



MATHEMATICAL MODELING AND OPTIMIZATION OF LOW-TEMPERATURE VACUUM DRYING FOR BANANA

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ABSTRACT

Bananas are one of the most common energy yielding fruits, and also a nutritional source for human health. In this study, low-temperature vacuum drying was applied to preserve banana because this method offers a low nutrient loss, a decrease in drying time leading to low energy cost, and the low moisture content preventing products from microbial spoilage. Four mathematical models were built, and a multi-objective optimization problem was established for the drying process. The restricted area method with $R^*(Z)$ optimal combination criterion was used to optimize for the drying mode of banana including temperature of 52.76 °C, pressure of 0.006 mmHg and drying time of 13.94 hours. Experimental results showed that the energy consumption was 3.96 kWh/kg, the residual water content was 3.64 %, the vitamin C loss was 3.27 % and the maximum rehydration capacity was 95.17 %, which convinced that dried bananas had achieved a minimum cost, the best quality, and a long-term storage.

1. Introduction

Bananas (*Musa* spp., Musaceae) are one of the highly appreciated fruits over the world. Banana plants are usually found in tropical and subtropical regions because of their fast-growing ability and good suitability with various types of fertilizer (Qamar et al., 2018). There are more than 300 banana varieties with planting area of approximately 5.2 million hectares (Qamar et al., 2018), (FAOSTAT, 2019). Most of varieties is widely distributed in Indo-Malaysian, Asian, Caribbean, Latin American, African and Australia. As regards to the banana production yield, there were nearly 117 million tons of banana produced in 2019 (FAOSTAT, 2019). Ecuador, Costa Rica, and Philippines are countries that achieved the highest banana production and export yield whereas America, Belgium and Russia were the biggest banana importers 2017 (FAO, 2020).

Bananas are rich in biologically active compounds such as phenolics, vitamin C,

minerals, biogenic amines and phytosterols that beneficial for human health as well as effective in protecting the body against numerous oxidative stresses (Voora et al., 2020; Singh et al., 2016). Moreover, vitamin C is one of the most important substances against free radicals in human body. It also contributes to the growth of tissues, health of bones and teeth, the recovery of the wounds, the regeneration of collagen, the activation of hormones, the hydroxylation of proline and nitrosamine formation (Ranjha et al., 2020). Reducing the reactions relating to severe allergies, preventing human from being infected and positive moderating for the immune system are some of the advantages that vitamin C can also provide (Iqbal et al., 2004). 100 g fresh pulp of banana provides about 68 g of water, 121.8 g of carbohydrate, 30-60 mg of phenolic compounds, 1.1 g of protein, 11.7 mg of vitamin C, 1.0 mg of sodium, 8.0 mg of calcium, 385.0 mg of potassium and other components (Qamar et al.,

2018). This nutrition fact could explain why the consumption of bananas gradually increases in several potential markets such as Europe and North America (WTO and International Trade Center, 2019).

However, bananas are prone to be perishable due to their high moisture content (Simal et al., 1997). There are about 1.6 million of bananas being spoiled and thrown away every day in developing countries. For instance, although the number of fresh bananas in Vietnam increased dramatically (approximately 1.4-1.9 million tons), banana exported yield only accounted for a minority in 2019 (FAO, 2020; (WTO and International Trade Center, 2019). Consequently, finding the best way to preserve this highly appreciated fruit as well as diversifying products made from banana are necessary.

There have been some methods for the long-term preservation and production of bananas including freezing, frying, and drying. Although freezing has been successfully employed to preserve food, the formation of ice crystals during freezing process could cause damage to the microstructure of food materials, leading to a decline in the preference of customers (Dzung N.T., 2016). Furthermore, the low temperature ranges used in freezing will cause a significant rise in energy cost (Dzung N.T., 2016). Another method applied for banana production is frying. This technique is beneficial since it forms the attractive appearance, adds flavor, and creates crispy texture for products. However, substantial odor enhancement via autoxidation, decomposition and fat hydrolysis may cause quality deterioration in fried products (Perkins E. I., 2007). A considerable increase of nutrition loss could occur inside products during frying (Mihaela et al., 2010).

On the other hand, drying is a popular method which has been applied for preserving fruits and vegetables since ancient times. Trends of drying are either to find an appropriate preservative technique for prolonging food shelf life or create ready-to-eat products retaining beneficial values for human health. In accordance with this advantage, drying is also a prevalent technique to preserve the original

characteristics of bananas from structure, color, flavor to nutrition as well as increase the current level of acceptance of dried foods in the market (An H., et al., 2010). Utilizing high temperature over 70°C for water removal from foods will shorten the processing time and reduce moisture content for long storage. However, high temperature in drying could lead to some inherent disadvantages. The shrinkage on the surface of samples dried by conventional techniques was reported to be extremely high (Krokida et al., 1997). A greater shrinkage will result in a poor rehydration ratio and an unacceptable structure (Junlakan, 2014). Besides, the oxygen presence must be controlled in an extremely low range to have positive effects during drying and storage (Junlakan, 2014). If the oxygen level is high, the quality indicator of dried products as vitamin C will be degraded and rehydration capacity will be low. Therefore, low-temperature vacuum drying will offer a great potential for dehydration process. This method is recommended to create qualified dried products including fine structure (porosity and crispy), high nutritional properties (vitamin C retention) and good rehydration capacity. Furthermore, this new approach efficiently saves half of the energy cost as compared to sublimation drying (Bazyma and Kutovoy, 2005).

However, the application of low-temperature vacuum drying to create high-qualified dried banana chips have been untapped effectively. This matter occurs due to lack of equipment and experimental conditions to optimize the low-temperature vacuum drying process.

Therefore, the aim of this paper is modeling low-temperature vacuum drying process for banana by experimental designs. A multi-objective optimization problem describing for low-temperature vacuum drying is also established. The restricted area method with $R^*(Z)$ optimal combination criterion is utilized to solve the problem and ascertain the Pareto tests. In other words, solving this multi-objective optimization problem is a way to optimize the low-temperature vacuum drying and figure out the optimal drying conditions for

banana chips production. It is hypothesized that banana chips dried at these optimal parameters would meet all the quality standards such as minimal energy consumption, high nutritional values and low moisture content that could meet export requirements.

