

# Identify the status of returns to scale of the multi-period two-stage systems and efficiency decomposition

S. Esfidania, F. Hosseinzadeh Lotfi, Sh. Razavyan\*

**Received:** 12 May 2023; **Accepted:** 14 September 2023

**Abstract** In the present world, calculating the efficiency (or the performance) of systems with an internal structure, such as two-stage systems, is principally imperative during multi-time periods. In the present approach, the traditional two-stage Data Envelopment Analysis (DEA) model is developed to a multi-period two-stage DEA model, which evaluates the overall and periods of efficiencies synchronously. This approach which is used, is not only alone incapable of having functional capacities under the assumption of variable returns to scale (VRS), but is also inattentive to the importance or magnitude of data in different periods. In this study, in order to surmount these shortcomings, we expand the existing approaches and introduce a generalized model to measure the overall efficiency of a multi-period two-stage system under the VRS assumption, wherein, the importance of data in time-periods is considered in a diverse manner. According to this generalized model, theorems are also being presented to determine the type of returns to scale (RTS) of both stages, as well as the system of the entire time periods and also each period. Finally, the real data of Taiwanese non-life insurance companies, which has been extracted from the extant literature, is used to illustrate the proposed approach.

**Keyword:** Data Envelopment Analysis (DEA), Two Stage System, Multi-Period, Multi-Stage System, Returns to Scale.

## 1 Introduction

Data Envelopment Analysis (DEA) is a mathematical programming for evaluating the relative efficiency of decision making units (DMUs), which has been introduced by Charnes, Cooper, and Rhodes [1]. Recently, in real life problems, there are some systems that have a two-stage structure. The traditional DEA measures the efficiency of this system regardless of its internal structure. Thereby, this is one of the disadvantages of the traditional DEA model. In order to compute the performance of such systems, some authors applied two-stage DEA methods. DMUs with a two-stage structure are used in many of the recent studies in the field of DEA. Seiford and Zhu [2] introduced a model for evaluating the two-stage system that evaluates the

\* Corresponding Author. (✉)  
E-mail: [sh\\_razavyan@azad.ac.ir](mailto:sh_razavyan@azad.ac.ir)

**S. Esfidania**  
Department of Mathematics, South Tehran Branch, Islamic Azad University, Tehran, Iran

**F. Hosseinzadeh Lotfi**  
Department of Mathematics, Science and Research Branch, Islamic Azad University, Tehran, Iran

**Sh. Razavyan**  
Department of Mathematics, South Tehran Branch, Islamic Azad University, Tehran, Iran

overall efficiency of the system and performance of stages independently. In that, in this model, in general, the efficiency of the system may be proficient, whilst every stage is not. So, Kao and Hwang [3], proposed a model by considering the correlations of stages. This model measures the efficiencies of a two-stage system and the overall efficiency, which is the product of the efficiencies of stages. Thus, the system is efficient if and only if both the stages are efficient. In the inefficient stage, in order to achieve an efficient system, it is necessary to reduce the inputs or increase the outputs, or even modify the intermediate products. The Kao and Hwang model cannot calculate the efficiency of the systems under the VRS assumption. Hence, Chen *et al.* [4] presented the models to measure the constant returns to scale (CRS) and VRS efficiencies of two-stage systems. In their models, the overall efficiency of the system is expressed as a weighted average of the efficiencies of stages. Next, Wang and Chin [5] proposed a model to overcome the weakness of the Kao and Hwang model and calculate the VRS efficiency of two-stage systems. They also demonstrated that the efficiency obtained from the Chen *et al.* model is greater than that of the efficiency attained from the Kao and Hwang model.

Wu *et al.* [6] used an additive DEA approach to evaluate the efficiency of the new two-stage network structures with undesirable intermediate outputs. Fei *et al.* [7] also proposed some DEA models to measure the efficiencies of the two-stage process and its sub-processes, in the presence of undesirable outputs. Chu *et al.* [8] proposed a two-stage DEA model to obtain the eco-efficiency of the entire two-stage system in terms of the eco-efficiency analysis of the Chinese provincial-level regions. Despotis *et al.* [9] reviewed the additive and multiplicative efficiency decomposition methods and introduced a method to measure the unique and unbiased efficiency scores of two-stage systems. Based on the mentioned approaches, many models are introduced to measure the efficiency of two-stage systems with comprehensive structures. A model for measuring the efficiency of two-stage systems in presence of shared resources and undesirable outputs using the heuristic algorithm was also presented by Wu *et al.* [10]. Then, Guo and Zhu [11] converted the non-cooperative models of Wu *et al.* [10] into a linear program by utilizing the Charnes-Cooper transformation or conversion. Izadikhah *et al.* [12] also rendered a model for measuring the efficiency of two-stage systems with liberally distributed initial inputs and shared intermediate outputs. Also, Xueqin *et al.* [13] measured the efficiency of commercial banks based on two-stage DEA model in presence of undesirable output. Akbarian [14] proposed the new network DEA based on DEA-ratio. The novel classify of flexible and integer data in two-stage network DEA proposed by Hosseini Monfared *et al.* [15] (Refer to ([16-22])). All these models are focused on measuring the efficiency in a definite time period.

In varied applications, we need to compute the efficiency of systems in multiple time periods. Hence, many studies have been done to evaluate the efficiency of DMUs in different time periods. For example, Portela *et al.* [23] calculated the efficiency of DMUs in several time periods by employing the data average. Then, Kao and Liu [24] introduced the aggregate model, connected network model, and relational network model to calculate the multi-period efficiency of DMUs. The aggregate model is used in the aggregation of data; and is solved independently, to obtain the efficiency in a specific period. The connected network model calculates the efficiency of each period separately. Then, the efficiency of the period with the highest performance is recognized as the efficiency of the system. But in the relational network model, the constraints of each period are used and thus, after solving this model, the overall efficiency of the system and efficiency of each period are calculated. However, in this model, the total efficiency of the system is defined as the weighted average of periods. Razavi Hajiagha *et al.* [25] utilized the mean-variance criteria and presented a method for measuring

the efficiency of multi-period systems. Bansal et al. [26] also measured the multi-period additive efficiency of systems with non-positive and undesirable data. Jahani Sayyad Noveiri et al. [27] introduced a DEA-based procedure to measure the multi-period efficiency of systems in the presence of undesirable outputs. Also, Tamamatam et al. [28] used DEA technique and measured the efficiency of Indian banking industry over the period 2008–2017 (also refer to [29, 30]).

These models ignore the internal structure of systems. Therefore, Kao and Hwang [31] expanded the relational network model and proposed a multiplier model that is able to calculate the overall efficiency of a multi-period two-stage system and periods at the same time. But in this model, the importance of data at the different time periods is equally acclaimed. The fact arises that, in this model, the efficiencies under the VRS assumption cannot be computed. Esfidani et al. [32], proposed a new additive approach to measure the efficiency of multi-period two-stage systems under the CRS and VRS assumptions. In these approaches, the indexes are given to identify the progress or regress conditions of the system and stages from a period to another period. But these models do not have the capacity to determine the type of RTS of two-stage systems in each period and whole time periods. Subsequently, Tohidnia and Tohidi [33] proposed methods to measure the multi-period global cost efficiency in network systems when the price of exogenous inputs is identified in whole time periods. Zhou et.al [34] evaluated the efficiency of banking systems under uncertainty with multi-period three-stage structures. A novel multi-period DEA model for measuring the efficiencies of parallel and series systems was proposed by Esmaeilzadeh and Kazemi matin [35].

Numerous models have been presented that estimated RTS based on DEA models. Banker and Thrall [36] deployed the fractional DEA model and proposed an approach for estimating RTS. By using CCR and BCC models, Färe and Grosskopf [37] suggested an alternative approach to estimate RTS. An additive model approach for estimating RTS in imprecise DEA was also proposed by Khodabakhshi et al. [38] (Refer to ([39-47])). In order to evaluate the supply chains, Sharma and Yu [44] introduced multi-Echelon DEA VRS models; whilst for determining the RTS of an integer-value, a DEA model was presented by Taleb et.al [44]. Benicio and De Mello [48] also offered a different type of RTS in DEA, where, the possibility of the presence of a concave upward efficient frontier was taken under consideration.

The mentioned studies focus on evaluating the RTS of black box systems. Khaleghi et.al [49] determined the classification of the RTS and scale elasticity of two-stage systems based on contemplating the scale elasticity in each stage. Zhang and yang [50] introduced some models to determine the type of RTS in a two-stage system by utilizing the DEA envelopment models within a specific time. In fact, firstly, they solved the model to identify the efficient DMUs in the stages and the entire system. Then, two models for determining the RTS corresponding to each stage (and the whole system) are presented. Hence, their methods have a complex structure in specifying RTS. Also, Fakhr Mousavi et al. [51] presented a different non-radial procedure that measure the RTS and scale economies (SE) of network structures. Recently, many articles have been presented in various fields of data envelopment analysis. For example, Lexicographic decomposition strategy for the two-stage network DEA model is suggested by Yang and Fang [52]. A book in the field of uncertainty in data envelopment analysis is presented by Hosseinzadeh Lotfi et al. [53]. Also, Yu [54] suggested a non-desired output and non-radial DEA model for measuring industrial parks' green development performance. A non-desired output and non-radial DEA model for measuring industrial parks' green development performance is suggested by Yu [2023]. (Also, refer to [55-57])

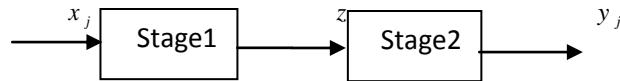
Unlike the standard DEA, network DEA imposes hurdles for measuring scale efficiency due to the fact that (i) overall efficiency aggregated by the stage or divisional technical efficiencies is highly non-linear and only solvable in a heuristic manner, or (ii) the overall efficiency which concerns exclusively inputs and outputs of a system is difficult to be decomposed into divisional efficiencies. In this paper, we establish a mathematical transformation to convert the corresponding non-linear programming problem into second order cone programming. The transformation is shown to be versatile in dealing with both CRS and VRS models under the two-stage network DEA.

