## **Original Article**

# Management evaluation of public hospital units expenditures on infections with the use of quantitative analysis methods

Marios Tsakas

Msc, PhD in Business Administration

#### Abstract

The control of healthcare costs as well as the means for this achievement is a multifaceted problem for governments all over the world.

The aim of this work is to determine the areas of activity of 16 Greek Public Hospital Units (H.U.), which present problems regarding their performance and suggest sufficient solutions.

The **method** used for this study was quantitative analysis methods and especially the application of Data Envelopment Analysis (D.E.A.) in the 16 H.U.

**Results** : According to the results, information was provided to their managers, concerning: (i) the assessment of the sources of management pathogenesis per H.U., (ii) the essential information about the mapping out of 'the best utilization of financial resources' by H.U. administrations and (iii) the evaluation criteria of H.U.' administrations. The derived information provided basic guidelines about the creation of an appropriate policy plan per H.U., which should be applied by their administrations in combination with a set of measures that need to be undertaken in order to promote efficiency.

Keywords: Healthcare Cost, Quantitative Analysis Methods, Data Envelopment Analysis, Variable Expenditures.

Corresponding author: Marios Tsakas 62<sup>nd</sup> Rizountos st., 16 777 Ellinikon, Attica, Greece tel:+30 210 99 22 160 email: mtsakas@gmail.com

## Introduction

ealth care system in Greece is dominated by the National Health Service (NHS), a compulsory social insurance and a voluntary private health insurance system. The NHS provides overall

coverage to the population operating on the principles of equity, social cohesion and equal access to health services for all. In these terms, citizens are not directly dependent on a specific healthcare

but institution. thev are free to choosebetween a variety of healthcare units depending on the type of treatment they wish to follow and the region they resident<sup>1</sup>. Nevertheless, the Greek Ministry of Health takes the general decisions concerning the national health strategy and the relative health policy issues within the corresponding institutions and following the relative legislation. Compromising with this environment, Greek public H.U. operate within a framework characterized by limited economic resources, a restricted number of beds and а geographically unequal distribution of both personnel and patients<sup>2,3</sup>. For example, in the greater Athens area and for the year 2000, there were 6.4 hospital beds per 1000 citizens, while the corresponding ratio in Central Greece was 1.2 beds per 1000 citizens<sup>2</sup>.

In particular, over a hundred and public H.U. thirty operate in Greece nowadays. The level of equipment is not satisfactory, despite the modernisation which has taken place over the last two decades, since the H.U. usually cannot fully fulfil the needs of patients for diagnosis and inability treatment, that leads the population to the reliable assistance of the private sector. The sources of funding for the public H.U. are the state budget (74%), fees (13%) and private or other sources (13%).

The efficiency of hospitals has traditionally been measured by means of ratio analysis (cost per day, cost per patient, etc.) and econometric methods. Despite the fact that Ratio analysis always gives significant information concerning H.U. performance in a distributed system, this method presents number of а inaccuracies<sup>4,5,6</sup>. In particular, each ratio is limited to only one input and one output factor, making rather difficult to compromise with cases where multiple outputs are produced using multiple inputs. Moreover, the use of different ratios for the same H.U. usually gives different results. For example a H.U. may be presented as quite efficient with the use of ratio A, while it may be presented inefficient with the use of ratio B.

On the other hand, econometric methods are more accurate compared to the ratio methods, mainly because their model takes into account the inter-polarity between a number of hospital inputs and outputs. In these terms and during the last years, the estimation of the efficiency of H.U., is made with the use of DEA<sup>7</sup>, which conducts an analysis for all H.U. inputs and outputs<sup>8-17</sup>. al.<sup>18</sup>, and Chang<sup>19</sup> Banker et applied econometric analysis and DEA to obtain a comparative evaluation of the relative efficiency of hospitals. Thanassoulis et al.<sup>20</sup>, applied DEA to assess units providing perinatal care in England and to estimate performance targets for them. Ozcan and Lynch<sup>21</sup> applied DEA, while Lynch and Ozcan<sup>22</sup> used DEA and logistic regression to determine if technical efficiency is related to rural hospitals closure.

The investigation of expenditure management in H.U. which expertise in the treatment of infections is of great concern, due to the fact that recent studies have proved that more than 12% of the patients present infections while they are treated<sup>30</sup>. Mismanagement in H.U. is an issue which needs special care, especially in the field of variable expenditures. The application of quantitative analysis, in order to answer the auestion of the 'appropriate' or 'inappropriate' management of financial resources used for infections treatment, is applicable to the comparative evaluation of H.U.' administrations, as far as the extent of the efficient utilization of variable expenditures is concerned.