2. Materials and methods

2.1. Materials



Figure 1. Fresh banana slices.

Fresh banana used for experiments was Pisang Awak variety (*Musa acuminata* x *Musa balbisiana*), collected from Southwestern area of Vietnam. This was chosen because of its superb quality, popularity, and high yields in Vietnam. The amount of carbohydrate in bananas has changed constantly upon ripening due to the transformation from starch to sugar by enzymatic breakdown mechanism (Hettiaratchi et al., 2011; Mohapatra et al., 2010). Limiting the changes of chemical compositions and controlling the homogeneity of fresh bananas play a vital role associated with choosing the appropriate material (Monteiro et al., 2015; Tribuzi and Laurindo, 2014; Zotarelli et al., 2012). Thus, bananas were initially examined the ripeness before being washed, peeled, sliced to 5 mm thickness, and uniformly arranged on a tray (Figure 1).

The thickness of 05 mm was chosen because thinner slices could be shrinkable and brittle after drying, whereas thicker slices would obstruct the migration of water from inside of material. This hindrance might lead to longer drying time and higher energy consumption.

2.2. Methods

2.2.1. Drying equipment

Dehydration process was conducted by using the low-temperature vacuum dryer

prototype DSV-03, fabricated and assembled by Professor Nguyen Tan Dzung and his colleagues in 2018 (Duong T., et al., 2018). This machine is automatically controlled by coding and IoT and is placed at laboratory of Faculty of Chemical and Food Technology, Ho Chi Minh City University of Technology and Education, Vietnam (Figure 2).



Figure 2. The low-temperature vacuum drying system DSV – 03.

2.2.2. Determination of the chemical compositions in fresh banana

The following methods were used to determine some chemical compositions of Pisang Awak. Protein was measured by Kjeldahl method in FAO, Food & Nutrition, 14/7, 1986. Carbohydrate and lipid were estimated by the standard of Ref. EC 152-2009 and Ref. EC 996-06, in turn. Vitamin C was calculated by direct titration with iodine (Suntornsuk et al., 2002). For determination of the banana ripeness, refractometric method was applied corresponding to standard of TCVN 7771:2007.

2.2.3. Determination of the technological factors

Factors affecting the low-temperature vacuum drying of banana included:

- Temperature Z_1 (°C)
- Pressure Z_2 (mmHg)
- Time Z_3 (h)

Temperature and pressure were recorded by sensors located inside the drying chamber, while drying time was estimated by a timer integrated in the computer of DSV-03 system.

2.2.4. Determination of objective functions

Although dried banana chips must achieve all the quality criteria together with a long-term storage, products' energy consumption should also be abridged. Therefore, the four objective functions including energy consumption, the residual water content, loss of vitamin C and the rehydration capacity of products were considered.

- The energy consumption (y_1 , kWh/kg)

The energy consumption (y_1 , kWh/kg) for 1 kg of final product was determined by equation (1) (Dzung N.T., 2016), (Dzung N.T., 2012):

$$y_1 = \frac{P \cdot \tau}{G} \text{ (kWh/kg)} \quad (1)$$

where: G (kg) – weight of final product; (τ) – drying time; P (kW) – capacity shown on Watt meter.

- The residual water content (y_2 , %)

The residual water content of final product was calculated by equation (2) (Dzung N.T., 2016), (Dzung N.T., 2012), (Dzung et al., 2016):

$$y_2 = 100 - \frac{G_o}{G_e} (100 - W_o) \quad (2)$$

where: G_o (g) – weight of raw material; G_e (g) – weight of final product; W_o (%) – the initial moisture content of sample.

- The loss of vitamin C (y_3 , %)

The loss of vitamin C in final product was estimated by the formula (Dzung N.T., 2016):

$$y_3 = \frac{m_1 - m_2}{m_1} \cdot 100 \text{ (%) } \quad (3)$$

where: m_1 and m_2 (mg) – the vitamin C content before and after drying, respectively.

- The rehydration capacity (y_4 , %)

Determining the rehydration capacity of final product was determined by the below expression (Dzung N.T., 2016):

$$y_4 = \frac{G_1 - G_e}{G_o - G_e} 100 \text{ (%) } \quad (4)$$

where: G_o (g) – weight of fresh banana slices used for the experiment; G_1 (g) – weight of dried slices which were soaked into the water at 25 °C until the constant mass (*the saturation of water content*); G_e (g) – weight of banana slices before soaking (g).

2.2.5. Determination of microorganisms, mycotoxins, and heavy metals contents in dried products

The microbiological infection, the mycotoxins and heavy metal contents of dried products were measured by the following methods presented in Table 1, Table 2, and Table 3.

Table 1. Methods for the determination of microorganisms in dried bananas

No.	Parameter	Unit	Method
1	Total aerobic plate count	cfu/g	TCVN 4884-1:2015
2	<i>Coliforms</i>	cfu/g	TCVN 6848:2007
3	<i>Escherichia coli</i>	MPN/g	TCVN 6846:2007
4	<i>Staphylococcus aureus</i>	cfu/g	TCVN 4830-1:2005
5	<i>Clostridium perfringens</i>	cfu/g	TCVN 4991:2005
6	<i>Bacillus cereus</i>	cfu/g	TCVN 4992:2005
7	Total spores of yeast and mold	cfu/g	TCVN 8275-2:2010
8	<i>Salmonella</i>	per 25g	ISO 6579 – 1:2017

Table 2. Method for the determination of mycotoxins content in dried bananas

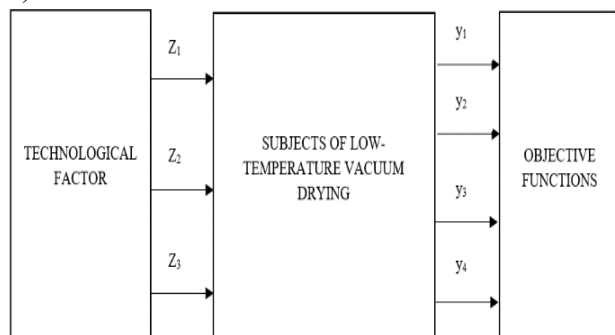
No.	Parameter	Unit	Method
1	Aflatoxin B ₁	µg/kg	Ref. EN 15662-2018
2	Aflatoxin B ₁ B ₂ G ₁ G ₂	µg/kg	Ref. EN 15662-2018

Table 3. Methods for the determination of heavy metals content in dried bananas

No.	Parameters	Unit	Method
1	Lead (Pb)	mg/kg	Ref AOAC 2015.01
2	Cadmium (Cd)	mg/kg	Ref AOAC 2015.01

2.2.6. Experimental planning method

It is proposed that there was a simultaneous impact on the objective functions y_1, y_2, y_3, y_4 from the technological factors Z_1, Z_2, Z_3 (Figure 3).