So far, a multiplier model, for calculating the efficiency of a multi-period two-stage systems under a VRS assumption, has not been presented. Therefore, we seek to present an approach, which calculates the efficiency of the whole system as well as the stages of efficiency of multi-period two-stage systems in each period and whole time periods, without complexity; thereby, determining the RTS status of multi-period two-stage systems, simultaneously. For this purpose, being attentive to the significance of data in time periods, is a crucial issue. Hence, in this paper, we will propose a model which evaluates the efficiency of multi-period two-stage systems under the VRS assumption such that, the importance of data is considered diversely in different time periods; whereas, the overall efficiency of the system over the whole time periods is decomposed as a product of the efficiency of stages. In addition, the overall efficiency of system can be decomposed to the efficiency of stages in each period. On the whole, the efficiency of the system (or efficiency of stages) in whole time periods can be decomposed as a weighted average of the overall efficiency (or efficiency of stages in each period. Theorems are also being presented to determine the type of RTS of the full system and stages in each period, including whole time periods. Actually, on the basis of these theorems, if stages 1 and 2 comprise of IRS (or DRS or) CRS in each period (or whole time periods), the whole system will enclose IRS (or DRS), or CRS in each period (or whole time periods). We will also demonstrate that if one of the stages has IRS (or DRS) and another stages has CRS in each period (or whole time periods), the whole system shall include IRS (or DRS) in each period (or whole time periods). And if one of the stages has IRS and another stage has DRS in each period (or whole time periods), we shall present the theorem which identifies the condition of the RTS of the whole system in each period (or whole time periods). Finally, we can briefly state that by solving a model, we are able to specify the type of RTS in multi-period two-stage systems whilst calculating their efficiencies.

The rest of this paper is organized as follows: Initially, we introduce the structure of a two-stage system and review the two-stage DEA model proposed by Wang and Chin [5]. Next, by presenting the structure of a multi-period two-stage system, we shall review the model presented by Kao and Hwang [31]. In Section 2, we suggest a model to measure the multi-period two- stage system by considering the importance of data in a diverse manner in time periods in Section 3. The decompositions of the efficiencies are also proposed. In addition, we determine the type of the returns to scale of a multi-period two- stage system in each period and whole time periods. In Section 4, we present the results of a case study in Taiwanese non-life companies. Section 5 presents our conclusions and future research directions (guidelines).

## 2 Preliminaries

Suppose there are  $n$  DMUs with two-stage structure that  $x_j, z_j, y_j$  are input, intermediate measure and output corresponding to each  $DMU_j$  ( $j=1, \dots, n$ ). The structure of a two-stage system is depicted in Figure 1.

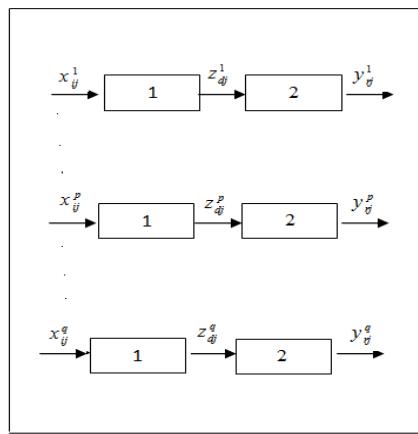


**Fig. 1** Two-stage production system

Wang and Chin [5] proposed the following model which calculates the VRS efficiency of two-stage systems at a certain time period:

$$\begin{aligned}
 E_o = \max \quad & [E_o^I \times E_o^{II}] = \frac{\sum_{r=1}^s \mu_r y_{ro} + u^2}{\sum_{i=1}^m \omega_i x_{io} - u^1} \\
 \text{s.t.} \quad & \frac{\sum_{r=1}^s \pi_d z_{do}}{\sum_{i=1}^m \omega_i x_{io} - u^1} \leq 1, \quad j = 1, \dots, n \quad (1) \\
 & \frac{\sum_{r=1}^s \mu_r y_{ro} + u^2}{\sum_{r=1}^s \pi_d z_{do}} \leq 1, \quad j = 1, \dots, n \\
 & \omega_i, \mu_r, \pi_d \geq 0, \quad i = 1, \dots, m \quad r = 1, \dots, s \quad d = 1, \dots, D \\
 & u^1, u^2 \text{ free}
 \end{aligned}$$

Note that  $\omega_i, \mu_r, \pi_d$  are the weights of inputs, outputs and intermediate measures corresponding to a two-stage system. Now, suppose we have  $n$  DMUs with two-stage structure and there are  $q$  time periods. Figure 2 shows the structure of a multi-period two-stage system. In time period  $p$ , each  $DMU_j$  ( $j=1, \dots, n$ ) in Stage 1, consumes inputs  $x_{ij}^p$ ;  $i=1, \dots, m$  to produce intermediate products  $z_{dj}^p$ ;  $d=1, \dots, D$ , and then in Stage 2, consumes the intermediate products  $z_{dj}^p$ ;  $d=1, \dots, D$  to produce outputs  $y_{rj}^p$ ;  $r=1, \dots, s$ . We consider  $x_{ij} = \sum_{p=1}^q x_{ij}^p$ ,  $z_{dj} = \sum_{p=1}^q z_{dj}^p$ ,  $y_{rj} = \sum_{p=1}^q y_{rj}^p$  as the aggregate inputs, intermediate products and outputs of  $DMU_j$ , respectively.



**Fig. 2** Multi-period two-stage system

In order to evaluate the efficiency of this system, Kao and Hwang [31] suggested the following model that measures the efficiency of a system and stages in each time period and whole time periods, simultaneously:

$$\begin{aligned}
 E_o^s = \max \quad & \sum_{r=1}^s \mu_r y_{ro} \\
 \text{s.t.} \quad & \sum_{i=1}^m \omega_i x_{io} = 1 \\
 & \sum_{d=1}^D \pi_d z_{dj} - \sum_{i=1}^m \omega_i x_{ij} \leq 0, \quad j = 1, \dots, n \\
 & \sum_{d=1}^D \pi_d z_{dj}^p - \sum_{i=1}^m \omega_i x_{ij}^p \leq 0, \quad j = 1, \dots, n \quad p = 1, \dots, q \quad (2) \\
 & \sum_{r=1}^s \mu_r y_{rj} - \sum_{d=1}^D \pi_d z_{dj} \leq 0, \quad j = 1, \dots, n \\
 & \sum_{r=1}^s \mu_r y_{rj}^p - \sum_{d=1}^D \pi_d z_{dj}^p \leq 0, \quad j = 1, \dots, n \quad p = 1, \dots, q \\
 & \mu_r, \pi_d, \omega_i \geq 0 \quad r = 1, \dots, s \quad r = 1, \dots, S \quad d = 1, \dots, D \quad i = 1, \dots, m
 \end{aligned}$$

### 3 The proposed generalized model

In this section firstly, we will suggest a model to measure the VRS efficiency of multi-period two-stage systems. At the end, some definitions and theorems are given to identify the type of the RTS of system and stages in each period  $p$  and whole time periods. Note that, in model (2), the data has equal importance in different time periods. Actually, the weights of inputs ( $\omega_i$ ), the weights of outputs ( $\mu_r$ ) and the weights of intermediate products weights ( $\pi_d$ ) are similar in all periods; and in many situations it is also necessary to calculate the VRS efficiency and identify the status of RTS corresponding to the whole system and stages in each of the time periods as well as the whole time periods. In this case, this model is not applicable. Thus, we modify this model and use model (1) to introduce a model to overcome these shortcomings. Actually, we perform VRS efficiency calculation and identify the RTS

status of multi-period two-stage systems by solving a model. Hence, by considering the input weight  $\omega_i^p$ , the output weight  $\mu_r^p$  and the intermediate products weight  $\pi_d^p$  to time period time  $p$ , the generalized model is given as follows:

$$\begin{aligned}
 E_o^s = \max \quad & \frac{\sum_{p=1}^q \sum_{r=1}^s \mu_r^p y_{ro}^p + \sum_{p=1}^q u^{2p}}{\sum_{p=1}^q \sum_{i=1}^m \omega_i^p x_{io}^p - \sum_{p=1}^q u^{1p}} \\
 \text{s.t.} \quad & \frac{\sum_{p=1}^q \sum_{d=1}^D \pi_d^p z_{dj}^p}{\sum_{p=1}^q \sum_{i=1}^m \omega_i^p x_{ij}^p - \sum_{p=1}^q u^{1p}} \leq 1, \quad j = 1, \dots, n \quad (3) \\
 & \frac{\sum_{d=1}^D \pi_d^p z_{dj}^p}{\sum_{i=1}^m \omega_i^p x_{ij}^p - u^{1p}} \leq 1, \quad j = 1, \dots, n \quad p = 1, \dots, q \\
 & \frac{\sum_{p=1}^q \sum_{r=1}^s \mu_r^p y_{rj}^p + \sum_{p=1}^q u^{2p}}{\sum_{p=1}^q \sum_{d=1}^D \pi_d^p z_{dj}^p} \leq 1, \quad j = 1, \dots, n \\
 & \frac{\sum_{r=1}^s \mu_r^p y_{rj}^p + u^{2p}}{\sum_{d=1}^D \pi_d^p z_{dj}^p} \leq 1, \quad j = 1, \dots, n \quad p = 1, \dots, q \\
 & \omega_i^p, \mu_r^p, \pi_d^p \geq 0, \quad i = 1, \dots, m \quad r = 1, \dots, s \quad d = 1, \dots, D \quad p = 1, \dots, q \\
 & u^{1p}, u^{2p} \text{ free} \quad p = 1, \dots, q
 \end{aligned}$$

This model can be converted to the linear form, easily. By solving model (3), the efficiencies of the system in each period  $p$  and over  $q$  time periods are obtained as follows:

$$\begin{aligned}
 E_o^s &= \frac{\sum_{p=1}^q \sum_{r=1}^s \mu_r^p y_{ro}^p + \sum_{p=1}^q u^{2p}}{\sum_{p=1}^q \sum_{i=1}^m \omega_i^p x_{io}^p - \sum_{p=1}^q u^{1p}}, & E_o^I &= \frac{\sum_{p=1}^q \sum_{d=1}^D \pi_d^p z_{do}^p}{\sum_{p=1}^q \sum_{i=1}^m \omega_i^p x_{io}^p - \sum_{p=1}^q u^{1p}}, & E_o^{II} &= \frac{\sum_{p=1}^q \sum_{r=1}^s \mu_r^p y_{ro}^p + \sum_{p=1}^q u^{2p}}{\sum_{p=1}^q \sum_{d=1}^D \pi_d^p z_{do}^p} \\
 E_o^{s(p)} &= \frac{\sum_{r=1}^s \mu_r^p y_{ro}^p + u^{2p}}{\sum_{i=1}^m \omega_i^p x_{io}^p - u^{1p}}, & E_o^{I(p)} &= \frac{\sum_{d=1}^D \pi_d^p z_{do}^p}{\sum_{i=1}^m \omega_i^p x_{io}^p - u^{1p}}, & E_o^{II(p)} &= \frac{\sum_{r=1}^s \mu_r^p y_{ro}^p + u^{2p}}{\sum_{d=1}^D \pi_d^p z_{do}^p}
 \end{aligned}$$

Wherein,  $E_o^s$ ,  $E_o^I$  and  $E_o^{II}$  demonstrate the overall efficiency of the system and efficiency of stage 1 and the efficiency of Stage 2 during the whole time period  $q$  respectively. In a similar way,  $E_o^{s(p)}$ ,  $E_o^{I(p)}$  and  $E_o^{II(p)}$  give the overall efficiency and efficiencies of stages 1 and 2 in time period  $p$ , respectively.

