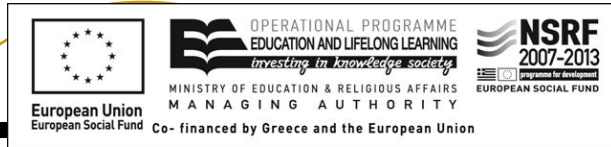


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# Primary health care planning using DEA and location analysis

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11th Meeting of Multicriteria Decision Analysis**

# Presentation Outline

- Background information
- Issues to consider
  - Equity
  - Quality of care
  - Efficiency
- Combined DEA-LA model
- Case study: Health Centres in the Peloponnese
- Conclusions

# Background information

- Extensive reforms in the organization and delivery of health services
- Major reform in Greece in the 1980's
- Objective: increase equity
- Result: establishment of Health Centres (HCs)

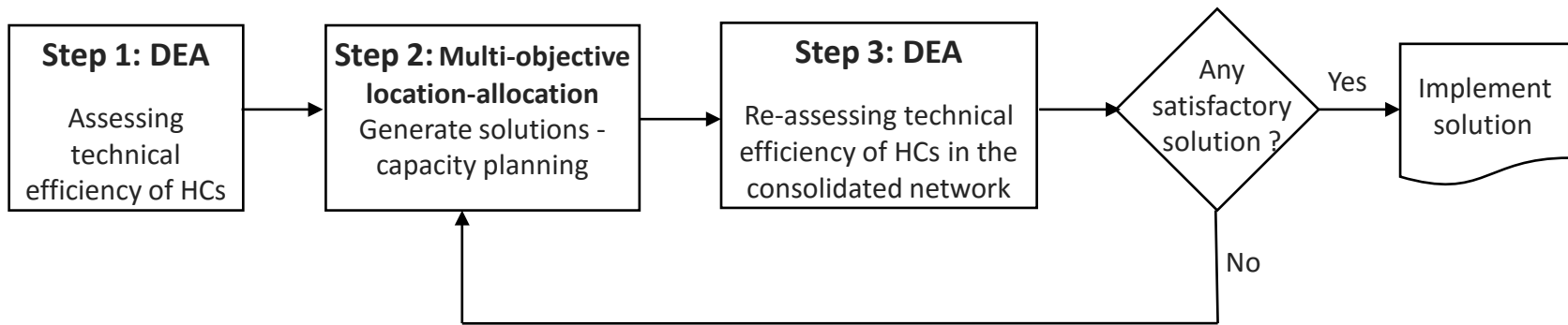
# Background information/2

- Characteristics of HCs
  - First contact point with NHS
  - Actual performance has fallen short of expectations
  - Lack of managerial and financial autonomy
  - Large differences across regions
- Demographic changes
- Need to reform
  - Assign to HCs financial and administrative responsibilities
  - Introduce a fair system for resource allocation

# Issues to Consider

- *Option demand*: a HC covers all of the population within its catchment area
- Performance of HCs is affected by their location
- The effect of location is alleviated by the range of services
- Objectives of the paper:
  - To evaluate the effectiveness of past location decisions
  - To identify the required services in HCs located within the region
  - To establish which HCs should be upgraded, which ones should provide basic vital services and which ones should close

# Overview of the planning process



## ■ DEA Inputs and Outputs:

Inputs	Outputs
$I_1$ : Number of doctors	$O_1$ : Medical exams
$I_2$ : Number of nurses	$O_2$ : Laboratory tests
$I_3$ : Treatment population (non discretionary)	$O_3$ : Transfers

# The DEA model – Envelopment, input oriented

Indices:

- h: discretionary inputs
- f: non discretionary inputs
- r: outputs
- k: HC under evaluation

$$\begin{aligned} & \min \quad \theta \\ \text{s.t.} \quad & \sum_j \lambda_j x_{hj} \leq \theta x_{hk} \quad \text{for all } h \\ & \sum_j \lambda_j x_{fj} \leq x_{fk} \quad \text{for all } f \\ & \sum_j \lambda_j y_{rj} \geq y_{rk} \quad \text{for all } r \\ & \lambda_j \geq 0 \quad \text{for all } j \\ & \theta \text{ free} \end{aligned}$$

# Combined DEA-LA model

- Notation:
  - $I$ : set of population centres
  - $J_1$ : set of HCs locations
  - $J_2$ : set of hospital locations
  - $J = J_1 \cup J_2$
  - $d_{ij}$ : distance between  $i$  and  $j$
  - $c_{\min}$ : minimum HC capacity
  - $d_{\max}$ : maximum distance
  
  - $f_{ij} = 1$ , if  $d_{ij} < d_{\max}$
  - $f_{ij} = 0$ , otherwise



# Combined DEA-LA model/2

$$\min \sum_{i \in I} \sum_{j \in J} w_i d_{ij} x_{ij} + M \cdot \sum_{k \in J_1} D_k^-$$

$$\max \frac{\sum_{k \in J_1} \text{efficiency}_k \cdot y_k}{\sum_{k \in J_1} y_k}$$

s.t. Demand is satisfied (1)

