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### Application of Multi-Objective Optimization by S and R\* Optimal Combination Criteria to Determine the Freeze Drying Mode of *Penaeus monodon*

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### Abstract

The establishment of the freeze drying mode of *Penaeus monodon* was based on the solution to multi-objective optimization problem. Experiments was carried out to set up the objective functions describing the influence of technological factors (temperature and pressure of freeze drying chamber, and time of freeze drying) to the freeze drying process. The restricted area method with  $R^{*}(Z)$  optimal combination criterion was applied to solve the multi-objective optimization problem, determining the optimal technological mode of freeze drying process (correspondingly 33.96°C, 0.008 mmHg and 13.21h) in order that the objective functions reached the minimum value in terms of the finished product, including the energy consumption of 68.77 kWh/kg, the residual water content of 4.76%, the anti-rehydration capacity of 7.82%, the volume contraction of 8.82% and the loss of vitamin C of 1.91%.

**Keywords:** Multi-objective optimization; Freeze drying; *Penaeus monodon* 

#### Introduction

Freeze drying is a complicated technique including three consecutive main stages which are represented in the process diagram of Figure 17. The first stage is freezing the material; the second and the third stage are respectively the sublimation drying and vacuum drying. Both these final stages determine the quality of the product [6,7].

According to Figure 1, the determination of the freeze drying mode required the outputs to reach the minimal level, including the energy consumption per weight ( $y_1$ ,kWh/kg), the residual water content ( $y_2$ ,%), the anti-rehydration capacity ( $y_3$ ,%), the volume contraction ( $y_4$ ,%) and the loss of vitamin C ( $y_5$ ,%) of the freeze-dried product (finished product). It should be emphasized that these 5 outputs were affected by the 3 technological factors: temperature of freeze drying chamber ( $Z_1$ °C), pressure of freeze drying chamber ( $Z_2$ ,mmHg) and time of freeze drying ( $Z_3$ ,h).

However, the simultaneous consideration of all these outputs above to reach the minimal level resulted in the standard solution to the multi-objective optimization problem [4,11]. This problem regularly appears in reality and in different fields. The answer to the multi-objective optimization problem was found in the case of the application of the  $R^*(Z)$  optimal combination criterion (also known as the restricted area method) for the freeze drying process of *Penaeus monodon*. By solving the heat and mass transfer model of the freeze drying dehydration [2,3], the multi-objective optimization results were used to establish the freeze drying mode of *Penaeus monodon* which



was the closest to the utopian point but the furthest from the restricted area C, [4,11,12].

### The fundamental of multi-objective optimization by S And R\* optimal combination criteria

**Basic concepts:** The technological subjects including m objective functions  $f_1(Z)$ ,  $f_2(Z)$ , ...,  $f_m(Z)$  form the vector of these functions  $f(Z) = \{f_j(Z)\} = \{f_1(Z), f_2(Z), ..., f_m(Z)\}$ , where  $j = 1 \div m$ . Every objective function  $f_j(Z)$  will be affected by n variables  $Z_1, Z_2, ..., Z_n$  which form the Z variable vector  $Z = \{Z_i\} = (Z_1, Z_2, ..., Z_n)$ , where  $i = 1 \div n$ . These variables vary in the identified domain  $\Omega_z$  and the function values form the domain of the objective function  $\Omega_f$  (in the two-objective optimization problem, the domain can be performed geometrically in the closed curve  $\mathbf{A} - \mathbf{f}(\mathbf{ZS}) - \mathbf{f}(\mathbf{ZR}) - \mathbf{B} - \mathbf{N} - \mathbf{M}$ , Figure 2), [4,11,12].

Every objective function  $f_j(Z)$  with Z variable vector  $Z = \{Z_i\}$ =  $(Z_1, Z_2, ..., Z_n)$ , where  $i = 1 \div n$ , is considered as the one-objective optimization problem. Hence, the m-objective optimization problem can be simply transformed into the problem to find the minimum value for the set of m one-objective optimization problems, [4,11,12]:

$$f_{imin} = f_i(Z_1^{j \text{ opt}}, Z_2^{j \text{ opt}}, ..., Z_n^{j \text{ opt}}) = Min f_i(Z_1, Z_2, ..., Z_n)$$
(1)

$$Z = \{Z_i\} = (Z_1, Z_2, ..., Z_n) \in \Omega_Z$$
(2)

$$j = 1 \div m; i = 1 \div n \tag{3}$$

The utopian plan and the utopian effect: If the variable vector  $Z^{UT} = \{Z_i^{UT}\} = (Z_1^{UT}, Z_2^{UT}, ..., Z_n^{UT}) \in \Omega_Z$  is the test for all one-objective

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optimization problems (1) + (2) + (3), it means that  $Z_i^{\text{UT}} = Z_i^{\text{jopt}}$  with i = 1 ÷ n. Thus,  $Z_i^{\text{UT}}$  is called the utopian plan or the utopian test of the m-objective optimization problem, [4,11,12].