**Theorem 1.** It is noted that  $DMU_o$  is overall efficient if and only if  $E_o^s = 1$ . And also,  $DMU_o$  is efficient in stage 1, 2 over  $q$  time periods if and only if  $E_o^I = E_o^{II} = 1$ .

### 3.1 The decompositions of efficiencies

We can decompose the overall efficiency of the system to the product of the efficiencies of stages, in each of the periods,  $p$  and over  $q$  time periods. Now, in order to show the relationships between the overall efficiency of the system in each period  $p$  and whole time periods, including the correlations between the efficiency of stages over the  $q$  time period and efficiency of stages in each period  $p$ , we introduce the following relationships:

$$E_o^s = E_o^I \times E_o^{II}, \quad E_o^{s(p)} = E_o^{I(p)} \times E_o^{II(p)}$$

Therefore, we can decompose the overall efficiency of system to product of the efficiencies of stages in each period  $p$  and over  $q$  time periods. Now, in order to show the relationships between the overall efficiency of the system in each period  $p$  and whole time periods, and the relationships between the efficiency of stages over  $q$  time period and efficiency of stages in each period  $p$ , we introduce the following relationships:

$$\begin{aligned} E_o^s &= \sum_{p=1}^q \varpi^p E_o^{s(p)}, & \varpi^p &= \frac{\sum_{i=1}^m \omega_i^{p*} x_{io}^p - u^{1p*}}{\sum_{p=1}^q \sum_{i=1}^m \omega_i^{p*} x_{io}^p - \sum_{p=1}^q u^{1p*}} \\ E_o^I &= \sum_{p=1}^q \varpi^{I(p)} E_o^{I(p)}, & \varpi^{I(p)} &= \frac{\sum_{i=1}^m \omega_i^{p*} x_{io}^p - u^{1p*}}{\sum_{p=1}^q \sum_{i=1}^m \omega_i^{p*} x_{io}^p - \sum_{p=1}^q u^{1p*}} \\ E_o^{II} &= \sum_{p=1}^q \varpi^{II(p)} E_o^{II(p)}, & \varpi^{II(p)} &= \frac{\sum_{d=1}^D \pi_d^{p*} z_{do}^p}{\sum_{p=1}^q \sum_{d=1}^D \pi_d^{p*} z_{do}^p} \end{aligned}$$

$\varpi^{II(p)}$  can be considered by the proportion of the aggregated input consumed by stage 2 in period to the total aggregated inputs consumed by stage 2 over whole time periods. It can be concluded that the weighted average of the efficiencies of periods is defined as the overall efficiency of the system over  $q$  time period. Note that, decomposition of the efficiencies can be done as follows:

$$E_o^s = E_o^I \times E_o^{II} = \left( \sum_{p=1}^q \varpi^{I(p)} E_o^{I(p)} \right) \left( \sum_{p=1}^q \varpi^{II(p)} E_o^{II(p)} \right)$$

$$E_o^s = \sum_{p=1}^q \varpi^p E_o^{s(p)} = \sum_{p=1}^q \varpi^p (E_o^{I(p)} * E_o^{II(p)})$$

Finally, by using the above decompositions, we get the following theorem:

**Theorem 2.** The multi-period two-stage system is efficient under the VRS assumption, if and only if its stages are efficient under the VRS assumption in the all periods.

In the cases where, the optimal solution of the model (3) may not be unique or distinctive, the overall efficiency decomposition will not be characteristic. We shall also not be able to compare the efficiency of different DMUs together. So, we follow the Kao, Hwang( [3], [31]) approaches here, to find a set of multipliers (coefficients) for this period and compare the efficiency of DMUs in a period, which produces the largest efficiency, while in general, the efficiency of the system is unchanged. This approach is persistent for other periods. Note that each period has a two-stage structure and we assume that the efficiency of period  $t$ , is the most important period. Thus, if the first is stage 1, in terms of period  $t$ , it is more important than the second stage of the same period, in order to calculate the maximum efficiency of

Stage 1, the following model is solved, while the efficiency of period  $t$  and the overall efficiency remain unaltered:

$$\begin{aligned}
 E_o^{1(t)} &= \max \frac{\sum_{d=1}^D \pi_d^t z_{do}^t}{\sum_{i=1}^m \omega_i^t x_{io}^t - u^{1t}} \\
 \text{s.t.} \quad & \frac{\sum_{d=1}^D \pi_d^t z_{dj}^t}{\sum_{i=1}^m \omega_i^t x_{ij}^t - u^{1t}} \leq 1, \quad j = 1, \dots, n \quad (4) \\
 & \frac{\sum_{r=1}^s \mu_r^t y_{rj}^t + u^{2t}}{\sum_{d=1}^D \pi_d^t z_{dj}^t} \leq 1, \quad j = 1, \dots, n \\
 & \frac{\sum_{p=1}^q \sum_{r=1}^s \mu_r^p y_{rm}^p + \sum_{p=1}^q u^{2p}}{\sum_{p=1}^q \sum_{i=1}^m \omega_i^p x_{io}^p - \sum_{p=1}^q u^{1p}} = E_o^s \\
 & \frac{\sum_{r=1}^s \mu_r^t y_{rm}^t + u^{2t}}{\sum_{i=1}^m \omega_i^t x_{io}^t - u^{1t}} = E_o^{s(t)} \\
 & \omega_i^p, \mu_r^p, \pi_d^p \geq 0, \quad i = 1, \dots, m \quad r = 1, \dots, s \quad d = 1, \dots, D \quad p = 1, \dots, q \\
 & u^{1p}, u^{2p} \text{ free} \quad p = 1, \dots, q
 \end{aligned}$$

Then, the efficiency of stage 2 is  $E_o^{II(t)} = E_o^{s(t)} / E_o^{1(t)}$ . Finally, we note that in model (3), if  $u^{1p} = u^{2p} = 0$ ,  $p = 1, \dots, q$ , this model is converted to the Kao and Hwang model [31].

### 3.2 Determining RTS in multi-period two-stage systems

In this subsection, firstly, we will introduce the basic definitions of production possibility set (PPS) and RTS corresponding to the multi-period two-stage systems. Then, theorems are presented to identify the type of RTS of whole system and stages in each period  $p$  and over  $q$  time periods. In following Banker et al. [51], we primarily define the PPS of Stage 1 in period  $p(T_{1p})$ , of Stage 2 in period  $p(T_{2p})$ , of the system in period  $p(T_p)$ , of Stage 1 in the whole time periods  $(T_1)$ , of Stage 2 in the whole time periods  $(T_2)$  and of the system of Stage 1, in the whole time periods  $(T)$ , as follows:

$$\begin{aligned}
T_{1p} &= \left\{ (x^p, z^p) \mid X^p \lambda^p \leq x^p, Z^p \lambda^p \geq z^p, 1\lambda^p = 1, \lambda^p \geq 0 \right\} \\
T_{2p} &= \left\{ (z^p, y^p) \mid Z^p \gamma^p \leq z^p, Y^p \gamma^p \geq y^p, 1\gamma^p = 1, \gamma^p \geq 0 \right\} \\
T_p &= \left\{ (x^p, z^p, y^p) \mid X^p \lambda^p \leq x^p, Z^p \lambda^p \geq z^p, Z^p \gamma^p \leq z^p, Y^p \gamma^p \geq y^p, 1\lambda^p = 1, 1\gamma^p = 1, \lambda^p \geq 0, \gamma^p \geq 0 \right\} \\
T_1 &= \left\{ (x^p, z^p) \mid \substack{X^p \lambda^p \leq x^p, Z^p \lambda^p \geq z^p, 1\lambda^p = 1, \lambda^p \geq 0, p = 1, \dots, q} \right\} \\
T_2 &= \left\{ (z^p, y^p) \mid \substack{Z^p \gamma^p \leq z^p, Y^p \gamma^p \geq y^p, 1\gamma^p = 1, \gamma^p \geq 0, p = 1, \dots, q} \right\} \\
T &= \left\{ (x^p, z^p, y^p) \mid \substack{X^p \lambda^p \leq x^p, Z^p \lambda^p \geq z^p, Z^p \gamma^p \leq z^p, Y^p \gamma^p \geq y^p, 1\lambda^p = 1, 1\gamma^p = 1, \lambda^p \geq 0, \gamma^p \geq 0, p = 1, \dots, q} \right\}
\end{aligned}$$

$$\text{Where, } T_1 \cup T_2 = \bigcup_{p=1}^q T_p = T, \bigcup_{p=1}^q T_{1p} = T_1, \bigcup_{p=1}^q T_{2p} = T_2.$$

The following definitions are introduced for detecting the type of RTS in whole system (or Stage 1, or Stage 2) in a certain time period  $P$ .

**Definition1.** Suppose  $DMU_o$  is efficient in the whole system and  $T = T_p$ . Then,

**1-1.**  $DMU_o$  in the whole system has increasing returns to scale (*IRS*), if there is  $\delta^* > 0$ , such that:

$$\forall \delta \in (0, \delta^*] \Rightarrow Z_\delta = ((1+\delta)x_o, (1+\delta)z_o, (1+\delta)y_o) \in \text{int } T$$

**1-2.**  $DMU_o$  in the whole system (has decreasing returns to scale (*DRS*)), if there is  $\delta^* > 0$ , such that:

$$\forall \delta \in (0, \delta^*] \Rightarrow Z_\delta = ((1-\delta)x_o, (1-\delta)z_o, (1-\delta)y_o) \in \text{int } T$$

**1-3.**  $DMU_o$  in the whole system has constant returns to scale (*CRS*), if there are  $\delta^* > 0$ ,  $\delta^* > 0$ , such that at least one of the following conditions holds:

$$1-3-1. \begin{cases} \forall \delta \in (0, \delta^*] \Rightarrow Z_\delta = ((1+\delta)x_o, (1+\delta)z_o, (1+\delta)y_o) \text{ is efficient} \\ \forall \delta \in (0, \delta^*] \Rightarrow Z_\delta = ((1-\delta)x_o, (1-\delta)z_o, (1-\delta)y_o) \text{ is efficient} \end{cases}$$

$$1-3-2. \begin{cases} \forall \delta \in (0, \delta^*] \Rightarrow Z_\delta = ((1+\delta)x_o, (1+\delta)z_o, (1+\delta)y_o) \notin T \\ \forall \delta \in (0, \delta^*] \Rightarrow Z_\delta = ((1-\delta)x_o, (1-\delta)z_o, (1-\delta)y_o) \notin T \end{cases}$$

$$1-3-3. \begin{cases} \forall \delta \in (0, \delta^*] \Rightarrow Z_\delta = ((1+\delta)x_o, (1+\delta)z_o, (1+\delta)y_o) \text{ is efficient} \\ \forall \delta \in (0, \delta^*] \Rightarrow Z_\delta = ((1-\delta)x_o, (1-\delta)z_o, (1-\delta)y_o) \notin T \end{cases}$$

$$1-3-3. \begin{cases} \forall \delta \in (0, \delta^*] \Rightarrow Z_\delta = ((1+\delta)x_o, (1+\delta)z_o, (1+\delta)y_o) \notin T \\ \forall \delta \in (0, \delta^*] \Rightarrow Z_\delta = ((1-\delta)x_o, (1-\delta)z_o, (1-\delta)y_o) \text{ is efficient} \end{cases}$$

Also, similar Definitions can be given for the stage 1 with  $T = T_{1p}$ ,  $Z_\delta = ((1+\delta)x_o, (1+\delta)z_o)$ ,  $Z_\delta = ((1-\delta)x_o, (1-\delta)z_o)$  and stage 2 with  $T = T_{2p}$ ,  $Z_\delta = ((1+\delta)z_o, (1+\delta)y_o)$ ,  $Z_\delta = ((1-\delta)z_o, (1-\delta)y_o)$ . Therefore, based on the optimal solutions of model (3), we presented theorems to identify the type of RTS in a multi-period two-stage system. By using the status of the sign  $u^{1p*}$  in period  $p$  and Definition 1, theorem 3 is rendered to recognize the type of RTS of  $DMU_o$  in stage 1.