**Figure 3.** Diagram describing a relationship between the technological factors and the objective functions (Dzung et al., 2017)

An optimal experimental design was established to build a mathematical model assuring the accuracy, cost-saving, and a short experimental time. It was the quadratic orthogonal experimental plan, which k is the variables describing for the technological factors of the drying process ($k = 3$).

Assuming that x_1, x_2, x_3 were coded for variables Z_1, Z_2, Z_3 . Thus, an experimental mathematical model was described as follow:

$$y_j = b_o + \sum_{j=1}^k b_j x_j + \sum_{\substack{j,i=1 \\ j \neq i}}^k b_{ij} x_i x_j + \sum_{j=1}^k b_{jj} (x_j^2 - \lambda) \quad (5)$$

- Code variable was calculated by equation below:

$$x_j = \frac{Z_j - Z_j^o}{\Delta Z_j}, j = 1 \div 3 \quad (6)$$

- Number of experiments:

$$N = 2^k + 2k + n_0 = 18 \quad (7)$$

- The star point (Dzung N.T., 2020):

$$\alpha = \sqrt{\sqrt{N} \cdot 2^{k-2} - 2^{k-1}} = 1.414 \quad (8)$$

- Orthogonal matrix's criterion was:

$$\lambda = \frac{1}{N} (2^k + 2 \cdot \alpha^2) = 0.667 \quad (9)$$

2.2.7. Optimization method

- The one - objective optimization problems

Every objective function $y_j = f_j(Z)$, $j = 1 \div 4$ depended on the technological elements including Z_1 ($^{\circ}\text{C}$)- drying temperature; Z_2 (mmHg)- pressure of drying environment; Z_3 (h) - drying time. Obviously, each objective function had a relationship with technological elements to form the one-objective optimization problem.

These factors formed the vector of technological elements or the Z variable vector $Z = (Z_1, Z_2, Z_3)$. These variables varied in the identified domain Ω_Z and the function values $f_j(Z)$ formed the domain of the objective function Ω_f (Dzung et al., 2017).

Therefore, to simplify without losing the generality, it was assumed that all objective functions could reach the minimum value. The one-objective optimization problem was hence stated as follow:

Determining the root of $Z^j = \{Z_i^{j\text{opt}}\} = (Z_1^{j\text{opt}}, Z_2^{j\text{opt}}, Z_3^{j\text{opt}}) \in \Omega_Z$ in order that:

$$\begin{cases} y_{j\min} = f_j(Z_i^{j\text{opt}}) \\ = f_j(Z_1^{j\text{opt}}, Z_2^{j\text{opt}}, Z_3^{j\text{opt}}) \\ = \text{Min}\{f_j(Z_1, Z_2, Z_3)\} \\ Z_i^{j\text{opt}} = (Z_1^{j\text{opt}}, Z_2^{j\text{opt}}, Z_3^{j\text{opt}}) \in \Omega_Z \\ i = 1 \div 3; j = 1 \div 4 \end{cases} \quad (10)$$

- The multi - objective optimization problem

In fact, not only did the technological factors such as Z_1 ($^{\circ}\text{C}$), Z_2 (mmHg), Z_3 (h) influence each objective function discretely, but they also coincided with these functions $y_j = f_j(Z)$, $j = 1 \div 4$ to fulfil all the economic and technological

criteria. It was obvious that the multi-objective optimization problem had occurred in this research. Assuming the multi-objective optimization problem could be transformed into the problem to find the minimum value, the multi-objective optimization problem was stated:

Determining the root of $Z = Z^{\text{opt}} = (Z_1^{\text{opt}}, Z_2^{\text{opt}}, Z_3^{\text{opt}}) \in \Omega_Z$ so that:

$$\left\{ \begin{array}{l} y_{j \min} = f_j(Z_i^{\text{opt}}) \\ \quad = f_j(Z_1^{\text{opt}}, Z_2^{\text{opt}}, Z_3^{\text{opt}}) \\ \quad = \text{Min}\{f_j(Z_1, Z_2, Z_3)\} \\ Z_i^{\text{opt}} = (Z_1^{\text{opt}}, Z_2^{\text{opt}}, Z_3^{\text{opt}}) \in \Omega_Z \\ i = 1 \div 3; j = 1 \div 4 \end{array} \right. \quad (11)$$

Solving equation (10) to figure out the optimal root: $Z_i^{\text{jopt}} = (Z_1^{\text{jopt}}, Z_2^{\text{jopt}}, Z_3^{\text{jopt}})$ in order that: $f_{j \min} = f(Z_i^{\text{jopt}}) = \text{Min} f_j(Z)$, $\forall i = 1 \div 3$, $\forall j = 1 \div 4$ [9].

- If $Z_i^{\text{jopt}} = Z_i^{\text{kopt}} (\forall j, k = 1 \div 4; k \neq j)$, both the utopian root and the utopian optimal plan exist. In addition, the test $Z_i^{\text{jopt}} = (Z_1^{\text{jopt}}, Z_2^{\text{jopt}}, Z_3^{\text{jopt}})$ was also the root of the multi-objective optimization problem (11).

- If $Z_i^{\text{jopt}} \neq Z_i^{\text{kopt}} (\forall j, k = 1 \div 4; k \neq j)$, the utopian root does not exist whereas the utopian point $f^{\text{UT}} = (f_{1 \min}, f_{2 \min}, f_{3 \min}, f_{4 \min})$ can be normally determined. It has been reported that the multi-objective optimization problem (11) could be successfully solved by the restricted area method (Dzung et al., 2017).