In reality,  $Z_i^{UT}$  does not exist. However, every one-objective optimization problem (1) + (2) + (3) has its own  $f_{jmin}$  (with  $j = 1 \div m$ ) respectively, so  $f^{UT} = (f_{1min}, f_{2min}, ..., f_{mmin})$  does exist. Then,  $f^{UT} = (f_{1min}, f_{2min}, ..., f_{mmin})$  is called the utopian effect or the utopian point. According to Figure 2, the utopian point  $f^{UT}$  of the two-objetive optimization problem exists but lies outside the identified domain  $\Omega_{p}$  i.e. the utopian test does not exist.

The dominant plan and the dominated plan: It is assumed that there are two variable vectors  $ZQ = \{ZQ_i\}$  and  $ZV = \{ZV_i\}$  with  $i = 1 \div n$ . Then, there exist respectively two function vectors  $f(ZQ) = \{f_j(ZQ)\}$  and  $f(ZV) = \{f_i(ZV)\}$  with  $j = 1 \div m$ .

If with all j:  $f_j(ZQ) < f_j(ZV)$ , ZQ is called the dominant plan (or the dominant test) over ZV, symbolizing: ZQ '>' ZV; and ZV is called the dominated plan (or the dominated test), symbolizing: ZV '<' ZQ, [4,11,12].

#### The optimal paréto plan

The ZP plan is called the optimal Paréto plan in condition that ZP cannot be dominated by any other plans dependable on the identified domain  $\Omega_z$ . Then, f(ZP) would be called an optimal Paréto effect in the set of the optimal Paréto effects  $\Omega$ fP. Figure 2 performs the set of the optimal Paréto effects  $\Omega$ fP as the curve **A** – **f**(**ZS**) – **f**(**ZR**) – **B**, [4,11,12].

**Theorem 1:** (Theorem Paréto): If the multi-objective optimization problem has the test which is the so-called optimal one according to some definition, this test received has to be the optimal Paréto plan without the dependence on the chosen definition, [4,11,12].

**Proof:** If optimal Z test of the multi-objective optimization problem is not the optimal Paréto plan, it is certainly able to find at least one plan dominating Z. This proves that Z can not be recognized as the optimal test and leads to the conflict with the assumption that Z is the optimal test. Thus, Z must be a plan over which cannot be dominant, i.e. the Paréto plan is optimal.

Therefore, one test of the multi-objective optimization problem (1) + (2) + (3) found by any method, to be recognized as the optimal by the method chosen, must in advance be certified as the optimal Paréto plan.

### Multi-objective optimization by the utopian point method with S(Z) optimal combination criterion

Considering the m-objective optimization problem (1) + (2) + (3): The optimal values  $f_{1\min}$ ,  $f_{2\min}$ , ...,  $f_{m\min}$  can be determined after solving each problems, and the fact that the utopian test (the test for the whole system) does not exist still identifies the utopian point  $f^{UT} = (f_{1\min}, f_{2\min}, ..., f_{m\min})$ . A S(Z) optimal combination criterion is defined by the following expression [4,12]:

$$S(Z) = \sqrt{\left[\sum_{j=1}^{m} s_j^2(Z)\right]} = \sqrt{\left[\sum_{j=1}^{m} (f_j(Z) - f_{j\min})^2\right]}$$
(4)

It is obvious that S(Z) is the distance from f(Z) to  $f^{UT}$ . Choosing S(Z) optimal combination criterion as an objective function, the m-objective optimization problem are restated as:

Find ZS =  $(Z_1S, Z_2S, ..., Z_nS) \in \Omega_z$  in order that the objective

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function S(Z) reaches the minimum value:

$$S_{\min} = S(ZS) = \min\{S(Z)\} = \min\left\{\sqrt{\left[\sum_{j=1}^{m} (f_j(Z) - f_{j\min})^2\right]}\right\}$$
(5)  
$$\forall Z = (Z_1, ..., Z_n) \Omega_Z$$

**Theorem 2:** (Theorem Paréto): If ZS of the optimization problem (5) does exist, ZS is the optimal Paréto test of the m-objective optimization problem (1) + (2) + (3), [4,11].

**Proof**: It is assumed that ZS is not optimal Paréto test. Then, it will be found that ZS<sup>\*</sup> is dominant over ZS. By definition, ZS<sup>\*</sup> must have at least an effect  $f_k(ZS^*)$ , where  $1 \le k \le m$  in order that  $f_k(ZS^*) < f_k(ZS)$ . As a result, S(ZS) < S(ZS). This contradicts the assumption that ZS is the optimal test (5). Hence, there does not exist any other dominant tests over ZS. Therefore, ZS must be an optimal Paréto test [4,11].