**Theorem3.** Suppose  $DMU_o$  is efficient in stage 1 of period  $p$ , i.e.  $E_o^{1(p)} = 1$ , then

**3-i.** If  $u^{1p*} > 0$ ,  $DMU_o$  in stage 1 of period  $p$  has *IRS*.

**Proof.** Suppose  $(\mu^{(p)*}, \omega^{(p)*}, \pi^{(p)*}, u^{1p*}, u^{2p*})$  is the optimal solution of model (3) and there is  $\delta^{p*} > 0$  such that  $Z_{\delta^p}^p = ((1+\delta^p)x_o^p, (1+\delta^p)z_o^p)$ ,  $\delta^p \in (0, \delta^{p*}]$ . Since  $DMU_o$  is efficient in stage 1 of period  $p$ , we have:  $\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p + u^{1p*} = 0$ . In this case,

$$\begin{aligned} P_{1\delta^p}^p &= \pi^{(p)*}(1+\delta^p)z_o^p - \omega^{(p)*}(1+\delta^p)x_o^p + u^{1p*} = (\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p)(1+\delta^p) + \\ u^{1p*} + \delta^p u^{1p*} - \delta^p u^{1p*} &= (\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p + u^{1p*})(1+\delta^p) - \delta^p u^{1p*} = 0 - \delta^p u^{1p*} = -\delta^p u^{1p*} \end{aligned}$$

If  $u^{1p*} > 0$ , we have  $P_{1\delta^p}^p < 0$ . Therefore,  $Z_{\delta^p}^p \in \text{int}T_{1p}$  and according to Definition 1,  $DMU_o$  in stage 1 of period  $p$  has IRS and the proof is complete.

**3-ii.** If  $u^{1p*} < 0$ ,  $DMU_o$  in stage 1 of period  $p$  has DRS.

**Proof.** Suppose  $(\mu^{(p)*}, \omega^{(p)*}, \pi^{(p)*}, u^{1p*}, u^{2p*})$  is the optimal solution of model (3), and for period  $p$ , there is  $\delta^{p*} > 0$  such that,  $Z_{\delta^p}^p = ((1-\delta^p)x_o^p, (1-\delta^p)z_o^p)$ ,  $\delta^p \in (0, \delta^{p*}]$ . Since  $DMU_o$  is efficient in stage 1 of period  $p$ , we have:  $\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p + u^{1p*} = 0$ . In this case,

$$\begin{aligned} P_{1\delta^p}^p &= \pi^{(p)*}(1-\delta^p)z_o^p - \omega^{(p)*}(1-\delta^p)x_o^p + u^{1p*} = (\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p)(1-\delta^p) + \\ u^{1p*} + \delta^p u^{1p*} - \delta^p u^{1p*} &= (\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p + u^{1p*})(1-\delta^p) + \delta^p u^{1p*} = 0 + \delta^p u^{1p*} = \delta^p u^{1p*} \end{aligned}$$

Thus, if  $u^{1p*} < 0$ , we have  $P_{1\delta^p}^p < 0$ . Therefore,  $Z_{\delta^p}^p \in \text{int}T_{1p}$ , and according to Definition 1,  $DMU_o$  in stage 1 of period  $p$  has DRS.

**3-iii.** If  $u^{1p*} = 0$ ,  $DMU_o$  in stage 1 of period  $p$  has CRS.

**Proof.** Suppose  $(\mu^{(p)*}, \omega^{(p)*}, \pi^{(p)*}, u^{1p*}, u^{2p*})$  is the optimal solution of model (3) and there are  $\delta^{p*} > 0$ ,  $\delta^{p*} > 0$ , such that

$$\begin{cases} Z_{\delta^p}^p = ((1+\delta^p)x_o^p, (1+\delta^p)z_o^p), \delta^p \in (0, \delta^{p*}] \\ Z_{\delta^p}^p = ((1-\delta^p)x_o^p, (1-\delta^p)z_o^p), \delta^p \in (0, \delta^{p*}] \end{cases}$$

Since  $DMU_o$  is efficient in stage 1 of period  $P$ , we have:  $\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p + u^{1p*} = 0$ . In this case,

$$\begin{cases} P_{1\delta^p}^p = \pi^{(p)*}(1+\delta^p)z_o^p - \omega^{(p)*}(1+\delta^p)x_o^p + u^{1p*} = (\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p)(1+\delta^p) + \\ u^{1p*} + \delta^p u^{1p*} - \delta^p u^{1p*} = (\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p + u^{1p*})(1+\delta^p) - \delta^p u^{1p*} = 0 \\ P_{1\delta^p}^p = \pi^{(p)*}(1-\delta^p)z_o^p - \omega^{(p)*}(1-\delta^p)x_o^p + u^{1p*} = (\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p)(1-\delta^p) + \\ u^{1p*} + \delta^p u^{1p*} - \delta^p u^{1p*} = (\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p + u^{1p*})(1-\delta^p) + \delta^p u^{1p*} = 0 \\ P_{1\delta^p}^p = P_{1\delta^p}^p = 0 \end{cases}$$

Thus, if  $u^{1p*} = 0$ , then,  $Z_{\delta^p}^p, Z_{\delta^p}^p$  are efficient in stage 1 of period  $p$  and according to Definition 1,  $DMU_o$  in stage 1 of period  $p$  has CRS.

In whole time periods, based on Definition 1 and the sign status of  $\sum_{p=1}^q u^{1p*}$ , we can identify the type of RTS  $DMU_o$  in stage 1. For this reason, we present the following theorem:

**Theorem4.** Suppose  $DMU_o$  is efficient in stage 1 over  $q$  time periods, i.e  $E_o^1 = 1$ ,

**4-i.** If  $\sum_{p=1}^q u^{1p*} > 0$ ,  $DMU_o$  in stage 1 of  $q$  time period has IRS.

**Proof.** Suppose  $(\mu^{(p)*}, \omega^{(p)*}, \pi^{(p)*}, u^{1p*}, u^{2p*})$  is the optimal solution of model (3), and corresponding to each period  $p$ ,  $(p=1, \dots, q)$ , there are  $\delta^{p*} > 0$ ,  $p=1, \dots, q$  such that:

$Z_{\delta^p}^p = ((1+\delta^p)x_o^p, (1+\delta^p)z_o^p)$ ,  $\delta^p \in (0, \delta^{p*}]$ ;  $p=1, \dots, q$ . Since  $DMU_o$  is efficient in Stage 1 over  $q$  time periods, we have:

$$w^{(p)*}z_o^p - v^{(p)*}x_o^p + u^{1p*} = 0, \quad p=1, \dots, q$$

In this case,

$$\begin{cases} P_{1\delta^p}^p = \pi^{(p)*}(1+\delta^p)z_o^p - \omega^{(p)*}(1+\delta^p)x_o^p + u^{1p*} = (\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p)(1+\delta^p) + \\ u^{1p*} + \delta^p u^{1p*} - \delta^p u^{1p*} = (\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p + u^{1p*})(1+\delta^p)x_o^p - \delta^p u^{1p*} = \\ 0 - \delta^p u^{1p*} = -\delta^p u^{1p*}, \quad p=1, \dots, q \Rightarrow \sum_{p=1}^q P_{1\delta^p}^p = \sum_{p=1}^q -\delta^p u^{1p*} = -\sum_{p=1}^q \delta^p u^{1p*} \end{cases}$$

Therefore, if  $\sum_{p=1}^q u^{1p*} > 0$ , then  $\sum_{p=1}^q P_{1\delta^p}^p < 0$ . Thus, where  $\delta^p \in (0, \delta^{p*}]$ ,  $p=1, \dots, q$ . This means that according to Definition 1,  $DMU_o$  has IRS.

**4-ii.** If  $\sum_{p=1}^q u^{1p*} < 0$ ,  $DMU_o$  in stage 1 of  $q$  time period has DRS.

**Proof.** It is similar to the proof of (4-i).

**4-iii.** If  $\sum_{p=1}^q u^{1p*} = 0$ ,  $DMU_o$  in stage 1 of  $q$  time period has CRS.

**Proof.** It is similar to the proof of (4-i).

Theorem 5 determines the type of RTS  $DMU_o$  in stage 2, by using the sign  $u^{2p*}$  in period  $p$ :

**Theorem 5.** Suppose  $DMU_o$  is efficient in stage 2 of period  $p$ , i.e  $E_o^{II(p)} = 1$ , then

**5-i.** If  $u^{2p*} > 0$ ,  $DMU_o$  in stage 2 of period  $p$  has IRS.

**Proof.** Suppose  $(\mu^{(p)*}, \omega^{(p)*}, \pi^{(p)*}, u^{1p*}, u^{2p*})$  is the optimal solution of model (3) and there is  $\delta^{p*} > 0$  and  $Z_{\delta^p}^p = ((1+\delta^p)z_o^p, (1+\delta^p)y_o^p)$ ,  $\delta^p \in (0, \delta^{p*}]$ . Since  $DMU_o$  is efficient in Stage 2 of period  $p$ , we have  $\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p + u^{2p*} = 0$ . In this case,

$$\begin{aligned} P_{2\delta^p}^p &= \mu^{(p)*}(1+\delta^p)y_o^p - \pi^{(p)*}(1+\delta^p)z_o^p + u^{1p*} = (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p)(1+\delta^p) + u^{2p*} + \\ \delta^p u^{2p*} - \delta^p u^{2p*} &= (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p + u^{2p*})(1+\delta^p) - \delta^p u^{2p*} = 0 - \delta^p u^{2p*} = -\delta^p u^{2p*} \end{aligned}$$

Thus, if  $u^{2p*} > 0$ , then  $P_{2\delta^p}^p < 0$ .  $Z_{\delta^p}^p \in \text{int}T_{2p}$  and according to Definition 1,  $DMU_o$  in stage 2 of period  $p$  has IRS.