Reality showed that most of the multi-objective optimization problems has its own objective functions $f_j(Z)$ subjected to the economic and technical conditions:

$$f_j(Z) < C_j; \forall j = 1 \div 4; \forall Z \in \Omega_Z \quad (12)$$

Expression (12) formed the restricted area:

$$C = \{f_j(Z) \geq C_j\} \quad (13)$$

The restricted area method suggested the $R^*(Z)$ optimal combination criterion to solve the

multi-objective objective optimization problem (11), defined as (Dzung et al., 2017):

$$\begin{aligned} R^*(Z) &= \left[\prod_{j=1}^4 r_j(Z) \right]^{1/4} \\ &= \sqrt[4]{r_1(Z).r_2(Z).r_3(Z).r_4(Z)} \quad (14) \end{aligned}$$

In which:

$$r_j(Z) = \frac{C_j - f_j(Z)}{C_j - f_{j \min}} \quad \text{when } f_j(Z) < C_j \quad (15)$$

$$r_j(Z) = 0 \quad \text{when } f_j(Z) \geq C_j \quad (16)$$

According to (15), if $f_j(Z) \rightarrow f_{j \min}$ then $r_j(Z) \rightarrow r_{j \max} = 1$. By choosing $R^*(Z)$ as the objective function, the multi-objective optimization problem was restated as:

Finding the root $Z^R = (Z_1^R, Z_2^R, Z_3^R) \in \Omega_Z$ in order that:

$$\left\{ \begin{array}{l} R_{\max}^* = R^*(Z^R) = \text{Max}\{R^*(Z)\} \\ \quad = \text{Max}\left\{\left[r_1(Z).r_2(Z).r_3(Z).r_4(Z)\right]^{1/4}\right\} \\ Z = (Z_1, Z_2, Z_3) \in \Omega_Z \end{array} \right. \quad (17)$$

The Pareto optimal root would be determined by solving (17). Hence, the Pareto effect was the optimal plan of the multi-objective optimization problem.

2.2.8. Statistical analysis

Microsoft Excel was utilized to calculate, solve, and build up the mathematical models describing for the low-temperature vacuum drying of bananas. In addition, MATLAB (2020) was also used to form the 3-D response surface plot simulating the objective functions from technological factors.

3. Results and discussions

3.1. Chemical constituents of raw material

Chemical constituents of fresh banana were summarized in Table 4.

Table 4. Chemical constituents per 100g of fresh banana pulp.

No.	Nutrient	Unit	Value
1	Moisture	%	68.1
2	Protein	%	0.87
3	Carbohydrate	%	24.90
4	Lipid	g	ND
5	Vitamin C	mg	10.50
6	Brix	%	22.9

*ND: not detected

The amount of water in fresh bananas was approximately 68.1%, which resembled to that of Hettiaratchi et al. (2011) who also found the moisture content of Pisang Awak banana was about 68.2% (Hettiaratchi et al., 2011). Moreover, Dennis (1999) reported that under 20% of the residual water content of bananas is an ideal criterion to prevent foods from being spoiled by yeast, bacteria, molds, and enzymes (Dennis, 1999).

Regarding other chemical components of fresh bananas, they made up an insignificant ratio as compared to previous works (Qamar et al., 2018; Hettiaratchi et al., 2011; Mohapatra et al., 2010; Chandler, 2015). At limit of detection (LOD) value of 0.2g/100g, results also show that the lipid content was incredibly low in pulp. Nevertheless, the Brix value in this research was much higher than the other study (12-14%) (Rex Harrill, 1998). Differences in the chemical compositions of banana pulp in this research

could be due to the differences in the degree of ripeness, the climatic conditions of cultivated areas, and the quality of fertilizers along with types of cultivar (Hettiaratchi et al., 2011).

3.2. Mathematical models describing the low-temperature vacuum drying of banana

Table 5. Parameter level design

Parameters		Z ₁ (°C)	Z ₂ (mmHg)	Z ₃ (h)
- α	-1.414	48.34	0.006	12.17
Low	-1	50	0.01	13
Central	0	54	0.02	15
High	+1	58	0.03	17
+ α	1.414	59.65	0.034	17.82
Deviation ΔZ_i		4	0.01	2

After conducting individual experiments for each technological factors Z_1 , Z_2 , Z_3 on the objective functions y_1 , y_2 , y_3 , y_4 , it could be presented that extrema domain of y_j ($j = 1 \div 4$) varied in identified domain Z_i ($i = 1 \div 3$). The results were summarized in Table 5.

According to Table 6, the low-temperature vacuum drying experiments of bananas were proceeded, followed by the quadratic orthogonal matrix with $k=3$, $n_0=4$ to find out the objective functions y_j ($j = 1 \div 4$). The results were expressed in Table 6.

Table 6. Experimental matrix determining the objective functions.

No. of experiments		Coded variables			The objective functions			
N		x ₁	x ₂	x ₃	y ₁ (kWh/kg)	y ₂ (%)	y ₃ (%)	y ₄ (%)
2 ^k	1	1	1	1	4.24	3.01	10.58	87.55
	2	-1	1	1	4.11	3.62	8.04	89.99
	3	1	-1	1	4.42	2.79	9.44	88.29
	4	-1	-1	1	4.33	3.51	7.80	92.27
	5	1	1	-1	3.46	4.11	6.88	89.06
	6	-1	1	-1	3.43	4.45	5.01	92.22
	7	1	-1	-1	3.44	4.23	6.36	89.91
	8	-1	-1	-1	3.40	4.62	4.01	93.69
2k	9	1.414	0	0	3.88	3.44	10.88	86.68
	10	-1.414	0	0	3.66	3.93	5.04	93.98
	11	0	1.414	0	3.62	3.68	4.81	91.39

	12	0	-1.414	0	4.14	2.76	4.01	92.25
	13	0	0	1.414	4.97	2.57	10.23	87.39
	14	0	0	-1.414	3.23	4.73	5.44	92.43
n _o	15	0	0	0	3.78	3.34	5.35	92.92
	16	0	0	0	3.81	3.18	5.41	92.88
	17	0	0	0	3.90	3.25	5.37	92.84
	18	0	0	0	3.81	3.17	5.79	92.26

From Table 6, the experimental data was calculated using statistical theory and Microsoft Excel 2020 software before identifying the coefficients of regression equations b_j , b_{jk} and b_{jj} . Furthermore, the fitness of the regression equations with the experimental results was tested by Fisher test after the significance of coefficients was checked by Student test. The mathematical models of low-temperature vacuum drying for banana were presented below:

