant-flow interaction. The parameters affecting the magnesium rejection are pH, antiscalant, and pH-flow interaction. The parameters influencing the transmembrane pressure are flow and antiscalant.

Fig. 1. Reverse osmosis filtration system.

Fig. 2. Physical parameters (temperature, pH, conductivity, turbidity).

The main parameters affecting the desalination system respectively are pH, antiscalant concentration, flow rate, and redox potential.

3.2.4. Model equation for 24 design

The factorial design allows the calculation of the effects of the factors and their interactions. This tool also allows a preliminary evaluation of the factors based on the generation of linear models [3]. In terms of coded variables, the model could be expressed using the regression models of the four responses by the following equations:

$$
Y_1(\%) = 93.261 + 0.582125X_1 + 0.00885417X_2 + 0.018875X_3 \tag{6}
$$

$$
Y_2(\%) = 99.6226 + 0.04625X_1 - 0.0687292X_2 - 0.00625X_3 + 0.003875X_1X_2 + 0.001125X_2X_3
$$
 (7)

Fig. 3. Chemical parameters (calcium, magnesium, sulfate, chloride, orthophosphate, iron).

$$
Y_3 (\%) = 97.7666 + 0.223333X_1 + 0.00160417X_2 + 0.0445417X_3 + 0.00350333X_4 - 0.00491667X_1X_3 - 0.0000916667X_3X_4
$$
 (8)

$$
Y_4 (\%) = 0.692917 - 0.1025X_1 - 0.273333X_2 + 0.167917X_3 - 0.002375X_4 + 0.0395833X_1X_2
$$
\n(9)

3.2.5. Optimize the responses

According to the study, the optimal setting of the experimental factors is determined. The results are displayed in Table 7.

Through the linear models, Table 8 shows the values of the responses at optimum.

The value of the responses, Y_1 , Y_2 , and Y_3 , shows that the rejection rate is increased from 97.540%, 99.650%, and 99.660%, to 98.688%, 99.785%, and 99.762%, respectively. Similarly, they show that the transmembrane pressure is decreased from 6.581 to 6.276 bars.

4. Conclusion

In this study, the performance of the reverse osmosis process is investigated, and it is improved using the experimental design. Primary findings drawn can be summarized as follows:

- The components found in the water with high concentrations are calcium, magnesium, chloride, and sulfate.
- The pH and antiscalant concentration are the most significant parameters of the rejection rate of calcium, magnesium, and conductivity. The flow is the main parameter influencing the transmembrane pressure.

Table 7 Factor settings at optimum

Factor	Value
X_i : pH	
$X2$: Antiscalant concentration (ppm)	h
X_i : Flow rate (m ³ h ⁻¹)	38
X_i : Redox potential (mV)	

- The rejection rate of calcium and magnesium is increased from 98.650% to 99.785% and from 99.660% to 99.762%, respectively. The conductivity rejection rate is increased from 97.540% to 98.688%, and the transmembrane pressure is reduced from 6.58 to 6.276 bars.
- The optimal conditions obtained for the factors are: antiscalant concentration = 6 ppm, pH = 8 , Flow rate = 38 m^3 h⁻¹, and redox potential = 100 mV . These parameters are validated by the results of the experiments applied to the process.

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Fig. 4. Analysis of experiences (Pareto chart).

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Declaration of competing interest

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

Symbols

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