**5-ii.** If  $u^{2p*} < 0$ ,  $DMU_o$  in stage 1 of period  $p$  has DRS.

**Proof.** Suppose  $(\mu^{(p)*}, \omega^{(p)*}, \pi^{(p)*}, u^{1p*}, u^{2p*})$  is the optimal solution of model (3), and for period  $p$ , there is  $\delta^{p*} > 0$  and  $Z_{\delta^p}^p = ((1-\delta^p)z_o^p, (1-\delta^p)y_o^p)$ ,  $\delta^p \in (0, \delta^{p*}]$ . Since  $DMU_o$  is efficient in stage 2 of period  $p$ , we have:  $\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p + u^{2p*} = 0$ . In this case,

$$\begin{aligned} P_{2\delta^p}^p &= \mu^{(p)*}(1-\delta^p)y_o^p - \pi^{(p)*}(1-\delta^p)z_o^p + u^{1p*} = (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p)(1-\delta^p) + \\ u^{2p*} + \delta^p u^{2p*} - \delta^p u^{2p*} &= (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p + u^{2p*})(1-\delta^p) - \delta^p u^{2p*} = 0 + \delta^p u^{2p*} = \delta^p u^{2p*} \end{aligned}$$

Thus, if  $u^{2p*} < 0$ , then  $P_{2\delta^p}^p < 0$ . Therefore,  $Z_{\delta^p}^p \in \text{int}T_{2p}$  and according to Definition 1,  $DMU_o$  in stage 2 of period  $p$  has DRS.

**5-iii.** If  $u^{2p^*} = 0$ ,  $DMU_o$  in stage 2 has CRS .

**Proof.** Suppose  $(\mu^{(p)*}, \omega^{(p)*}, \pi^{(p)*}, u^{1p^*}, u^{2p^*})$  is the optimal solution of model (3) and there are  $\delta^{p*} > 0$ ,  $\delta'^p > 0$ , such that

$$\begin{cases} Z_{\delta^p}^p = ((1+\delta^p)z_o^p, (1+\delta^p)y_o^p), \delta^p \in (0, \delta^{p*}] \\ Z_{\delta'^p}^p = ((1-\delta'^p)z_o^p, (1-\delta'^p)y_o^p), \delta'^p \in (0, \delta^{p*}] \end{cases}$$

Since  $DMU_o$  is efficient in stage 2 of period  $p$ , we have  $\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p + u^{2p^*} = 0$ . In this case,

$$\begin{cases} P_{2\delta^p}^p = \mu^{(p)*}(1+\delta^p)y_o^p - \pi^{(p)*}(1+\delta^p)z_o^p + u^{1p^*} = (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p)(1+\delta^p) + u^{2p^*} + \delta^p u^{2p^*} - \delta^p u^{2p^*} = (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p + u^{2p^*})(1+\delta^p) - \delta^p u^{2p^*} = 0 \\ P_{2\delta'^p}^p = \mu^{(p)*}(1-\delta'^p)y_o^p - \pi^{(p)*}(1-\delta'^p)z_o^p + u^{1p^*} = (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p)(1-\delta'^p) + u^{2p^*} + \delta'^p u^{2p^*} - \delta'^p u^{2p^*} = (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p + u^{2p^*})(1-\delta'^p) + \delta'^p u^{2p^*} = 0 \end{cases}$$

Thus, if  $u^{2p^*} = 0$ , then,  $Z_{\delta^p}^p$  and  $Z_{\delta'^p}^p$  are efficient in stage 1 of period  $p$  and according to Definition 1,  $DMU_o$  in stage 2 of period  $p$  has CRS .

So too, for determining the type of RTS in stage 2 of  $DMU_o$  in whole time periods, theorem 6

is introduced by using the sign  $\sum_{p=1}^q u^{2p^*}$ .

**Theorem6.** Suppose  $DMU_o$  is efficient in stage 2 of  $q$  time periods, i.e  $E_o^{\text{II}} = 1$ ,

**6-i.** If  $\sum_{p=1}^q u^{2p^*} > 0$ ,  $DMU_o$  in stage 2 of  $q$  time periods has IRS .

**Proof.** Suppose  $(\mu^{(p)*}, \omega^{(p)*}, \pi^{(p)*}, u^{1p^*}, u^{2p^*})$  is the optimal solution of model (3) and there are  $\delta^{p*} > 0$ ,  $p=1, \dots, q$  such that,  $Z_{\delta^p}^p = ((1+\delta^p)z_o^p, (1+\delta^p)y_o^p)$ ,  $\delta^p \in (0, \delta^{p*}]$ . Since  $DMU_o$  is efficient in stage 2 of  $q$  time periods, we have  $\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p + u^{2p^*} = 0$ ,  $p=1, \dots, q$ . In this case,

$$\begin{aligned} P_{2\delta^p}^p &= \mu^{(p)*}(1+\delta^p)y_o^p - \pi^{(p)*}(1+\delta^p)z_o^p + u^{1p^*} = (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p)(1+\delta^p) + u^{2p^*} + \delta^p u^{2p^*} - \delta^p u^{2p^*} = (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p + u^{2p^*})(1+\delta^p) - \delta^p u^{2p^*} = \\ 0 - \delta^p u^{2p^*} &= -\delta^p u^{2p^*}, p=1, \dots, q \Rightarrow \sum_{p=1}^q P_{2\delta^p}^p = \sum_{p=1}^q -\delta^p u^{2p^*} \end{aligned}$$

Thus, if  $\sum_{p=1}^q u^{2p^*} > 0$ , then  $\sum_{p=1}^q P_{2\delta^p}^p < 0$ . Therefore,  $Z_{\delta^p}^p \in \text{int } T_2$ . This means that according to Definition 1,  $DMU_o$  in stage 2 over  $q$  time periods has IRS .

**6-ii.** If  $\sum_{p=1}^q u^{2p^*} < 0$ ,  $DMU_o$  in stage 2 of  $q$  time periods has DRS .

**Proof.** It is similar to the proof of (6-i).

**6-iii.** If  $\sum_{p=1}^q u^{2p^*} = 0$ ,  $DMU_o$  in stage 2 of  $q$  time periods has CRS .

**Proof.** It is similar to the proof of (6-i).

In order to recognize the type of RTS in whole system of period  $p$ , the following theorem is introduced:

**Theorem7.** Suppose  $DMU_o$  is efficient in period  $p$ , i.e.  $E_o^{s(p)} = E_o^{l(p)} = E_o^{\text{II}(p)} = 1$ ,

**7-i.** If  $(u^{1p^*} + u^{2p^*}) > 0$ ,  $DMU_o$  has IRS .

**Proof.** Suppose  $(\mu^{(p)*}, \omega^{(p)*}, \pi^{(p)*}, u^{1p*}, u^{2p*})$  is the optimal solution of model (3) and there is  $\delta^{p*} > 0$  such that  $Z^p_{\delta^p} = ((1+\delta^p)x_o^p, (1+\delta^p)z_o^p, (1+\delta^p)y_o^p)$ ,  $\delta^p \in (0, \delta^{p*}]$ . Since  $DMU_o$  is efficient in period  $p$ , we have:  $\begin{cases} \pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p + u^{1p*} = 0 \\ \mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p + u^{2p*} = 0 \end{cases}$ . In this case,

$$\begin{cases} P^p_{1\delta^p} = \pi^{(p)*}(1+\delta^p)z_o^p - \omega^{(p)*}(1+\delta^p)x_o^p + u^{1p*} = (\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p)(1+\delta^p) + \\ u^{1p*} + \delta^p u^{1p*} - \delta^p u^{1p*} = (\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p + u^{1p*})(1+\delta^p) - \delta^p u^{1p*} = 0 - \delta^p u^{1p*} = -\delta^p u^{1p*} \\ \\ P^p_{2\delta^p} = \mu^{(p)*}(1+\delta^p)y_o^p - \pi^{(p)*}(1+\delta^p)z_o^p + u^{1p*} = (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p)(1+\delta^p) + \\ u^{2p*} + \delta^p u^{2p*} - \delta^p u^{2p*} = (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p + u^{2p*})(1+\delta^p) - \delta^p u^{2p*} = 0 - \delta^p u^{2p*} = -\delta^p u^{2p*} \\ \Rightarrow P^p_{1\delta^p} + P^p_{2\delta^p} = -\delta^p(u^{1p*} + u^{2p*}) \end{cases}$$

Thus, if  $u^{1p*} + u^{2p*} > 0$ , then  $P^p_{1\delta^p} + P^p_{2\delta^p} < 0$ . Hence  $Z^p_{\delta^p} \in \text{int } T$  and according to Definition 1,  $DMU_o$  in period  $p$  has IRS .

**7-ii.** If  $(u^{1p^*} + u^{2p^*}) < 0$ ,  $DMU_o$  has DRS .

**Proof.** Suppose  $(\mu^{(p)*}, \omega^{(p)*}, \pi^{(p)*}, u^{1p*}, u^{2p*})$  is the optimal solution of model (3), and for period  $p$ , there is  $\delta^{p*} > 0$  and  $Z^p_{\delta^p} = ((1-\delta^p)x_o^p, (1-\delta^p)z_o^p, (1-\delta^p)y_o^p)$ ,  $\delta^p \in (0, \delta^{p*}]$ . Since  $DMU_o$  is efficient in period  $p$ , we have:

$$\begin{cases} \pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p + u^{1p*} = 0 \\ \mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p + u^{2p*} = 0 \end{cases}$$

In this case,

$$\begin{cases} P^p_{1\delta^p} = \pi^{(p)*}(1-\delta^p)z_o^p - \omega^{(p)*}(1-\delta^p)x_o^p + u^{1p*} = (\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p)(1-\delta^p) + \\ u^{1p*} + \delta^p u^{1p*} - \delta^p u^{1p*} = (\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p + u^{1p*})(1-\delta^p) + \delta^p u^{1p*} = 0 + \delta^p u^{1p*} = \delta^p u^{1p*} \\ \\ P^p_{2\delta^p} = \mu^{(p)*}(1-\delta^p)y_o^p - \pi^{(p)*}(1-\delta^p)z_o^p + u^{1p*} = (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p)(1-\delta^p) + \\ u^{2p*} + \delta^p u^{2p*} - \delta^p u^{2p*} = (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p + u^{2p*})(1-\delta^p) - \delta^p u^{2p*} = 0 + \delta^p u^{2p*} = \delta^p u^{2p*} \\ \Rightarrow P^p_{1\delta^p} + P^p_{2\delta^p} = \delta^p(u^{1p*} + u^{2p*}) \end{cases}$$

Thus, if  $(u^{1p*} + u^{2p*}) < 0$ , then  $P^p_{1\delta^p} + P^p_{2\delta^p} < 0$ . Therefore,  $Z^p_{\delta^p} \in \text{int } T_p$  and according to Definition 1,  $DMU_o$  in period  $p$  has DRS .