- **Energy consumption:**

$$y_1 = 3.847 + 0.05x_1 - 0.09x_2 + 0.486x_3 - 0.067x_1^2 + 0.099x_3^2 \quad (18)$$

- **Residual water content:**

$$y_2 = 3.232 - 0.229x_1 + 0.112x_2 - 0.628x_3 + 0.268x_1^2 + 0.250x_3^2 \quad (19)$$

- **Vitamin C loss:**

$$y_3 = 5.505 + 1.388x_1 + 0.336x_2 + 1.698x_3 + 1.209x_1^2 - 0.575x_2^2 + 1.146x_3^2 \quad (20)$$

- **Rehydration capacity:**

$$y_4 = 92.522 - 1.974x_1 - 0.546x_2 - 1.159x_3 - 1.036x_1^2 - 1.247x_3^2 \quad (21)$$

Currently, there have been very few studies for drying banana in low-temperature vacuum environment so that none of similar mathematical models could be used to make comparison. In the other hand, mathematical models (18), (19), (20) and (21) were compatible with experimental data so ensuring that these regression equations were precise to describe for the drying process. Thus, such equations could be utilized to set up technological parameters of dehydrated banana for commerce and export.

3.3. Optimization the banana low-temperature vacuum drying process to establish the technological mode

3.3.1. Solving the one - objective optimization problems

The one-objective optimization problems were created after each object had been studied independently. These problems were found to achieve the minimum and maximum value including the energy consumption $y_{1\min} = f_1(x_1, x_2, x_3)$; moisture content $y_{2\min} = f_2(x_1, x_2, x_3)$; vitamin C loss $y_{3\min} = f_3(x_1, x_2, x_3)$ and the rehydration capacity $y_{4\max} = f_4(x_1, x_2, x_3)$ with the identified domain $\Omega_x = \{-1.414 \leq x_1, x_2, x_3 \leq 1.414\}$. Consequently, the one-objective optimization problems were stated as follow:

Determining $(x_1^{\text{opt}}, x_2^{\text{opt}}, x_3^{\text{opt}}) \in \Omega_x = \{-1.414 \leq x_1, x_2, x_3 \leq 1.414\}$, $j = 1 \div 4$ in order that:

$$\left\{ \begin{array}{l} y_{1\min} = f_1(x_1^{\text{1opt}}, x_2^{\text{1opt}}, x_3^{\text{1opt}}) \\ \quad = \text{Min}\{f_1(x_1, x_2, x_3)\} \\ y_{2\min} = f_2(x_1^{\text{2opt}}, x_2^{\text{2opt}}, x_3^{\text{2opt}}) \\ \quad = \text{Min}\{f_2(x_1, x_2, x_3)\} \\ y_{3\min} = f_3(x_1^{\text{3opt}}, x_2^{\text{3opt}}, x_3^{\text{3opt}}) \\ \quad = \text{Min}\{f_3(x_1, x_2, x_3)\} \\ y_{4\max} = f_4(x_1^{\text{4opt}}, x_2^{\text{4opt}}, x_3^{\text{4opt}}) \\ \quad = \text{Max}\{f_4(x_1, x_2, x_3)\} \end{array} \right. \quad (22)$$

Expression (22) was solved by using the Excel – Solver software. This resulted in the optimal roots of the one-objective optimization problems, summarized in Table 7.

Table 7. Optimal roots of the one-objective optimization problems

j	x_1^{jopt}	x_2^{jopt}	x_3^{jopt}	y_j^{jopt}
1	-1.414	1.414	-1.414	3.03
2	1.414	-0.492	1.414	3.00
3	-0.452	0.000	-1.309	4.87
4	-0.533	-0.441	-0.590	93.77

As can be seen from Table 7, tests of the one-objective optimization problems from (18) to (21) satisfying all function values (x_1^{jopt} , x_2^{jopt} , x_3^{jopt}) \neq (x_1^{kopt} , x_2^{kopt} , x_3^{kopt}) $\forall j, k = 1 \div 4, j \neq k$ could not be found. It was clear that cross tests of the one-objective optimization problems were inexistent. As a result, utopian roots and utopian optimal plans did not exist. Regardless of the inexistence of utopian roots, the utopian points were identified $y^{UT} = (y_{1min}, y_{2min}, y_{3min}, y_{4max}) = (3.03; 3.00; 4.87; 93.77)$.

3.3.2. Solving the multi-objective optimization problem

Because all the one-objective optimization problems had none of cross tests fulfilling y_{1min} , y_{2min} , y_{3min} , y_{4max} , the multi-objective optimization problem had to be taken into account to find the optimal Paréto test for optimal Paréto effect $y_p^R = (y_{1p}^R, y_{2p}^R, y_{3p}^R, y_{4p}^R)$ closest to the utopian point and the furthest from the restricted area. The main purpose of this paper was finding both maximum and minimum value. However, it is necessary to transform all the objective functions y_1, y_2, y_3, y_4 into one type of finding minimum value to simplify in the solution. The expressions were then rewritten as following:

$$\begin{cases} I_1(x) = y_1(x) = f_1(x_1, x_2, x_3) \\ I_2(x) = y_2(x) = f_2(x_1, x_2, x_3) \\ I_3(x) = y_3(x) = f_3(x_1, x_2, x_3) \\ I_4(x) = 1/y_4(x) = 1/f_4(x_1, x_2, x_3) \end{cases} \quad (23)$$

From (23), the multi-objective optimization problem was restated below:

Determining the optimal roots $x^{opt} = (x_1^{opt}, x_2^{opt}, x_3^{opt}) \in \Omega_x$ in order that:

$$\begin{cases} I_{jmin}(x) = \min\{f_j(x_1, x_2, x_3)\} \\ I_j(x) < C_j; \forall j = 1 \div 4 \\ -1.414 \leq x_1, x_2, x_3 \leq 1.414 \end{cases} \quad (24)$$