**Symbol:**  $f(ZS) = fPS = (f_1PS, f_2PS, ..., f_mPS)$ . With the utopian point method (i.e. the m-objective optimization problem convert into the S optimal combination criterion), the optimal Paréto test ZS will be found to have the optimal Paréto effect f(ZS) = fPS closest to the utopian point  $f^{UT} = (f_{1\min}, f_{2\min}, ..., f_{m\min})$ . The case m = 2 (two objectives) is illustrated in Figure 2.

Optimizing the multi-objective functions by the restricted area method with  $R^*(Z)$  optimal combination criterion

In fact, every objective function  $f_j(Z)$  is restricted by the conditions set up by technology. Such as:

a) Case 1: The obligatory conditions 
$$f_j(Z) < C_j$$
,  $\forall j = 1 \div m$ ,  
 $\forall Z \in \Omega_{\gamma}$  (6)

From (6), the restricted area would be made:  $C = \{f_j(Z) \ge C_j\}$ , with  $f_i(Z)$  (7)

The restricted area method suggests the solution to the m-objective optimization problem (1) + (2) + (3) by  $R^*(Z)$  optimal combination criterion, defined as, [4,12]:

$$R^{*}(Z) = \sqrt[m]{r_{1}(Z). r_{2}(Z)... r_{m}(Z)} = \sqrt[m]{\prod_{j=1}^{m} r_{j}(Z)}$$
(8)



Figure 2: Dimension of objective functions of the two-objective optimization problem.

With 
$$r_j(Z) = \left(\frac{C_j - f_j(Z)}{C_j - f_{j\min}}\right)$$
 when  $f_j(Z) < C_j$  (9)

$$r_j(Z) = 0$$
 when  $f_j(Z) \ge C_j$  (10)

According to (9), if  $f_i(Z) \rightarrow f_{i\min}$  and  $\forall f_i(Z) < C_i, r_i(Z) \rightarrow r_{i\max} = 1$ .

By choosing  $R^*(Z)$  as the objective function, the m-objective optimization problem is restated as:

Find  $ZR = (Z_1R, Z_2R..., Z_nR) \in \Omega_Z$  in order that  $R^*(Z)$  reaches the maximum value.

$$R^{*}_{\max} = R^{*}(ZR) = \max\left\{R^{*}(Z)\right\} = \max\left\{m\sqrt{\left\lfloor\prod_{j=1}^{m}r_{j}(Z)\right\rfloor}\right\}$$
(11)  
$$\forall Z = (Z_{1}...Z_{n}) \in \Omega_{Z}$$

From (9), it can be seen:  $0 \le R^*(ZR) \le 1$ . If  $R^*(ZR) = 1$ ,  $ZR = Z^{UT}$  – the utopian test. If  $R^*(ZR) = 0$ , one of the values of  $f_j(Z)$  violates (6), which means that  $f_i(Z)$  belongs to the restricted area C (7).

**Theorem 3:** If the multi-objective optimization problem (11) has it own test ZR, this test ZR is also the optimal Paréto test of the m-objective optimization problem (1) + (2) + (3), [4,11].

**Symbol**:  $f(ZR) = fPR = (f_1PR, f_2PR, ..., f_mPR)$ . With the optimal ZR, the optimal Paréto effect  $fPR = (f_1PR, f_2PR..., f_mPR)$  would be the closest to the utopian point and the furthest from the restricted area C.

b) Case 2: The obligatory conditions  $a_j < f_j(Z) < b_j, \; \forall j = 1 \div m, \; \forall Z \in \Omega_Z$  (12)

Then, setting a new objective function:

$$I_{j}(Z) = \left[ f_{j}(Z) - \frac{a_{j} + b_{j}}{2} \right]^{2}$$
(13)

From (13), it can be seen: if  $I_j(Z) \rightarrow I_{j\min} = 0$ ,  $f_j(Z) \rightarrow f_{j\min} = (a_j + b_j)/2$ ,  $\forall Z \ \Omega_Z$ .

When 
$$\frac{a_j + b_j}{2} < f_j(Z) < b_j$$
, then  

$$0 < \left[ f_j(Z) - \frac{a_j + b_j}{2} \right] < \frac{b_j - a_j}{2}$$
(14)

When  $a_j < f_j(Z) \le \frac{a_j + b_j}{2}$ , then

$$-\frac{b_j - a_j}{2} < \left[ f_j(Z) - \frac{a_j + b_j}{2} \right] \le 0$$
(15)

From (14) and (15), we have:  $0 \le \left| f_j(Z) - \frac{a_j + b_j}{2} \right| < \frac{b_j - a_j}{2}$  (16)

Combining (13) and (16), we have:

$$I_{j}(Z) = \left[ f_{j}(Z) - \frac{a_{j} + b_{j}}{2} \right]^{2} < \left( \frac{b_{j} - a_{j}}{2} \right)^{2} = C_{j}$$
(17)

From (17), the restricted area of the new objective function is defined as:

$$C = \{I_j (Z) \ge C_j\}, \text{ with } C_j = \left(\frac{b_j - a_j}{2}\right)^2$$
(18)

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As a result of the fact that the restricted area (18) is the same as (6), the multi-objective optimization problem is solved similarly as case 1.