The questions that will be answered by the application of the comparative evaluation of H.U. and will lead to the essential information about the proper management of the particular variable expenditures are the following:

- 1) Which is the H.U. that succeeds in perfectly utilizing its variable expenditures and as a result is the benchmark for the Administrations of the rest H.U.?
- 2) In what extent is the management of all as well as individual variable

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expenditures on infections treatment 'inappropriate'?

3) In what extent is each individual category of expenditures 'responsible' for the final comparative evaluation?

## Method and material

**Data Sources :** Data availability and accuracy is significant as it directly affects the which concern the conclusions H.U. efficiency. It is the purpose of this study to provide the appropriate conditions by using a comparative analysis of 16 Greek public H.U for the treatment of hospital infections<sup>23</sup>. The research is based on data collected from official public sources<sup>24-30</sup> and on data published in Yearbook of Health (1994) by Greek Ministry of Health<sup>26</sup>. The database of this study was partially covered from data given by Greek National Statistical Service for the decade 1992-2002 and from health data provided by the OECD (Organization for Economic Co-operation and Development) for the year 2002. The data were also combined with primarily collected data directly from hospital units of the sample.

(DEA):The Development Analysis Data quantitative analysis method used in this work, is DEA, which is a technique for the evaluation of the efficiency of a number of producers or decision making units<sup>7, 31-35</sup>. DEA works by estimating a piece-wise linear envelopment surface, known as the best practice frontier<sup>35</sup>. Despite its limitations<sup>34,36</sup>, the DEA model has several important advantages over parametric and econometric approaches. Two of the most important are, primarily the flexibility of not imposing a particular functional form on the production frontier<sup>32-34</sup> and secondly, the ability to handle multiple-output, multipleinput technologies in a straightforward way, which is considered an important feature when assessing efficiency in public sector activities<sup>32</sup>. For a review of DEA health care studies see Hollingsworth et al.<sup>37</sup>, Ozcan et al.<sup>38</sup>, and Chilingerian and Sherman<sup>39</sup>. Several areas of application other include hospitals<sup>19,33,35,38-42</sup>, perioperative services<sup>35</sup>, surgical operating rooms<sup>44</sup>, and physicians<sup>45</sup>.

This study extends the use of DEA in health care to H.U. for the infections treatment. The analysis provides detailed information at the level of Greek units' performance that provides health services on population of the urban area of the country (Greater Athens Area - GAA). This level of detail is necessarv for policymakers to make decisions on which individual units should undergo changes. Low efficiency is usually related to excess resources. Thus, the model can be used to explore the effect on efficiencv of decreasing input resources. The DEA model can be used to explore some of the underlying reasons for inefficiency.

Input and Output Definition: In order to execute a DEA assessment for a group of units, an appropriate input set is necessary to be defined, which will reflect the resources used by the units and an output set of the results obtained<sup>32,36,39</sup>. In order to estimate the degree comparative of utilization of the financial resources, which are used by the units of this sample and can be defined as approximate factors of infections,  $DEA^{33,44,45,46}$  was used by applying three assumptions, as far as the structure of inputs and outputs is concerned. In particular, the following inputs were used:

- Expenditures on antiseptics
- Expenditures on antibiotics
- Expenditures on laboratory examinations which refer only to infections treatment.

Critical results have been drawn by recent studies, indicating that a) expenditures on antiseptics, b) antibiotics and c) laboratory examinations for infections treatment, constitute approximately 80% of the total variable expenditures for infection treatment<sup>30</sup>.

Correspondingly, the following outputs were used:

- 1. The number of patients for infections
- 2. The number of inpatient days
- 3. The cumulative result of the number of patients and the number of inpatient days

It is the purpose of the use of three different DEA scenarios, to compare their

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results and possibly confirm the exported conclusions.

The reasons why these inputs and outputs were selected are the following:

- 1. Operation (non variable) costs such as salaries of medical and administrative personnel, equipment support e.t.c, were not used as inputs, because no flexibility is offered, by the legal framework of the Greek public H.U., concerning suggestion for their possible improvement. Thus, a possible conclusion suggesting reduction of personnel or closure of a whole department would not be applicable due to the existing framework.
- 2. On the contrary, variable expenditures readjusted in can be case mismanagement is noticed and possible solutions may be proposed as an alternative.
- 3. Finally, these specific outputs are widely used in comparative evaluations of public H.U. with the use of DEA, while the corresponding inputs refer to special categories of variable expenditures, which are strongly related to hospital infections.