**7-iii.** If  $u^{1p*} = u^{2p*} = 0$ ,  $DMU_o$  has CRS .

**Proof.** Suppose  $(\mu^{(p)*}, \omega^{(p)*}, \pi^{(p)*}, u^{1p*}, u^{2p*})$  is the optimal solution of model (3) and there are  $\delta^{p*} > 0$ ,  $\delta^{p*} > 0$ , such that

$$\begin{cases} Z^p_{\delta^p} = ((1+\delta^p)x_o^p, (1+\delta^p)z_o^p, (1+\delta^p)y_o^p), \delta^p \in (0, \delta^{p*}] \\ Z^p_{\delta^p} = ((1-\delta^p)x_o^p, (1-\delta^p)z_o^p, (1-\delta^p)y_o^p), \delta^p \in (0, \delta^{p*}] \end{cases}$$

Since  $DMU_o$  is efficient in period  $p$ , we have:  $\begin{cases} \pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p + u^{1p*} = 0 \\ \mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p + u^{2p*} = 0 \\ \mu^{(p)*}y_o^p - \omega^{(p)*}x_o^p + u^{1p*} + u^{2p*} = 0 \end{cases}$

In this case,

$$\left\{
 \begin{aligned}
 P_{1\delta^p}^p &= \pi^{(p)*}(1+\delta^p)z_o^p - \omega^{(p)*}(1+\delta^p)x_o^p + u^{1p*} = (\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p)(1+\delta^p) + u^{1p*} + \delta^p u^{1p*} - \delta^p u^{1p*} = \\
 &(\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p + u^{1p*})(1+\delta^p) - \delta^p u^{1p*} = 0 \\
 P_{2\delta^p}^p &= \mu^{(p)*}(1+\delta^p)y_o^p - \pi^{(p)*}(1+\delta^p)z_o^p + u^{1p*} = (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p)(1+\delta^p) + \\
 &u^{2p*} + \delta^p u^{2p*} - \delta^p u^{2p*} = (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p + u^{2p*})(1+\delta^p) - \delta^p u^{2p*} = 0 \\
 \Rightarrow P_{1\delta^p}^p + P_{2\delta^p}^p &= 0 \\
 P_{1\delta^{*p}}^p &= \pi^{(p)*}(1-\delta^{*p})z_o^p - \omega^{(p)*}(1-\delta^{*p})x_o^p + u^{1p*} = (\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p)(1-\delta^{*p}) + \\
 &u^{1p*} + \delta^{*p} u^{1p*} - \delta^{*p} u^{1p*} = (\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p + u^{1p*})(1-\delta^{*p}) + \delta^{*p} u^{1p*} = 0 \\
 P_{2\delta^{*p}}^p &= \mu^{(p)*}(1-\delta^{*p})y_o^p - \pi^{(p)*}(1-\delta^{*p})z_o^p + u^{1p*} = (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p)(1-\delta^{*p}) + \\
 &u^{2p*} + \delta^{*p} u^{2p*} - \delta^{*p} u^{2p*} = (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p + u^{2p*})(1-\delta^{*p}) + \delta^{*p} u^{2p*} = 0 \\
 \Rightarrow P_{1\delta^{*p}}^p + P_{2\delta^{*p}}^p &= 0
 \end{aligned}
 \right.$$

Therefore, if  $u^{1p*} = u^{2p*} = 0$  then,  $Z_{\delta^p}^p, Z_{\delta^{*p}}^p$  are efficient in period  $p$  and according to Definition 1,  $DMU_o$  in period  $p$  has CRS.

Theorem 8 use the sign  $(\sum_{p=1}^q u^{1p*} + \sum_{p=1}^q u^{2p*})$  and Definition 1 to determine the type of RTS of  $DMU_o$  in whole time periods:

**Theorem8.** Suppose  $DMU_o$  is efficient over  $q$  time periods, i.e  $E_o^s = E_o^I = E_o^{II} = 1$ ,

**8-i.** If  $(\sum_{p=1}^q u^{1p*} + \sum_{p=1}^q u^{2p*}) > 0$ ,  $DMU_o$  over  $q$  time periods has IRS.

**Proof.** Suppose  $(\mu^{(p)*}, \omega^{(p)*}, \pi^{(p)*}, u^{1p*}, u^{2p*})$  is optimal solution of model (3) and there are  $\delta^{p*} > 0$ ,  $p = 1, \dots, q$  such that  $Z_{\delta^p}^p = ((1+\delta^p)x_o^p, (1+\delta^p)z_o^p, (1+\delta^p)y_o^p)$ ,  $\delta^p \in (0, \delta^{p*}]$ . Since  $DMU_o$  is efficient over  $q$  time periods, we have:

$$\left\{
 \begin{aligned}
 \pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p + u^{1p*} &= 0, p = 1, \dots, q \\
 \mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p + u^{2p*} &= 0, p = 1, \dots, q \\
 \mu^{(p)*}y_o^p - \omega^{(p)*}x_o^p + u^{1p*} + u^{2p*} &= 0, p = 1, \dots, q
 \end{aligned}
 \right.$$

In this case,

$$\left\{
 \begin{aligned}
 P_{1\delta^p}^p &= \pi^{(p)*}(1+\delta^p)z_o^p - \omega^{(p)*}(1+\delta^p)x_o^p + u^{1p*} = (\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p)(1+\delta^p) + \\
 &u^{1p*} + \delta^p u^{1p*} - \delta^p u^{1p*} = (\pi^{(p)*}z_o^p - \omega^{(p)*}x_o^p + u^{1p*})(1+\delta^p) - \delta^p u^{1p*} = 0 - \delta^p u^{1p*} = -\delta^p u^{1p*} \\
 P_{2\delta^p}^p &= \mu^{(p)*}(1+\delta^p)y_o^p - \pi^{(p)*}(1+\delta^p)z_o^p + u^{2p*} = (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p)(1+\delta^p) + \\
 &u^{2p*} + \delta^p u^{2p*} - \delta^p u^{2p*} = (\mu^{(p)*}y_o^p - \pi^{(p)*}z_o^p + u^{2p*})(1+\delta^p) - \delta^p u^{2p*} = 0 - \delta^p u^{2p*} = -\delta^p u^{2p*} \\
 P_{1\delta^p}^p + P_{2\delta^p}^p &= -\delta^p u^{1p*} - \delta^p u^{2p*} = -\delta^p(u^{1p*} + u^{2p*}), p = 1, \dots, q \\
 \Rightarrow \sum_{p=1}^q (P_{1\delta^p}^p + P_{2\delta^p}^p) &= \sum_{p=1}^q (-\delta^p(u^{1p*} + u^{2p*})) = -\sum_{p=1}^q \delta^p(u^{1p*} + u^{2p*})
 \end{aligned}
 \right.$$

Therefore, if  $(\sum_{p=1}^q u^{1p*} + \sum_{p=1}^q u^{2p*}) > 0$ , then  $\sum_{p=1}^q (P_{1\delta^p}^p + P_{2\delta^p}^p) < 0$  and thus

$Z_{\delta^p}^p \in \text{int } T, \delta^p \in (0, \delta^{p*}]$ . This means that according to Definition 1,  $DMU_o$  has *IRS*.

**8-ii.** If  $(\sum_{p=1}^q u^{1p*} + \sum_{p=1}^q u^{2p*}) < 0$ ,  $DMU_o$  over  $q$  time periods has *DRS*.

**Proof.** It is similar to the proof of (8-i).

**8-iii.** If  $\sum_{p=1}^q u^{1p*} = \sum_{p=1}^q u^{2p*} = 0$ ,  $DMU_o$  over  $q$  time periods has *CRS*.

**Proof.** It is similar to the proof of (8-i).

So, by using these theorems, it can be said that a multi-period two-stage system has *IRS* (or *DRS* or *CRS*) if and only if stage 1 and stage 2 have *IRS* (or *DRS* or *CRS*) in whole time periods. And if one stage has *IRS* and the other has *DRS* in each period  $p$  (or whole time periods), theorem 7 (or theorem 8) can identify RTS status of whole system in each period  $p$  (or whole time periods).

## 4 Case study

In this section, we will illustrate the proposed models with Taiwanese non-life insurance companies studied in Kao and Hwang [31] to compare the obtained results with their results. They surveyed the efficiency of 21 non-life insurance companies with the data in 2000, 2001, 2002 years. Each insurance companies can be viewed as *DMU* with two-stage structure. In this evaluation, inputs are "Operating expenses" and "Insurance expenses", intermediate products are "Direct written premiums" and "Reinsurance premiums". Also, "Underwriting profit" and "Investment profit" are considered as outputs.

### 4.1 Results of model (3)

The efficiencies of *DMUs* under the VRS assumptions based on the model (3), are reported in the following Table:

**Table 1.** Results of Model (3)

DMU	period	Overall efficiency	Efficiency of stage 1	Efficiency of stage 2
1	1	0.5287	0.9930	0.5325
	2	0.5841	0.9732	0.6002
	3	1	1	1
	Whole period	0.9665	0.9987	0.9678
2	1	0.9295	0.9862	0.9425
	2	0.6317	1	0.6317
	3	0.6246	1	0.6246
	Whole period	0.8939	0.9879	0.9048
3	1	1	1	1
	2	1	1	1
	3	1	1	1