The objective functions y_j ($j = 1 \div 4$) must subject to the technological conditions such as: $I_1 = y_1 \leq C_1$, with $C_1 = 5$ kWh/kg; $I_2 = y_2 \leq C_2$, with $C_2 = 6$ %; $I_3 = y_3 \leq C_3$, with $C_3 = 10$ %; $y_4 \geq C'_4 = 90\%$ so $I_4 = 1/y_4 \leq C_4$, with $C_4 = 1/C'_4 = 1/90 = 0.011$ (1%), albeit y_j ($j = 1 \div 4$) were affected by the technological factors x_1, x_2, x_3 . Therefore, the restricted area was investigated:

$$C = \{I_1 > C_1 = 5; I_2 > C_2 = 6; I_3 > C_3 = 10; I_4 > C_4 = 0.011\} \quad (25)$$

The $R^*(x)$ optimal combination criterion was created by the restricted area method:

$$\begin{cases} R^*(x) = \left[\prod_{j=1}^4 r_j(x_1, x_2, x_3) \right]^{1/4} \\ \forall x = \{-1.414 \leq x_1, x_2, x_3 \leq 1.414\} \in \Omega_x \end{cases} \quad (26)$$

In which:

$$\begin{cases} r_1(x_1, x_2, x_3) = \frac{C_1 - I_1(x)}{C_1 - I_{1min}} \text{ khi } I_1 \leq C_1 = 5 \\ r_1(x_1, x_2, x_3) = 0 \text{ khi } I_1 > C_1 = 5 \end{cases}$$

$$\begin{cases} r_2(x_1, x_2, x_3) = \frac{C_2 - I_2(x)}{C_2 - I_{2min}} \text{ khi } I_2 \leq C_2 = 6 \\ r_2(x_1, x_2, x_3) = 0 \text{ khi } I_2 > C_2 = 6 \end{cases}$$

$$\begin{cases} r_3(x_1, x_2, x_3) = \frac{C_3 - I_3(x)}{C_3 - I_{3min}} \text{ khi } I_3 \leq C_3 = 10 \\ r_3(x_1, x_2, x_3) = 0 \text{ khi } I_3 > C_3 = 10 \end{cases}$$

$$\begin{cases} r_4(x_1, x_2, x_3) = \frac{C_4 - I_4(x)}{C_4 - I_{4min}} \text{ khi } I_4 \leq C_4 = 0.011 \\ r_4(x_1, x_2, x_3) = 0 \text{ khi } I_4 > C_4 = 0.011 \end{cases}$$

According to the principle of building up the $R^*(x)$ optimal combination criterion (26), the multi-objective optimization problem was rewritten as follow:

Determining the optimal Paréto roots $x^R = (x_1^R, x_2^R, x_3^R) \in \Omega_x$ in order that:

$$\begin{cases} R_{\max}^* = R^*(x^R) = R^*(x_1^R, x_2^R, x_3^R) \\ = \text{Max} \left\{ \left[\prod_{j=1}^4 r_j(x_1, x_2, x_3) \right]^{1/4} \right\} \\ \forall x = \{-1.414 \leq x_1, x_2, x_3 \leq 1.414\} \in \Omega_x \end{cases} \quad (27)$$

The maximum value $R^*(x)$ in the optimal Paréto roots (28) was calculated by using the Excel-Solver software:

$$\begin{aligned} R_{\max}^* &= \text{Max} \{R^*(x_1, x_2, x_3)\} \\ &= R^*(x_1^R, x_2^R, x_3^R) = 0.822 \end{aligned} \quad (28)$$

$$\text{Với } \begin{cases} x_1^R = -0.310 \\ x_2^R = -1.414 \\ x_3^R = -0.529 \end{cases} \quad (29)$$

Substituting these Paréto roots x_1^R, x_2^R, x_3^R into the regression equations (18), (19), (20) and (21), optimal Paréto effects were identified as the followings:

$$\begin{cases} y_1^R = 3.72 \\ y_2^R = 3.57 \\ y_3^R = 2.99 \\ y_4^R = 94.07 \end{cases} \quad (30)$$

Converting the optimal Paréto roots x_1^R, x_2^R, x_3^R (29) into the uncoded variables, the optimal technological parameters were then obtained:

$$\begin{cases} Z_1^{\text{opt}} = 52.76^\circ\text{C} \\ Z_2^{\text{opt}} = 0.006\text{mmHg} \\ Z_3^{\text{opt}} = 13.94\text{h} \end{cases} \quad (31)$$

After solving the four-objective optimization problem, the optimal roots (31) could be found as $Z_1^{\text{opt}} = 52.76^\circ\text{C}$; $Z_2^{\text{opt}} = 0.006\text{mmHg}$; $Z_3^{\text{opt}} = 13.94\text{h}$. Applying this technological mode, we acquired the value of $y_1 = y_1^R = 3.72\text{ kWh/kg}$; $y_2 = y_2^R = 3.57\%$; $y_3 = y_3^R = 2.99\%$; $y_4 = y_4^R = 94.07\%$.

3.4. Experiment to test the results of multi-objective optimization problem

Carrying out the low-temperature vacuum drying process of banana at the optimal technological parameters, results were determined as the energy consumption per product weight of $y_{1E} = 3.96\text{ kWh/kg}$, residual water content of $y_{2E} = 3.64\%$, vitamin C loss of $y_{3E} = 3.27\%$ and rehydration capacity of $y_{4E} = 95.17\%$. It was obvious that the consequences ($y_{1E}, y_{2E}, y_{3E}, y_{4E}$) were a little higher than the optimal Paréto tests but the increase was not dramatic. These findings conformed with the economic and technical standards to preserve the quality of banana, prolong shelf-life of products for commerce.

3.5. Simulation of mathematical models on a 3-D response surface plot

MATLAB software 2020 was used to simulate the objective functions y_j ($j = 1 \div 4$) from technological factors. Below are the results expressed in Figure 4, 5, 6, 7.