As a result, DEA was applied in three scenarios concerning evaluating the comparative utilization of the specific financial resources used by the 16 H.U. of the sample. The above-mentioned data derive from the activity of the 16 H.U. in 2006.

Sample selection: The H.U. that constitute the sample will be referred to as presented in table 1. The first 15 H.U. are operating in GAA and the last one in the Region. The sample consists mainly of GAA's H.U. due to the fact that they receive approximately 40% of the country's cases. Furthermore, GAA is presumed as one of the most polluted regions of the country (and it is well known that hospital infections are strongly related to environmental pollution and especially indoor pollution). Finally, approximately 39% of the rest of the country patients usually visit GAA's HU in a constant basis.

e.	? 1: The constitution of sample C					
	a/a	Hospitals				
	1	H1				
	2	H2				
	3	H3				
	4	H4				
	5	H5				
	6	H6				
	7	H7				
	8	H8				
	9	Н9				
	10	H10				
	11	H11				
	12	H12				
	13	H13				
	14	H14				
	15	H15				
	16	H16				

# Table 1: The constitution of sample C

#### **Results and discussion**

DEA was used by applying three scenarios, as far as the structure of inputs and outputs is concerned. Table 2 summarizes the input/output characteristics of the three scenarios.

The results which are derived by the use of DEA in the three scenarios derive results refer to:

(a) the degree of the comparative evaluation of the production resources being used

(b) the contribution extent of the production resources being used to the whole comparative evaluation

(c) the inefficient production resources.

The implementation of DEA, with the use of the inputs and outputs described, led to the results presented in table 3 that concern the evaluation of H.U. of the sample.

Regarding the results derived from application of DEA for the three the alternate scenarios, considering as criterion the total utilization degree of inputs, the H.U. 14 and 15 present the most satisfactory operation and constitute model units or report units for the rest H.U. of the sample (see table 3).

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Table 2: Input / Output characteristics	; of	the
three DAE scenarios		

	-	-	-
	Scenario A	Scenario B	Scenario C
Input Expenditur es on	antiseptics antibiotics laboratory examinatio ns*	antiseptics antibiotics laboratory examinatio ns*	antiseptics antibiotics laboratory examinatio ns*
Output	The number of patients for infections	The number of inpatient days	The number of patients and the number of inpatient days

\* referring only to infections treatment

Table 3: Final comparative evaluation in accordance with DEA scenarios (Technical efficiency score %)

H.U.	А	В	С
H1	94.5	66.9	94.52
H2	33.4	40.7	40.70
H3	26.6	29.7	29.74
H4	23.4	23.1	23.77
H5	21.7	27.9	27.91
H6	30.1	45.8	45.80
H7	23.4	47.1	47.06
H8	60.8	50.5	60.77
H9	45.6	29.9	45.63
H10	41.8	35.0	41.77
H11	35.3	37.0	35.30
H12	73.3	57.0	73.25
H13	30.3	34.9	34.85
H14	100.0	100.0	100.00
H15	100.0	100.0	100.00
H16	32.6	100.0	100.00

Having as criterion the provided evaluations of the three DEA scenarios, a prioritization of the H.U. has been produced, which is presented in table 4. With the use of the complex prioritization the individual prioritization values of the three scenarios are co-estimated, producing a total value which characterizes each H.U. taking under consideration all the three cases.

Table 4: Prioritization of Hospital Units having as criterion the utilization degree of production resources

HOSPITALS	PRIORITIZATION SCENARIO		IN EACH	EACH COMPLEX PRIORITIZATION	
	А	В	Г	SUM*	PRIORITIZATION**
H1	2	2	2	6	2
H2	8	7	9	24	8
H3	11	10	12	33	12
H4	12	13	14	39	13
H5	15	12	13	40	14
H6	13	6	6	25	9
H7	14	5	5	24	8
H8	4	4	4	12	4
H9	5	11	7	23	7
H10	6	8	8	22	6
H11	7	14	10	31	11
H12	3	3	7	13	5
H13	10	9	11	30	10
H14	1	1	1	3	1
H15	1	1	1	3	1
H16	9	1	1	11	3

sum of the prioritizations of the three scenarios for each H.U.

\*\*prioritization which derives from the estimation of the sum values

Table 4 clearly indicates that H.U. (14) and (15) achieve a remarkable utilization of the production resources. On the other hand, H.U. and (4) present inefficient (5) utilization degrees of production resources, no matter which one of the three scenarios is applied.

## Specific Gravity of Individual Production Resources

The information concerning the contribution degree of inputs (production resources) being used, is important for the final comparative Special result. gravity on individual production resourses is the percentage contribution of each input in the determination of the efficiency score.