	Whole period	1	1	1
4	1	0.6181	0.7931	0.7794
	2	0.6655	1	0.6655
	3	0.2946	0.8601	0.3425
	Whole period	0.6377	0.9761	0.6533
5	1	0.5641	0.9264	0.6089
	2	0.4873	0.7737	0.6289
	3	0.3953	0.7841	0.5041
	Whole period	0.5458	0.9050	0.6031
6	1	0.5656	0.8855	0.6388
	2	0.5952	0.8632	0.6895
	3	0.5068	0.7916	0.6403
	Whole period	0.5811	0.8568	0.6782
7	1	0.1365	0.9483	0.1439
	2	0.4312	1	0.4312
	3	0.2722	1	0.2722
	Whole period	0.4038	0.9969	0.4050
8	1	0.5800	0.8392	0.6912
	2	0.3922	0.8061	0.4866
	3	0.7789	0.7789	1
	Whole period	0.7496	0.7831	0.9572
9	1	0.3967	0.8796	0.4510
	2	0.3346	0.7791	0.4295
	3	0.3042	0.6914	0.4401
	Whole period	0.3882	0.8635	0.4496
10	1	0.8847	0.9778	0.9047
	2	0.7452	0.9851	0.7565
	3	0.7771	0.8836	0.8794
	Whole period	0.8709	0.9718	0.8962
11	1	0.8577	0.9583	0.8951
	2	0.9193	0.9193	1
	3	0.4115	0.8495	0.4844
	Whole period	0.8683	0.9154	0.9486
12	1	0.6008	0.8837	0.6799
	2	0.3863	0.7555	0.5114
	3	0.3743	0.6571	0.5679
	Whole period	0.5759	0.8630	0.6673
13	1	1	1	1
	2	1	1	1
	3	0.6762	1	0.6762
	Whole period	0.9800	1	0.9800
14	1	0.4572	0.8198	0.5577
	2	0.3510	0.8866	0.3959
	3	0.3710	0.9283	0.3996
	Whole period	0.4506	0.8260	0.5456
15	1	0.8432	0.9623	0.8762
	2	0.7441	0.7441	1
	3	0.6559	0.6559	1
	Whole period	0.8258	0.9311	0.8869
16	1	0.5167	0.8416	0.6140
	2	0.5304	0.8445	0.6280
	3	0.3028	0.7492	0.4042
	Whole period	0.5167	0.8416	0.6140
17	1	0.6509	1	0.6509
	2	0.3808	1	0.3808
	3	0.9196	1	0.9196
	Whole period	0.9151	1	0.9151

18	1	0.6473	0.8061	0.8030
	2	0.8349	0.8349	1
	3	0.6721	0.6721	1
	Whole period	0.8334	0.8341	0.9992
19	1	1	1	1
	2	1	1	1
	3	1	1	1
	Whole period	1	1	1
20	1	0.8595	1	0.8595
	2	0.6838	1	0.6838
	3	0.0433	0.7773	0.0557
	Whole period	0.8574	0.9996	0.8578
21	1	0.8743	0.8743	1
	2	0.1173	0.6509	0.1802
	3	0.0994	0.6621	0.1501
	Whole period	0.8612	0.8706	0.9892

In Table 1, the columns 3, 4 and 5 indicate the overall efficiencies and efficiency of stages respectively. In period 1, *DMUs* 3,13,17,19,20 in stage 1 and *DMUs* 3,13,19,21 in stage 2 are efficient. Hence, *DMUs* 3,13,19 are overall efficient. Between inefficient *DMUs*, in whole system and stage 2 the highest efficiency belongs to *DMU*<sub>2</sub> and the lowest efficiency belongs to *DMU*<sub>7</sub>. Also, *DMU*<sub>4</sub>, *DMU*<sub>1</sub> have the best and the lowest efficiencies in stage 1 of period 1. It is clear that *DMUs* 3,13,19 are overall efficient in period 2. Then, *DMU*<sub>10</sub> has the best efficiency and *DMU*<sub>21</sub> has the lowest efficiency in stage 1 and stage 2 of period 2. In period 3, *DMUs* 1, 3, 19 are overall efficient. Between inefficient *DMUs*, *DMU*<sub>20</sub> has the worst efficiency in stage 2 and whole system. In period 3, the best efficiency in stage 2 and whole system belongs to *DMU*<sub>17</sub>. In stage 1, *DMU*<sub>14</sub>, *DMU*<sub>15</sub> have the highest and the lowest efficiency, respectively. In whole time periods, *DMUs* 3,19 are efficient, but all of *DMUs* are inefficient in Kao and Hwang model. Between inefficient *DMUs*, the highest and the lowest efficiencies belong to *DMU*<sub>1</sub>, *DMU*<sub>9</sub>, with scores 0.9665, 0.3882, respectively. In stage 1 *DMUs* 3,13,17,19 are efficient. Between inefficient *DMUs*, *DMU*<sub>20</sub>, *DMU*<sub>17</sub> have the best efficiency score in stage 1 and stage 2, respectively. Also, the lowest efficiency belongs to *DMU*<sub>8</sub> in stage 1 and *DMU*<sub>7</sub> in stage 2. Note that, efficient *DMUs* in Kao and Hwang model are efficient under our model. According to the Table 3, the overall efficiencies obtained from Kao and Hwang Model [31] (i.e  $E_{oCRS}$ ), is less than or equal the overall efficiencies obtained from Model (3), i.e  $E_{oCRS} \leq E_o^s$ . Also, Table 2 shows the type of return to scale for the VRS efficient *DMUs* in stage 1, stage 2 and system corresponding to each period and over 3 time periods:

**Table 2.** The type of *RTS*

DMU	Period	RTS(stage1)	RTS(stage2)	RTS (system)
1	1	-	-	-
	2	-	-	-
	3	<i>DRS</i>	<i>DRS</i>	<i>DRS</i>
	(Whole periods)	-	-	-
2	1	-	-	-
	2	-	-	-

	3 ( Whole periods)	<i>DRS</i> <i>DRS</i> <i>DRS</i> -	-	-
3	1 2 3 ( Whole periods)	<i>DRS</i> <i>DRS</i> <i>DRS</i> <i>DRS</i>	<i>CRS</i> <i>CRS</i> <i>DRS</i> <i>DRS</i>	<i>DRS</i> <i>DRS</i> <i>DRS</i> <i>DRS</i>
4	1 2 3 ( Whole periods)	- <i>IRS</i> - -	- - - -	- - - -
7	1 2 3 ( Whole periods)	- <i>DRS</i> <i>IRS</i> -	- - - -	- - - -
8	1 2 3 ( Whole periods)	- - - -	- - <i>DRS</i> -	- - - -
11	1 2 3 ( Whole periods)	- - - -	- - <i>DRS</i> -	- - - -
13	1 2 3 ( Whole periods)	<i>IRS</i> <i>DRS</i> <i>DRS</i> -	<i>DRS</i> <i>DRS</i> - -	<i>DRS</i> - - -
15	1 2 3 ( Whole periods)	- - - -	- <i>DRS</i> <i>DRS</i> -	- - - -
17	1 2 3 ( Whole periods)	<i>IRS</i> <i>IRS</i> <i>IRS</i> <i>IRS</i>	- - - -	- - - -
18	1 2 3 ( Whole periods)	- - - -	- <i>IRS</i> <i>DRS</i> -	- - - -
19	1 2 3 ( Whole periods)	<i>IRS</i> <i>IRS</i> <i>IRS</i> <i>IRS</i>	<i>IRS</i> <i>IRS</i> <i>DRS</i> <i>IRS</i>	<i>IRS</i> <i>IRS</i> <i>DRS</i> <i>IRS</i>
20	1 2 3 ( Whole periods)	<i>IRS</i> <i>IRS</i> -	- - -	- - -
21	1 2 3 ( Whole periods)	- - - -	<i>IRS</i> - - -	- - - -

In this Table, The columns 3, 4 and 5 indicate the type of RTS corresponding to stage 1, stage 2 and system in time periods 1, 2 and 3 and the whole time periods, respectively. As can be seen in the column 3,  $DMU_3$  has *DRS* in stage 1 of each period, thus based on the Theorem 4, this *DMU* has *DRS* in stage 1 over whole time periods. Also, this *DMU* has *CRS* in stage 2 of period 1 and 2 and *DRS* in stage 2 of period 3. Thus  $DMU_3$  has *DRS* in stage 2 over whole time periods. Since *DMU* has *DRS* in each period of whole system, hence,  $DMU_3$  has *DRS* in whole system over whole time periods.  $DMU_{19}$ , has *IRS* in stage 1, 2 of period 1, 2 and *IRS* in stage 1 of period 3 and *DRS* in stage 2 of period 3. Thus, in whole system, this *DMU* has *IRS* in period 1 and 2 and *DRS* in period 3. Therefore,  $DMU_{19}$  has *IRS* in whole system over whole time periods.  $DMU_{17}$  has *IRS* in each period and whole time periods. In period 1,  $DMU_{13}$  has *IRS* in Stage 1 and *DRS* in Stage 2, thus based on the Theorem4, this *DMU* has *DRS* in the whole system. Also,  $DMU_{20}$  in stage 1 of period 1 and 2 has *IRS* and  $DMU_{21}$  has *IRS* in stage 2 of period 1. In period 2, *DMUs* 2, 4, 7 have *DRS*, *IRS* and *DRS* in stage 1 and  $DMU_{15}$ ,  $DMU_{18}$  have *DRS* and *IRS*, respectively.  $DMU_1$  has *DRS* in stage 1, 2 of period 3, therefore, this *DMU* has *DRS* in the whole system. *DMUs* 2, 7, 13 have *DRS*, *IRS* and *DRS* in stage 1 of period 3. And also, *DMUs* 8, 11, 15, 18 have *DRS* in stage 2 of period 3. We can make the similar interpretations for other *DMUs*.

## 5 Conclusions

The traditional two-stage DEA models measure the efficiency of two-stage systems at the ascertained time, while the calculation of the efficiency of these systems is particularly crucial during the multi-period time. In this paper, we proposed a generalized model, to measure the general efficiency of a multi-period two-stage system under the VRS assumption so that the data substance is taken into account in varied time periods. We also decomposed the overall efficiency to the product of the efficiencies of stages in each period (and whole time periods). So, the efficiency in general (and that of the stages) in whole time periods was decomposed to the weighted average of the overall efficiency (and efficiencies of the stages) in each period. The proposed model determined the status of RTS in efficient DMUs in stage 1, 2 and the entire system in period  $p$  and over  $q$  time periods. The proposed model can identify sources of inefficiency by using the obtained efficiency decompositions. Eventually, we utilized a case of related to Taiwanese non-life insurance companies to illustrate the proposed model. For future study, one can generalize some models to measure the efficiency of a multi-period multi-stage system under the (VRS) and determine the type of returns to scale of each stage in period  $p$  and over the whole  $q$  time period. Moreover, further research on extending the proposed method to measure RTS of the same systems, in the presence of undesirable outputs is a motivating course for future research.

## References

1. Charnes, A., Cooper, W.W. & Rhodes, E. (1978). Measuring the efficiency of decision making units, European Journal of Operational Research 2, 429-444.