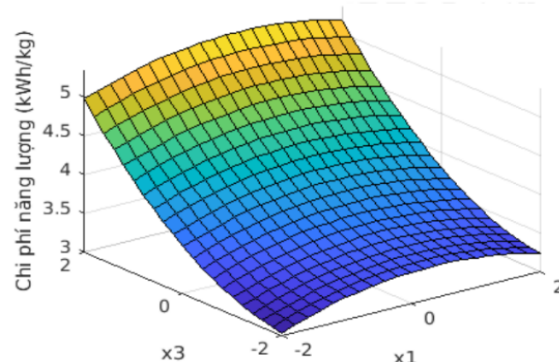


Figure 4. The energy consumption per weight product as $x_2 = -1.414$

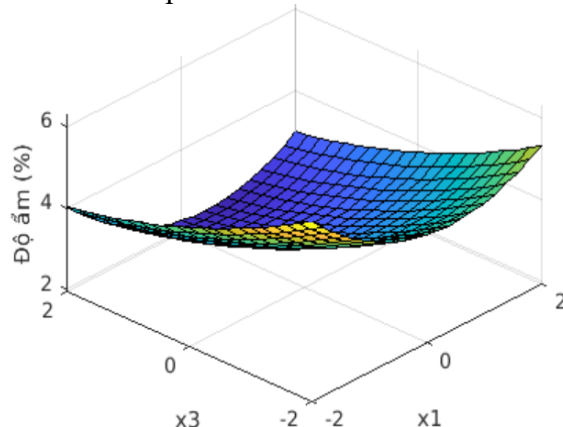


Figure 5. The residual moisture content as $x_2 = -1.414$

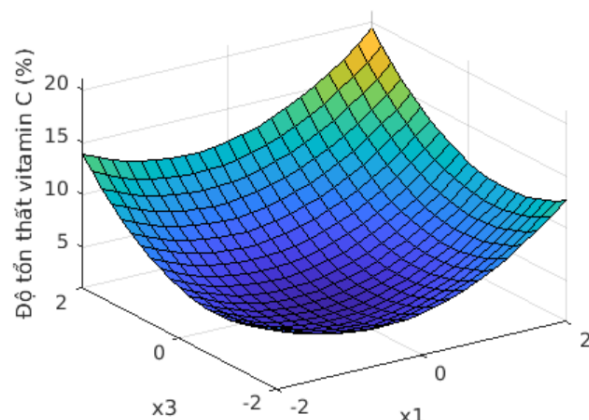


Figure 6. Vitamin C loss as $x_2 = -1.414$

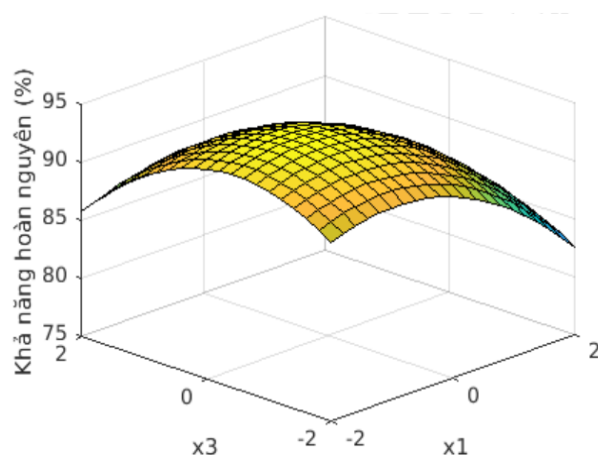


Figure 7. The rehydration capacity of products as $x_2 = -1.414$

By applying the optimal conditions for vacuum drying process (31) including $Z_1 = 52.76$ °C; $Z_2 = 0.006$ mmHg and $Z_3 = 13.94$ hours, final products reached minimum energy consumption per weight of 3.96 kWh/kg, made it become more economical as well as enhanced the probability for trade and export.

As regards to the energy consumption, remaining moisture content of dehydrated banana was 3.64%. It is clear that less than 6% of the amount of water in foods offers a great opportunity for reducing water activity, which presents a key factor of dried product sustainability. Furthermore, food spoilage can be caused by microorganisms. Their growth depends mostly on the amount of available water. Water removal from foods positively influences on microbiological instability of dried products.

Vitamin C is easily degraded in foods, and the vitamin C degradation depends on many factors such as pH, temperature, light, enzymatic process, and oxygen. Thus, vitamin C is considered as a quality indicator for foods (Moser and Bendich, 1991). In this paper, result of vitamin C loss proved that dried banana had achieved excellent quality, and this obtained data was better than previous works where vitamin C loss was ten times higher (Drouzas and Schubert 1996), (Jaya & Das, 2003). Regarding the vacuum drying process, high deficiency of vitamin C in foods also caused by the relatively high level of pressure (over 10mmHg) and temperature ranging from 60°C to 70°C, so that most of quality attributes decreased substantially after drying (Drouzas and Schubert 1996), (Jaya & Das, 2003). Besides, Junlakan (2014) and Sagar (2010) also reported when vacuum drying pressure had exceeded 10 mmHg, residual oxygen in chamber accelerated the oxidative reactions and lead to the intensification (Junlakan, 2014; Sagar and Kumar, 2010).

The rehydration capacity of 95.17 % also met the technological requirements collating from Junlakan's research (Junlakan, 2014). The author suggested that rehydration ratio of dehydrated banana should be controlled over 90% to maintain good structure (Junlakan, 2014). Measurement of rehydration capacity could help researchers get insights about the denaturation of chemical components and nutritional characteristics of product (Junlakan, 2014). The higher the rehydration ratio is, the more porous structure obtains. Its shrinkage phenomenon is minimized, chemical compositions are less denatured as well as dried banana will maintain the qualified properties. However, if rehydration capacity is low, it means that texture of products is soft, the surface is shrinkable, the chemical constituents are denatured, and the quality of dried banana will not satisfy the requirements for trade.

Experiments also presented that drying banana at 70°C or above would cause shrinkage (Figure 8) and the rehydration capacity only reached 30%. Drying banana under 55°C at optimal drying mode (31), products had less

shrinkage, rehydration capacity was over 90% and its quality was better than conventional dried products (Figure 9).



Figure 8. Infrared-dried banana in 70°C



Figure 9. The low-temperature vacuum dried banana at optimal drying mode

3.6. Evaluating nutritional quality of products

Bananas dried at optimal technological conditions in the low-temperature vacuum environment were tested for the nutritional quality. The results were shown in Table 8.