Assignment to HCs (2)

Assignment to hospitals (3)

Minimum capacity constraint (4)

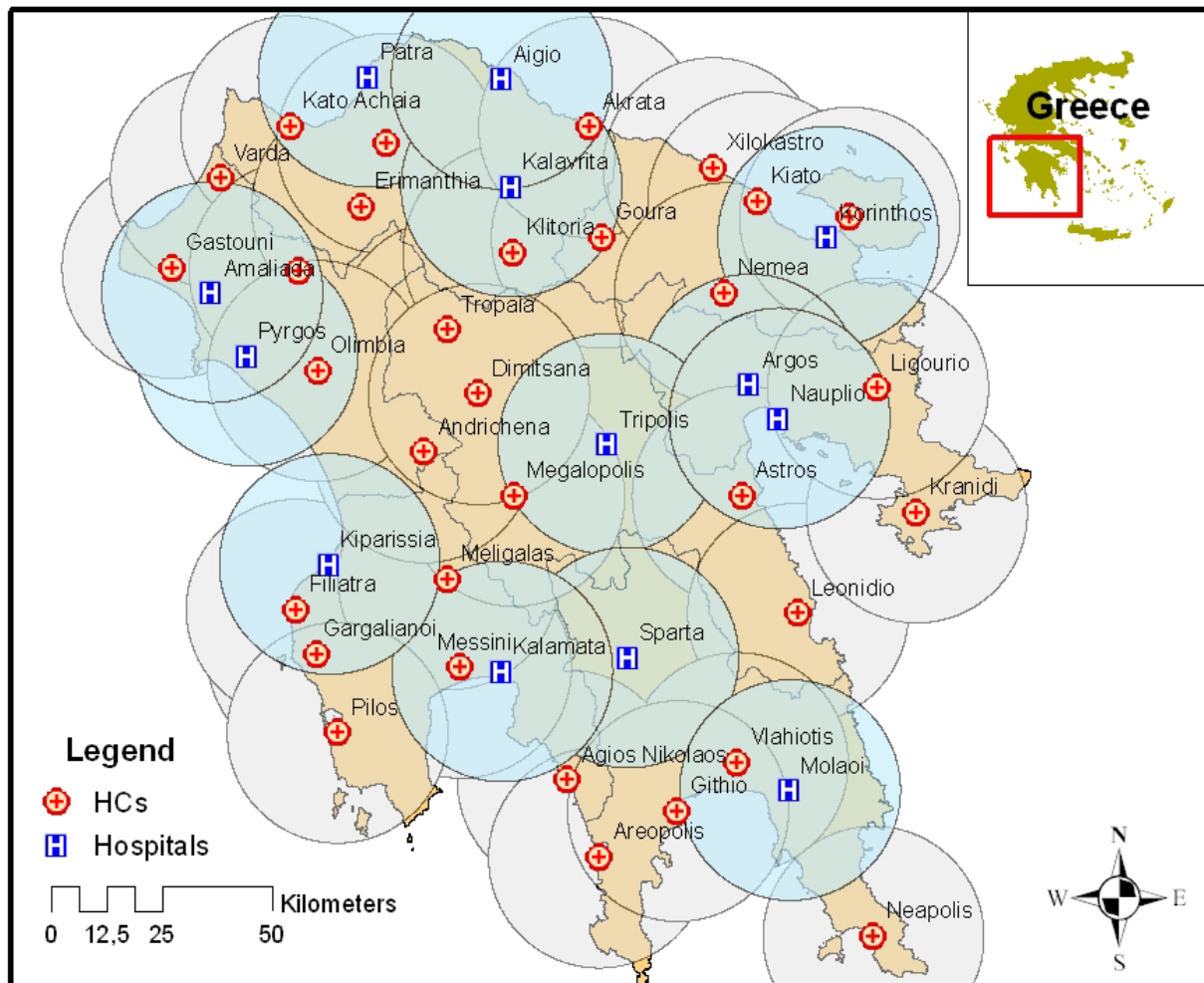
... (5)

Closest assignment constraints (6)

$$D_k^- \geq 0, \quad k \in J_1 \quad (7)$$

$$x_{ij} \in \{0, 1\}, \quad i \in I, j \in J \quad y_k \in \{0, 1\}, \quad k \in J_1$$

# The case study area



## Current situation

- 13 hospitals
- 32 primary health centers
- 1340 population centers
- 3 options for the provision of HCs services