Thus, DEA analysis indicates that the inputs which contribute more than 50% to the final comparative evaluation are those presented in table 5. From the above-mentioned data it is clear that the expenditures on antibiotics are the most decisive and determinative

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factor of the final comparative evaluation in most H.U. of the sample.

**Table 5:** Number of Hospital Units, in which the individual inputs contribute more than 50% to the final comparative result.

				<u></u>
	Input Category			H9
DEA Scenario	Expenditures	Expenditures	Expenditures	onH10
	on Antiseptics	on Antibiotics	Laboratory Examinations	Total
А	3	7	5	
В	1	9	6	Cond
с	2	8	5	COIR

	Expenditures or		
Hospital Units	Antiseptics	Antibiotics	Laboratory Examinations
H1	62751	460859	_
H3	33301		_
H4	39229	133253	_
<u>H</u> 5	41578	_	_
H9	28079	_	_
onH10	21061	48459	_
Total	225999	642571	_
	TOTAL:868570		

# Conclusions

**Inefficient Production Resources** 

The existence of 'inefficient production resources' indicates 'management pathogenesis', as well as pathogenesis in expenditures (see table 6). This factor indicates the percentage of inputs which is not efficiently used and their absence would not affect the final efficiency score.

Table 6: Number of Hospital Units that present 'Inefficient Production Resources'

	Inefficient Production Resources			
DEA Scenario	Expenditures on Antiseptics	Expenditures on Antibiotics	Expenditures on Laboratory Examinations	
А	10	5	3	
В	10	1	3	
С	10	4	3	

From the above-mentioned data arises that the expenditures on antiseptics are presented in most H.U. as 'inefficient production resources', which indicates that the expenditures on antiseptics are important factor of management pathogenesis. Table 7 presents the amount of variable expenditures, which absence would not affect the final efficiency score.

Table 7: Variable expenditures that should not be spent

As far as the variable expenditures are concerned, the H.U. of this sample have to restrict the level of financial resources, which in absolute magnitudes and expenditures category are presented in table 7. As a result they would restrict their particular variable expenditures by 868.570 euros or by about 8%, in case they compromised their operation with the model-units of the sample.

In relation to the methodology used for the comparative evaluation of the H.U. of this sample, simply economic criteria were taken under consideration<sup>43</sup>. It is namely regarded that there are no particularities in the cases of infections. The only criterion reflecting the particularity of infections from medical point of view is the output of the number of inpatient days in combination with the number of patients.

The information arising from the investigation is:

a. The comparative evaluation made possible to point out the H.U. that operate in a 'model' way and at the same time it remarked the comparative efficiency of the rest of the units. Consequently, 14 out of 16 administrations of the particular sample presented problems regarding the utilization of financial resources that they manage, for the treatment of patients with infections. These findings are quite significant for the following reasons:

Firstly, they point out to the H.U.' administrations that they should reconsider or change the processes of evaluation of

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particular financial resources by taking under the corresponding consideration "model" administrations of the H.U. Secondly, useful information is provided for the state agencies, in order to establish the appropriate measures, in the frame of the present legislation. Bevond the abovementioned, the best financial resources' evaluation, provide quality upgraded nursing services.

b. The production resources, to which the efficiency level of the administration is attributed, are pointed out. Thus, H4 presents a comparative degree of evaluation in the order of 23%. Consequently, it is necessary to find the activity sector that does not work efficiently. The answer to this problem is given by the 14 H.U.' quantitative analysis. As a result, their administrations have to focus on the indicated activities, so as to take the appropriate measures. It is obvious that this information is guite useful even to the dominant H.U.' administration agencies, which have the responsibility to observe the evaluation degree on the whole as well as with regard to the individual financial resources for health care.

Valuable results emerge from c. the evaluation of utilization degree of each particular production resource, which is used as an 'input' in the application of DEA. Thus, for example H1 spends 460.859 € more than the permissible amount, as it utilizes the production resource 'financial resources for buying antibiotics' in an uneconomical way. The above-mentioned information is given according to the corresponding financial resources' evaluations of the 'model' H.U. (14), (15) presented in this sample.

In conclusion, it is possible to define the number of patient or inpatient days that the H.U. of the particular sample should supply, in order to achieve excellent utilization degree of their production resources. The 'best policy plan' that has to be adopted by each one of the 14 H.U. of the sample, having as benchmark H.U. 14 and 15, which are assumed as the best-practice H.U. concerning the management of the particular financial resources, is clearly provided.

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