Table 8. Chemical compositions of vacuum dried banana per 100g dry weight

No.	Components	Unit	Value
1	Moisture	%	3.64
2	Protein	%	2.48
3	Carbohydrate	%	72.12
4	Lipid	%	0.39
5	Vitamin C	mg/100g	31.84

Once comparing with data in Table 4, the low-temperature vacuum dried banana accounted for a minority of nutritional loss. This statement could be demonstrated through the protein loss of 4.5%, carbohydrate loss of 7% and vitamin C loss of 3.27%. Thus, products had superb quality satisfying for market and export.

3.7. Evaluating the microorganisms and heavy metal criteria

The low-temperature vacuum dried banana was examined the microbiological infection, the limitation of mycotoxins and heavy metals. In case all the above criteria are fulfilled, the procedure of low-temperature vacuum drying of banana will be best suited for trade and export purposes. Results declaring for limitation of microbiological infection, mycotoxins and heavy metals were presented in Table 9, 10, and 11, respectively.

Table 9. Limit of microbiological infection

Criteria	Unit	Result	Allowable limit
Total aerobic plate count	cfu/g	4,0.10 ¹	< 10 ⁴
<i>Coliforms</i>	cfu/g	ND	< 10
<i>Escherichia coli</i>	MPN/g	ND	0
<i>Staphylococcus aureus</i>	cfu/g	ND	< 20
<i>Clostridium perfringens</i>	cfu/g	ND	< 10
<i>Bacillus cereus</i>	cfu/g	ND	< 10 ³
Total spores of yeast and mold	cfu/g	ND	10 ²
<i>Salmonella</i>	per 25g	ND	ND in 25g

*ND: not detected

Table 10. Limit of mycotoxins

No.	Criteria	Unit	Result	Allowable limit
1	Aflatoxin B ₁	µg/kg	ND	2
2	Aflatoxin B ₁ B ₂ G ₁ G ₂	µg/kg	ND	4

*ND: not detected

Table 11. Limit of heavy metals

No.	Criteria	Unit	Result	Allowable limit
1	Lead (Pb)	mg/kg	ND	0,1
2	Cadmium (Cd)	mg/kg	ND	0,05

*ND: not detected

Results summarized in Table 9, 10, 11 presented that all criteria complied with the allowance limits. These limits were specified in "Guidelines for Assessing the Microbiological

Safety of Ready-to-Eat Foods Placed on the Market” edited by Health Protection Agency, London (Health Protection Agency, 2009); Codex standards (Codex, 1997; Codex, 2003); Commission Regulation (EC) No. 2073/2005 and 1881/2006 (European Commission, 2005; European Commission, 2006). Therefore, low-temperature vacuum dehydrated banana chips in this study fulfilled all the prerequisites in terms of hygiene, food safety and export.

3.8. Production of low-temperature vacuum dried banana

After the technological mode had been determined, the entire procedure for banana chip production by low – temperature vacuum drying was standardized and presented in Figure 10.

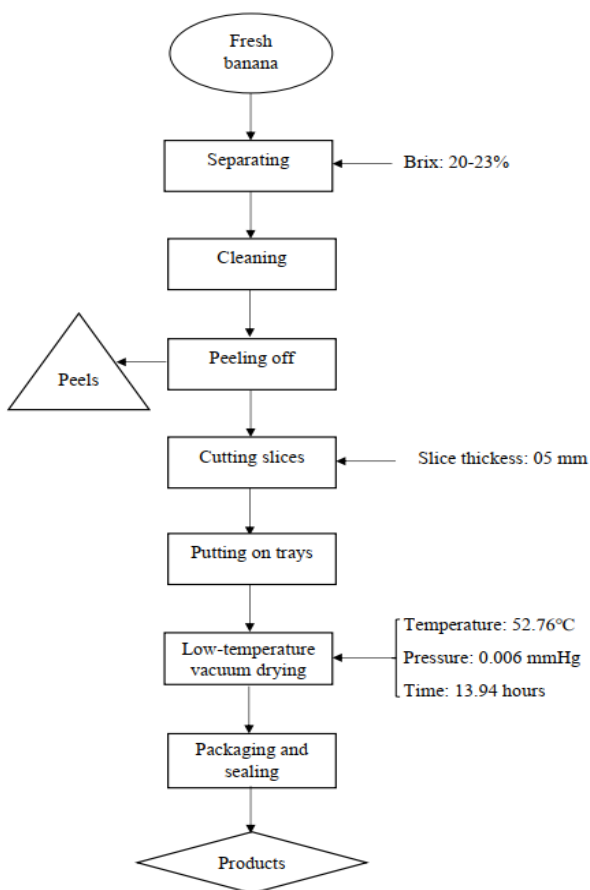


Figure 10. Flowchart of producing low-temperature vacuum dried banana

This procedure commenced when fresh banana was separated and removed the fingers spoiled by transportation. Following that, the ripeness was tested by refractometer ($\text{Brix} \approx 20 \div 23\%$) before fresh bananas were cleaned to

remove impurities on fruit skin and peeled off for chip production. Next, banana was cut into slices with 05 mm thickness and put on tray. After placing all trays in the drying chamber, closed the door tightly and started the drying process with parameters: **52.76 °C, 0.006 mmHg and 13.94 hours**. Finished products were put into PE bags and sealed (Figure 11).



Figure 11. The low-temperature vacuum dried banana at optimal technological mode

4. Conclusions

To form the mathematical models and solve it to find the technological mode for vacuum drying of bananas, this study had resolved some crucial initial targets:

- Determining chemical compositions of fresh banana to ensure that the starting material is the same and the banana quality is homogeneous before drying.
- Modeling the low-temperature vacuum drying process of banana by experimental planning method, shown by expressions (18), (19), (20) and (21). Therefore, these mathematical models can be easily used to establish the technological conditions for vacuum drying of banana slices.
- Optimizing the low-temperature vacuum drying process by building and solving the one-objective optimization problems and the multi-objective optimization problem via the restricted

area method. This resulted in the determination of optimal parameters including the temperature of drying 52.76 °C, vacuum pressure 0.006 mmHg and drying time of 13.94 hours. Final products positively obtained the energy consumption per 1 kg of final product was 3.96 kWh/kg, the residual moisture content was 3.64%, vitamin C loss was 3.27% and rehydration capacity was 95.17%. These consequences completely satisfied all the conditions regarding economy and technique of vacuum drying.

- Establishing the whole process of drying banana in low-temperature vacuum environment for trade and export (Figure 10).

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