#### Materials and Methods

#### Materials

The material used for the freeze drying experiment was *Penaeus monodon* which had the approximate weight of  $(41 \div 50)$  prawns/ pound, with the size coefficient K = 11, [1]. Blanched at 70°C during  $(15 \div 30)$  seconds, the material was processed minimally by peeling off the shells and cutting off the heads.

#### Apparatus

- The freeze drying machine DS-3 was controlled automatically by computer (Figure 3)

- The tools determining these factors such as energy consumption, residual water content, rehydration capacity, volume contraction, and loss of vitamin C could be referred to by [1,5].

#### Methods

Determining the energy consumption  $(y_1, kWh/kg \text{ product})$  for 1 kg finished product by Watt meter, [1,5].

$$y_1 = \frac{U.I.\tau.\cos\phi}{G}$$
(19)

Where: G [kg] – mass finished product;

U [V] – number of Voltmeter;

I [A] – munber of Amperemeter;

 $\tau$  [s] – times

Determining the residual water content of the finished product (**y**<sub>2</sub>, **%**) by mass sensor through computer, [1,5].

$$y_2 = 100 - \frac{G_i}{G_e} (100 - W_i)$$
<sup>(20)</sup>

Determining the anti-rehydration capacity of the finished product



Figure 3: The freeze drying system DS-3 with the auto-freezing (-50 ÷ - 45)°C.

( $y_3$ , %) indirectly by IR [%], which is the rehydration capacity of the finished product:  $y_3 = 100 - IR$ , [1,5].

$$IR = \frac{G_1 - G_e}{G_i - G_e} .100\%$$
(21)

$$y_3 = 100 - IR = \frac{G_i - G_1}{G_i - G_e} 100\%$$
(22)

where: G<sub>i</sub> [kg] – weight of the initial material used for freeze drying; G<sub>e</sub> [kg] - weight of the finished product, G<sub>1</sub> [kg] – weight of the finished product which was soaked into the water at 25°C until the constant mass (the saturation of the water content), W<sub>i</sub> [%] – initial water content of the material.

The ideal rehyration capacity of the product means that the inwater content is equal to the out-water content of the product, i.e.  $G_1 = G_i$  and  $IR_{max} = 1 = 100\%$ ,  $y_{3min} = 0$ . In fact,  $y_3 > 0$ .

Determining the volume contraction ( $y_4$ , %) by the volume of the initial material ( $V_1$ ) and of the finished product after freeze drying ( $V_2$ ), [1,5]:

$$y_4 = \frac{V_1 - V_2}{V_1} 100\% = \frac{\Delta V}{V_1} 100\%$$
(23)

The fact that the surface of the product is not rough and not contracted means  $y_{\rm 4min}=0.$  In fact,  $y_4>0.$ 

Determining the loss of vitamin C of the finished product ( $y_{_5}$ ,%) according to the method TCVN 4715 – 89, [1,5].

$$y_5 = \frac{m_1 - m_2}{m_1} 100\% = \frac{\Delta m}{m_1} 100\%$$
(24)

where:  $m_1$  and  $m_2$  [mg%] – the vitamin C content of the material before and after freeze drying respectively. The fact that the product achieves the best quality means  $y_{5min} = 0$ . In fact,  $y_5>0$ .

- 1. Determining the temperature and pressure by sensors in the machine.
- 2. Quadratic orthogonal experimental planning method, [4,10].
- 3. Establishing and solving 5-objective optimization problem by the restricted area method.

#### **Results and Discussion**

#### Establishing the constituent objective functions of the multiobjective problem

The constituent objective functions of the optimal freeze drying  $(\mathbf{y}_1, \mathbf{y}_2, \mathbf{y}_3, \mathbf{y}_4, \mathbf{y}_5)$  depended on the parameters, including: temperature of freeze drying chamber  $(\mathbf{Z}_1, \mathbf{C})$ , pressure of freeze drying chamber  $(\mathbf{Z}_2, \mathbf{mmHg})$ , time of freeze drying  $(\mathbf{Z}_3, \mathbf{h})$ , and were determined by the experimental planning method with the quadratic orthogonal experimental matrix (k = 3, n<sub>0</sub> = 4, carrying out 18 experiments). These variables  $x_1, x_2, x_3$  were coded variables of  $Z_1, Z_2, Z_3$ . The value of the star point  $\alpha = 1.414$ .

The experimental parameters investigated by establishing and solving the heat and mass transfer model in the freeze drying [2,3] to reach the suitable residual water content of the finished product were summarized in Table 1.