2. Seiford, L.M., & Zhu, J. (1999). Profitability and Marketability of the Top 55 US Commercial Banks, *Management Science* 45, 1270-1288.
3. Kao, C., & Hwang, S.N. (2008). Efficiency decomposition in two-stage data envelopment analysis: An application to non-life insurance companies in Taiwan, *European Journal of Operational Research* 185, 418–429.
4. Chen, Y., Cook, W.D., Li, N. & Zhu, J. (2009). Additive efficiency decomposition in two-stage DEA, *European Journal of Operational Research* 196, 1170–1176.
5. Wang, Y.M., & Chin, K.S. (2010). Some alternative DEA models for two-stage process, *Expert Systems with Applications*, 37, 8799–8808.
6. Wu, J., Zhu, Q., Chu, J., & Liang L, L. (2015). Two-Stage Network Structures with Undesirable Intermediate Outputs Reused: A DEA Based Approach, *Computational Economics* 46(3), 455–477.
7. Fei, Y., Bi, G., Song, W., & Luo, Y. (2019). Measuring the Efficiency of Two-Stage Production Process in the Presence of Undesirable Outputs, *Computational Economics* 54, 1343-1358.
8. Chu, J., Wu, J., Zhu, Q., An, Q., & Xiong, B. (2016). Analysis of China's Regional Eco-efficiency: A DEA two- stage Network approach with equitable efficiency decomposition, *Computational Economics* 54, 1263-1285.
9. Despotis, D.K., Sotiros, D., & Koronakos, G.R. (2016). Composition versus decomposition in two-stage network DEA: a reverse approach, *Journal of Productivity Analysis* 45, 71–87.
10. Wu, J., Zhu, Q., Ji, X., Chu, J., & Liang, L. (2016). Two-stage network processes with shared resources and resources recovered from undesirable outputs, *European Journal of Operational Research* 251(1), 182–197, 2016.
11. Guo, C., & Zhu, J. (2017). Non-cooperative Two-stage Network DEA Model: Linear vs. Parametric Linear, *European Journal of Operation Research*, 258(1), 398-400.
12. Izadikhah, M., Tavana, M., Caprio, D.D., Francisco, J., & Santos-Arteaga, F.J. (2018). A novel two-stage DEA production model with freely distributed initial inputs and shared intermediate outputs, *Expert Systems with Applications* 99(1), 213-230.
13. Xueqin, C., Yongjun, L., Feng, C. , & Liang, L. (2021). Efficiency evaluation of commercial banks based on two-stage DEA model with undesirable output, *Systems Engineering - Theory & Practice*, 41(3), 636-648.
14. Akbarian, D. (2021). Network DEA based on DEA-ratio, *Financ Innov* 7(73) <https://doi.org/10.1186/s40854-021-00278-6>.
15. Hosseini\_Monfared, S.N, Hosseinzadeh\_Lotfi, F., Mozaffari, M.R, & Rostamy\_Malkhalifeh, M. (2021). Classifying flexible and integer data in two-stage network data envelopment analysis, *Journal of Applied Research on Industrial Engineering*, 8(3), 270-291.
16. Amirteimoori, A. (2013). A DEA two-stage decision processes with shared resources, *Central European Journal of Operations Research* 21, 141–151. [14] Benicio, J., & De Mello, J.C. (2019). Different type of returns to scale in DEA, *Pesquisa Operacional* 39(2), 245-260.
17. Aviles-Sacoto, S., Cook, W.D., Imanirad, R., & Zhu, J. (2015). Two-stage network DEA: when intermediate measures can be treated as outputs from the second stage, *Journal of the Operational Research Society*, 1–10.
18. Chu, J., & Zhu, J. (2021). Production scale-based two-stage network data envelopment analysis, *European Journal of Operational Research*, 294(1), 283-294.
19. Hong, J., Tamakloe, R., Tak, J., & Park, D. (2020). Two-Stage Double Bootstrap Data Envelopment Analysis for Efficiency Evaluation of Shared-Bicycle Stations in Urban Cities. 2674(6)211-224.
20. Liu, W., Zhou, Z., Ma, C., Liu, D., & Shen, W. (2015). Two-stage DEA Models with undesirable input intermediate outputs, *Omega* 56, 74-87.
21. Yu, Y., & Shi, Q. (2014). Two - stage DEA model with additional input in the second stage and part of intermediate products as final output, *Expert Systems with Applications* 41(15), 6570–6574.
22. Zha, Y., & Liang, L. (2010). Two-stage cooperation model with input freely distributed among the stages, *European Journal of Operational Research* 205,332–338.
23. Portela, M.C.S., Camanho, A.S., & Borges, D. (2012). Performance assessment of secondary schools: The snapshot of a country taken by DEA, *Journal of the Operational Research Society* 63, 1098–1115.
24. Kao, C., & Liu, S.T. (2014). Multi-period efficiency measurement in data envelopment analysis: The case of Taiwanese commercial banks, *Omega* 47, 90–98.
25. Razavi Hajiagha, H., Hashemi, S.H., Mahdiraji, H.A., & Azadel, J. (2015). Multi-period data envelopment analysis based on Chebyshev inequality bounds, *Expert Systems with Applications* 42(21), 7759–7767.

26. Bansel, P., & Mehra, A. (2018). Multi-period additive efficiency measurement in data envelopment analysis with non-positive and undesirable data, *Opesearch*, 55, 642-661.
27. Jahani Sayyad Noveiri, M., & Kordrostami, S. (2018). Detecting the multi-period performance and efficiency changes of systems with undesirable outputs, *Discrete Mathematics, Algorithms and Applications* 10(3).
28. Tamatam, R., Dutta, P., Dutta, G., & Lessmann, S. (2019). Efficiency analysis of Indian banking industry over the period 2008–2017 using data envelopment analysis, *Benchmarking: An International Journal*, 26(8), 2417-2442.
29. Kordrostami, S., & Jahani Sayyed Noveiri, M. (2017). Evaluating the efficiency of firms with negative data in multi-period systems, *International Journal of Industrial Mathematics* 9(1), 27-35.
30. Kordrostami S., & Jahani Sayyed Noveiri, M. (2017). Evaluating the multi-period systems efficiency in the presence of fuzzy data, *Fuzzy Information and Engineering* 9(3), 281-298.
31. Kao, C., & Hwang, S.N. (2014). Multi-period efficiency and Malmquist productivity index in two-stage production systems, *European Journal of Operational Research* 232, 512–521.
32. Esfidani, S., Hosseinzadeh Lotfi, F., Razavyan, S., & Ebrahimnejad, A. (2018). Efficiency changes index in the network data envelopment analysis with non-radial model, *Asian-European Journal of Mathematics* 13(1).
33. Tohidnia, S., & Tohidi, G. (2019). Estimating multi-period global cost efficiency and productivity changes of systems with network structures, *Journal of Industrial Engineering International* 15, 171-179.
34. Zhou, X., Xu, Z., Chai, J., Yao, L., Wang, S., & Lev, B. (2019). Efficiency evaluation for banking systems under uncertainty: A multi-period three-stage DEA model, *Omega* 85, 68-82.
35. Esmaeilzadeh, A., & Kazemi Matin, R. (2019). Multi-period efficiency measurement of network production systems, *Measurement*, 134, 835-844.
36. Banker, R.D., & Thrall, R.M. (1992). Estimation of returns to scale using data envelopment Analysis, *European Journal of Operational Research* 62(1), 74–84.
37. Färe, R., & Grosskopf, S. (1994). Estimation of returns to scale using data envelopment analysis: A Comment, *Journal of Operational Research* 79, 379-382.
38. Khodabakhshi, M., Gholami, Y., & Kheirollahi, H. (2010). A additive model approach for estimating returns to scale in imprecise data envelopment analysis, *Applied Mathematical Modelling* 34, 1247– 1257.
39. Banker, R.D., Charnes, A., & Cooper, W.W. (1984). Some models for estimating technical and scale efficiencies in data envelopment analysis, *Management Science* 30, 1078–1092.
40. Fanati Rashidi, S. (2019). Determination of Right/Left return to Scale in Two-Stage Processes Based on Dual Simplex. *Int. J. Data Envelopment Analysis (ISSN 2345-458X)* 7(3), 2019.
41. Gerami, J. (2020). Return to scale in two-stage networks based on two different approaches. 10.22105/DMOR.2020.103204.
42. Jahanshahloo, G.R. & Khodabakhshi, M. (2003). Using input-output orientation model for determining most productive scale size in DEA, *Applied Mathematics and Computation* 146, 849-855.
43. Seiford, L.M., & Zhu, J. (1999). An investigation of returns to scale in Data Envelopment Analysis, *Omega* 27, 1-11.
44. Soleimani-damaneh, M., Jahanshahloo, G.R., Mehrabian, S., & Hasannasab, M. (2010). Returns to scale and scale elasticity in the presence of weight restrictions and alternative solutions, *Knowledge Based System* 23, 86-93.
45. Soleimani-damaneh, M. (2012). On a basic definition of returns to scale, *Operations Research Letters* 40(24), 144-147.
46. Wei, Q.L., & Yan, H. (2004). Congestion and returns to scale in data envelopment analysis, *European Journal of Operational Research* 153, 641-660.
47. Krivonozhko, V.E., orsund, F.R., & Lychev, A.V. (2012). Returns-to-scale properties in DEA models: The fundamental role of interior points, *Journal of Productivity Analysis* 38, 121-130.
48. Benicio, J., & De Mello, J.C. (2019). Different type of returns to scale in DEA, *Pesquisa Operational* 39(2), 245-260.
49. Khaleghi, M., Jahanshahloo, G.R., Zohrebandian, M., & Hosseinzadeh Lotfi, F. (2012). Returns to scale and scale elasticity in two-stage DEA, *Mathematical and Computational Applications*, 17(3), 193-202.
50. Zhang, Q., & Yang, Z. (2015). Returns to scale of two-stage production process, *Computers and Industrial Engineering* 90, 259-268.
51. Fakhr Mousavi, S.M, Amirteimoori, A., Kordrostami, S., & Vaez-Ghasemi , M. (2021). Non-radial two-stage network DEA model to estimate returns to scale, *Journal of Modelling in Management*, ISSN: 1746-5664.

52. Yang, J., & Fang, L. (2022). Average lexicographic efficiency decomposition in two-stage data envelopment analysis: an application to China's regional high-tech innovation systems. *Ann Oper Res* 312, 1051–1093 (2022). <https://doi.org/10.1007/s10479-021-04427-z>.
53. Hosseinzadeh Lotfi F., Sanei M., Hosseinzadeh A., Niroomand S., & Mahmoodirad A. (2023). Uncertainty in Data Envelopment Analysis. *Fuzzy and Belief Degree-Based Uncertainties*, 1st Edition, 9780323994453.
54. Yu X. (2023). An assessment of the green development efficiency of industrial parks in China: Based on non-desired output and non-radial DEA model. *Structural Change and Economic Dynamics*, 66, 81-88.
55. Patyal V.S., Kumar R., Lamba K., & Sunil Maheshwari S. (2023). Performance evaluation of Indian electricity distribution companies: An integrated DEA-IRP-TOPSIS approach. *Energy Economics*, 106796.
56. Wan L., Zhang L., Chiu Y.H., Pang Q., Qian Luo Q., & Zhen Shi Z. (2023). A bootstrapping dynamic two-stage SBM model: An application to assess industrial water use and health risk systems. *Science of the Total Environment*, 164813.
57. Zhang X., Xia Q., & Wei F. (2023). Efficiency evaluation of two-stage parallel-series structures with fixed-sum outputs: An approach based on SMAA and DEA. *Expert Systems with Applications*, 227, 120264.