The values of the objective functions  $y_1$ ,  $y_2$ ,  $y_3$ ,  $y_4$ ,  $y_5$  were shown

in Table 2 by carrying out the experiments with these parameters in Table 1.

The regression equations below were obtained after processing the experimental data, calculating the coefficients, testing the significance of the coefficients by the Student test, and testing the regression equations for the fitness of the experimental results by Fisher test.

$$y_1 = f_1(x_1, x_2, x_3) = 75.758 + 1.883x_1 + 10.167x_3 - 2.491x_2^2 + 2.487x_3^2$$
 (25)

$$y_2 = f_2(x_1, x_2, x_3) = 4.17 - 0.39x_1 - 0.614x_3^{\circ}$$
(26)

$$-0.226x_1x_3+0.27.x_1^2+0.245x_2^2+0.142x_3^2$$

 $y_3 = f_3(x_1, x_2, x_3) = 7.578 + 2.069x_1 + 0.575x_2 + 1.187x_3 + 0.851x_1^2 + 1.205x_3^2$ (27)

$$y_4 = f_4(x_1, x_2, x_3) = 8.307 + 1.45x_1 + 0.789x_2 + 0.76x_3 -0.484x_2x_3 + 0.429x_1^2 + 0.607x_2^2$$
(28)

$$y_5 = f_5(x_1, x_2, x_3) = 2.363 + 0.393x_1 + 0.375x_2 + 0.205x_3 - 0.178x_3^2$$
(29)

#### Solving the one-objective optimization problems

These one-objective optimization problems were found to achieve:  $y_{1\min} = \min f_1(x_1, x_2, x_3); y_{2\min} = \min f_2(x_1, x_2, x_3); y_{3\min} = \min f_3(x_1, x_2, x_3); y_{4\min} = \min f_4(x_1, x_2, x_3); y_{5\min} = \min f_5(x_1, x_2, x_3),$  with the identified domain  $\Omega_x = \{-1.414 \le x_1, x_2, x_3 \le 1.414\}$ . By using the Excel – Solver software, the results of the optimal parameters of every objective function (25), (26), (27), (28) and (29) limited in the experimental domain were summarized in Table 3, [4,11,12]:

According to the Table 3, the utopian points were indentified:  $f^{UT} = (f_{1\min}, f_{2\min}, f_{3\min}, f_{4\min}, f_{5\min}) = (58.71, 3.119, 5.215, 5.163, 0.7497).$ However, the utopian plan did not exist, because of  $x^{iopt} = (x_1^{iopt}, x_2^{iopt}, x_3^{iopt}) \neq x^{kopt} = (x_1^{kopt}, x_2^{kopt}, x_3^{kopt})$  with j, k = 1 ÷ 5, j ≠ k.

## Solving the multi-objective optimization problem by the restricted area method

The purpose of the experiment was to reach the targets of the freeze drying process which were expressed by 5 regression equations (25), (26), (27), (28) and (29), but the tests satisfying all function values ( $y_{1min}$ ,  $y_{2min}$ ,  $y_{3min}$ ,  $y_{4min}$ ,  $y_{5min}$ ) could not be found. Hence, the idea of the multi-objective optimization problem was to find the optimal Paréto test for yPR = ( $y_1$ PS,  $y_2$ PR,  $y_3$ PR,  $y_4$ PR,  $y_5$ PR) closest to the utopian point and the furthest from the restricted area, but  $y_j = y_j(x) = f_j(x_1, x_2, x_3)$  must satisfy technological conditions with the initial requirements, [4,11,12]:

$$y_1 < C_1 = 86.21; 2 = a < y_2 < b = 6; y_3 < C_3 = 11.56;$$
  
 $y_4 < C_4 = 10.91; y_c < C_5 = 2.98$  (30)

Setting the new objective functions as the followings:

$$I_1(x) = y_1(x)$$
 with  $I_1(x) < C_1 = 86.21$  (31a)

$$I_2(x) = [y_2(x) - (a + b)/2]^2 = [y_2(x) - 4]^2$$
 with  $I_2(x) < C_2 = [(b - a)/2]^2 = 4$  (31b)

- $I_3(x) = y_3(x)$  with  $I_3(x) < C_3 = 11.56$  (31c)
- $I_4(x) = y_4(x)$  with  $I_4(x) < C_4 = 10.91$  (31d)

$$I_5(x) = y_5(x)$$
 with  $I_5(x) < C_5 = 2.98$  (31e)

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Parameters	-α (-1.414)	Low (-1)	Central (0)	High (+1)	+α (1.414)	Deviation ∆Z <sub>i</sub>
Z <sub>1</sub> [ºC]	20.102	23	30	37	39.898	7
Z <sub>2</sub> [mmHg]	0.008	0.094	0.3	0.507	0.592	0.2065
Z <sub>3</sub> [h]	11.172	12	14	16	16.828	2

Table 1: Parameter level design.

	N	X <sub>0</sub>	X <sub>1</sub>	X <sub>2</sub>	X <sub>3</sub>	X <sub>1</sub> X <sub>2</sub>	$X_1 X_3$	$X_2 X_3$	X <sub>1</sub> <sup>2</sup> -2/3	X <sub>2</sub> <sup>2</sup> -2/3	X <sub>3</sub> <sup>2</sup> -2/3	У <sub>1</sub>	Y <sub>2</sub>	Y <sub>3</sub>	Y <sub>4</sub>	Y <sub>5</sub>
2 <sup>k</sup>	1	1	1	1	1	1	1	1	0.333	0.333	0.333	80.42	3.72	12.45	10.91	3.253
	2	1	-1	1	1	-1	-1	1	0.333	0.333	0.333	83.51	4.81	10.01	8.978	2.554
	3	1	1	-1	1	-1	1	-1	0.333	0.333	0.333	89.71	3.51	11.71	10.92	2.161
	4	1	-1	-1	1	1	-1	-1	0.333	0.333	0.333	84.34	5.04	7.73	8.525	1.192
	5	1	1	1	-1	1	-1	-1	0.333	0.333	0.333	66.52	5.36	10.94	10.31	2.581
	6	1	-1	1	-1	-1	1	-1	0.333	0.333	0.333	65.78	5.69	7.78	8.671	2.247
	7	1	1	-1	-1	-1	-1	1	0.333	0.333	0.333	65.89	5.39	10.09	8.478	1.628
	8	1	-1	-1	-1	1	1	1	0.333	0.333	0.333	64.82	5.87	5.97	6.19	1.287
2k	9	1	1.414	0	0	0	0	0	1.333	-0.667	-0.667	81.24	4.08	13.32	12.85	3.388
	10	1	-1.41	0	0	0	0	0	1.333	-0.667	-0.667	68.15	4.96	5.45	6.379	1.707
	11	1	0	1.414	0	0	0	0	-0.667	1.333	-0.667	70.62	4.93	8.61	11.63	2.748
	12	1	0	-1.41	0	0	0	0	-0.667	1.333	-0.667	73.73	4.01	7.75	8.307	2.653
	13	1	0	0	1.41	0	0	0	-0.667	-0.667	1.333	98.71	3.51	12.61	10.13	2.521
	14	1	0	0	-1.41	0	0	0	-0.667	-0.667	1.333	65.45	5.02	7.57	7.697	1.787
n <sub>o</sub> -	15	1	0	0	0	0	0	0	-0.667	-0.667	-0.667	77.31	4.41	7.08	7.858	2.281
	16	1	0	0	0	0	0	0	-0.667	-0.667	-0.667	75.52	4.21	7.12	8.018	2.263
	17	1	0	0	0	0	0	0	-0.667	-0.667	-0.667	78.24	4.29	7.16	8.449	2.127
	18	1	0	0	0	0	0	0	-0.667	-0.667	-0.667	73.63	4.13	7.74	7.659	2.011

**Table 2:** The orthogonal experimental matrix level 2, k = 3,  $n_0 = 4$ .

Drying material	j	y <sub>imin</sub>	X <sub>1</sub> j opt	X <sub>2</sub> <sup>j opt</sup>	X <sub>3</sub> <sup>j opt</sup>
	1	58.71	-1.414	1.414	-1.414
	2	3.119	1.314	-6.11E-08	1.414
Penaeus monodon	3	5.215	-1.216	-1.414	-0.4925
	4	5.163	-1.394	-1.2137	-1.405
	5	0.7497	-1.241	-1.414	-1.341

Table 3: Minimum tests of each one-objective optimization problem.

 $\forall \mathbf{x} = (\mathbf{x}_1, \mathbf{x}_2, \mathbf{x}_3) \in \Omega_{\mathbf{X}} \tag{31f}$ 

From the system of equations (31a), (31b), (31c), (31d), (31e), (31f) and table 3, it can be easily found:

$$\begin{split} I_{1\min} &= y_{1\min} = 58.71; \\ I_{2\min} &= 0.00; \\ I_{3\min} &= y_{3\min} = 5.215; \\ I_{4\min} &= y_{4\min} = 5.163; \\ I_{5\min} &= y_{5\min} = 0.7497; \end{split}$$

Establishing the R\*-objective combination function  $R^*(I_1, I_2, I_3, I_4, I_5) = R^*(y_1, y_2, y_3, y_4, y_5) = R^*(x_1, x_2, x_3) = R^*(x)$  as the followings [4,11, 12]:

$$\begin{cases} R^{*}(\mathbf{x}) = R^{*}(\mathbf{x}_{1}, \mathbf{x}_{2}, \mathbf{x}_{3}) = \sqrt[5]{\prod_{j=1}^{5} r_{j}(\mathbf{x}_{1}, \mathbf{x}_{2}, \mathbf{x}_{3})} = \sqrt[5]{\prod_{j=1}^{5} r_{j}(\mathbf{x})} \\ \Omega_{\mathbf{x}} = \{-1, 414 \le \mathbf{x}_{1}, \mathbf{x}_{2}, \mathbf{x}_{3} \le 1, 414\}; \mathbf{x} = (\mathbf{x}_{1}, \mathbf{x}_{2}, \mathbf{x}_{3}) \end{cases}$$
(32)

With: 
$$r_j(x) = \left(\frac{C_j - I_j(x)}{C_j - I_{j\min}}\right)$$
 when  $I_j(x) < C_j$  (33)

$$r_j(x) = 0$$
 when  $I_j(x) \ge C_j$  (34)

The five-objective optimization problem needed to indentify  $xR = (x_1R, x_2R, x_3R) \in \Omega_x$  in order that  $R^*(x_1R, x_2R, x_3R) = Max\{R^*(x_1, x_2, x_3)\}$ . The maximum value of (32) was determined by using the Excel – Solver sofware:

$$R^{*}(x)_{max} = Max\{R^{*}(x_{1}, x_{2}, x_{3})\} = R^{*}(x_{1}R, x_{2}R, x_{3}R) = 0.876$$

With:  $x_1 R = 0.5659$ ;  $x_2 R = -1.414$ ;  $x_3 R = -0.3936$ ; Then, transforming into real variables:

 $Z_1^{opt} = 33.96^{\circ}C; Z_2^{opt} = 0.008 \text{mmHg}; Z_3^{opt} = 13.21 \text{h}$ 

Substituting  $x_1R$ ,  $x_2R$ ,  $x_3R$  into these equations (31a), (31b), (31c), (31d), (31e) and (31f), the results were obtained as:

$$I_1PR = 68.226;$$
  
 $I_2PR = 0,7056;$   
 $I_3PR = 7.928;$ 

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#### $I_4 PR = 8.795;$

 $I_{5}PR = 1.9$ 

Substituting  $x_1R$ ,  $x_2R$ ,  $x_3R$  into these equations (25), (26), (27), (28) and (29), the results were obtained as:

 $y_1 PR = 68.226;$ 

 $y_2 PR = 4.84;$ 

 $y_{3}PR = 7.928;$ 

- y,PR = 8.795;
- $y_5 PR = 1.947$

The rehydration capacity of the product was determined as:

 $IR = 100 - y_3 PR = 92.072$ 

where:  $xR = (x_1R, x_2R, x_3R)$  called optimal Paréto test;  $yPR = (y_1PR, y_2PR, y_3PR, y_4PR, y_5PR)$  called the optimal Paréto effect.

As a result, through the calculation from the experimental models (25), (26), (27), (28) and (29), the parameters of the freeze drying process which satisfied the maximum R\*-Optimal combination criterion were determined as: temperature of freeze drying chamber was  $Z_1^{opt} = 33.96^{\circ}$ C, pressure of freeze drying chamber was  $Z_2^{opt} = 0.008$  mmHg, time of freeze drying was  $Z_3^{opt} = 13.21$ h. The total energy consumption per weight of the product was  $y_1$ PR = 68.22 kWh/kg; the residual water content of the product was  $y_2$ PR = 4.84% (acceptable with the initial requirements of  $2 \div 6$ %); the rehydration capacity of the product was  $y_4$ PR = 8.79% and the loss of vitamin C of the product was  $y_5$ PR = 1.94%. Compared with the experimental results from the table 2, these results above were suitable and satisfying with the objectives of the problem.

# Experiment to test the results of multi-objective optimization problem

Carrying out the freeze drying process of *Penaeus monodon* at the optimal Paréto test: temperature of freeze drying chamber of  $Z_2^{opt}$  = 33.96°C, pressure of freeze drying chamber of  $Z_2^{opt}$  = 0.008mmHg, and time of freeze drying  $Z_3^{opt}$  = 13.21 hours, the experimental results were determined as: the energy consumption per product weight of  $y_1$  = 68.77 kWh/kg, the residual water content of  $y_2$  = 4.76%, the rehydration capacity of IR = 100 -  $y_3$  = 92.17% (the anti-rehydration capacity of  $y_3$  = 7.82%), the volume contraction of  $y_4$  = 8.82% and the loss of vitamin C of  $y_5$  = 1.91%.

Consequently, it was very noticeable that the results from the optimization problems of the freeze drying process had the fitness for the experimental results.

When the pressure of freeze drying chamber was fixed:  $x_2 = -1.414$ , respectively  $Z_2 = 0.008$  mmHg, the relationship between  $y_1$ ,  $y_2$ ,  $y_3$ ,  $y_4$ ,  $y_5$  and S combination function with 2 variables  $x_1$ ,  $x_3$  was performed geometrically in 3D (Figures 4, 5, 6, 7, 8, 9). When  $x_3$  was fixed with constant values, the variation of  $x_1$  was shown in Figures 10, 11, 12, 13, 14, 15.

#### Establishing the freeze drying mode

By the optimal Paréto test: the temperature, pressure of freeze drying chamber and the total drying time of 2 stages (2 and 3) respectively  $Z_1^{opt} = T_f = 33.96^{\circ}C$ ,  $Z_2^{opt} = P_m = 0.008$ mmHg and  $Z_3^{opt} = 13.21$ h, and by the temperature of the freezing chamber  $T_e = -45^{\circ}C$ ,











the crystallization temperature of the water in *Penaeus monodon*  $T_{ka} = -1.21^{\circ}C$  [1], and the thermo-physical parameters of *Penaeus monodon* [1,13,14], the heat transfer model of the freezing process [2] and the heat and mass transfer model of the freeze drying process [3,13,14] were solved to determine the optimal freezing temperature, the time

of stage 1 ( $\tau_1$ , **h**), the time of sublimation drying at stage 2 ( $\tau_2$ , **h**), and the time of vacuum drying at stage 3 ( $\tau_3$ , **h**). The results were shown in Figure 17.

**Stage 1**: The frozen material was carried out at the optimal technological mode [2,3,13] (water completely frozen in the material) with the temperature of the freezing chamber of  $T_e = -45$ °C, the surface material temperature of  $T_s = -34$ °C, the central material temerature of  $T_c = -11.78$ °C and the average material temperature of  $T_m = -25.11$ °C, the frozen time of  $\tau_1 = 2.5$ h.





Stage 2: The sublimation drying was carried out with the temperature of freeze drying chamber of  $Z_1^{opt} = T_f = 33.96^{\circ}C$ , the pressure of freeze drying chamber of  $Z_2^{opt} = P_m = 0.008$  mmHg, the sublimation temperature of the water frozen in the material of  $T_m = -25.11^{\circ}C$ , the central material temperature of  $T_c \leq -1.21^{\circ}C$ , and the drying time of  $\tau_2 = 11.46h$ , [2,3,13].

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**Stage 3**: The vacuum drying was carried out with the temperature of vacuum drying chamber of  $Z_1^{opt} = T_f = 33.96^{\circ}C$ , the pressure of vacuum drying chamber of  $Z_2^{opt} = P_m = 0.008$  mmHg, the central material temperature of  $T_c > -1.21^{\circ}C$ , and the drying time of  $\tau_3 = 1.75$ h. The residual water content of the finished product was  $W = y_2 PR = 4.84\%$ , [2,3,13].

Thus, the total drying time of 2 stage was  $Z_3^{opt} = \tau_2 + \tau_3 = 13.21h$ , the total time of 3 stage was  $\tau = \tau_1 + \tau_2 + \tau_3 = 2.5 + 11.46 + 1.75 = 15.71h$ 

The quality of the finished product was displayed in Figure 16 when all the parameters of the freeze drying process were applied as the above. The energy consumption per weight was the same as the determined in priority.

#### Conclusion

The results showed that the restricted area method with  $\mathbb{R}^{*}(Z)$  optimal combination criterion solving the five-objective optimization problem ( $\mathbf{y}_{1}, \mathbf{y}_{2}, \mathbf{y}_{3}, \mathbf{y}_{4}, \mathbf{y}_{5}$ ) determined three optimal technological parameters:  $\mathbf{Z}_{1}^{\text{opt}}$  - temperature of freeze drying chamber,  $\mathbf{Z}_{2}^{\text{opt}}$  - pressure of freeze drying chamber,  $\mathbf{Z}_{3}^{\text{opt}}$  - time of freeze drying, which were entirely consistent with the experiments, [4,12].

The results also demonstrated that optimal Paréto test  $ZR = (Z_1^{opt})$ 

= 33.96°C;  $Z_2^{opt}$  = 0.008mmHg;  $Z_3^{opt}$  = 13.21h) for optimal Paréto effect yPR = ( $y_1PR$  = 68.226;  $y_2PR$  = 4.84;  $y_3PR$  = 7.928;  $y_4PR$  = 8.795;  $y_5PR$  = 1.947) was the closest to the utopian point but the furthest from the restricted area.

The freeze drying process was researched systematically, combining mathematical method and experimental design.

The regression equations (25), (26), (27), (28) and (29) obtained from the experiments were the experimental statistical models which could well describe the impact of the freeze drying chamber temperature, the freeze drying chamber pressure and the freeze drying time on the energy consumption, the residual water content, the rehydration capacity, the volume contraction and the loss of vitamin C of the finished product.

The freeze drying mode was determined by the restricted area method in order to minimize the energy consumption per product weight and to maximize the quality of the finished product.

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