# DEA results

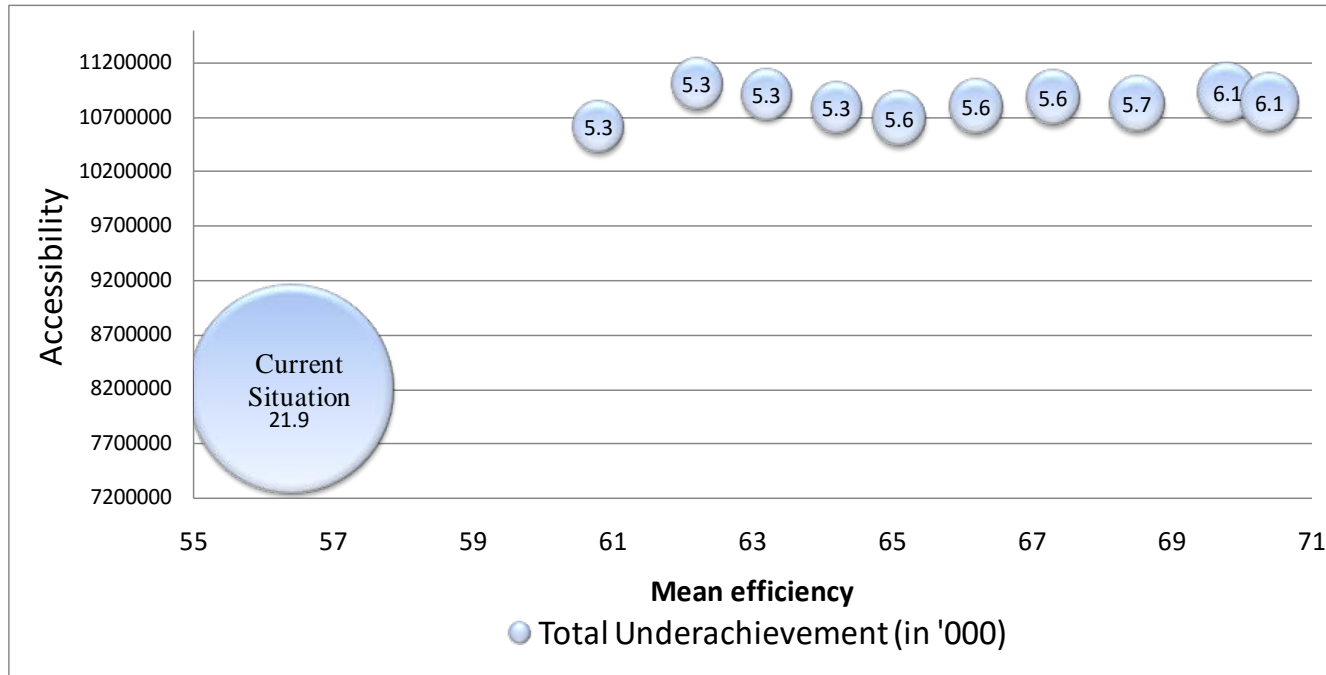
No	HC	Efficiency	No	HC	Efficiency
1	Xylokastro	0.61	17	Gargaliani	0.99
2	Ag. Nicolaos	0.26	18	Guthio	1
3	Meligala	0.27	19	Filiatra	0.61
4	Messini	0.26	20	Gkoura	0.18
5	Pilos	0.27	21	Nemea	0.24
6	Kiato	1	22	Neapoli	1
7	Kranidi	0.90	23	Akrata	0.32
8	Loutraki	1	24	Aandrichena	0.32
9	Ligourio	0.31	25	Olimbia	0.10
10	Areopoli	1	26	Varda	0.83
11	Astros	0.79	27	Gastouni	0.34
12	Vlahioti	0.50	28	Erimanthia	0.49
13	Dimitsana	0.65	29	Kato Achaia	0.37
14	Leonidio	0.86	30	Kleitoria	1
15	Megalopoli	0.82	31	Chalandritsa	0.78
16	Tropaia	1	32	Simopoulo	0.68

# Pareto-efficient location–allocation configurations

Solution No	Total No of HCs	Accessibility '000 man.km	Total underachievement	Consolidation mean efficiency
0*	32	8,191	21,940	56,4
1	19	10,607	5,258	60,8
2	18	11,000	5,258	62,2
3	19	10,905	5,258	63,2
4	19	10,781	5,643	64,2
5	20	10,685	5,644	65,1
6	19	10,794	6,106	66,2
7	19	10,876	6,106	67,3
8	20	10,816	7,955	68,5
9	19	10,925	8,417	69,8
10	20	10,830	8,417	70,4

\* Current situation

# Pareto-efficient location–allocation configurations/2

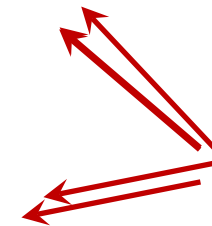


- Remarks:
  - evident underutilization of resources
  - optimal number of HCs ranges from 18 to 20

# Pareto-efficient location–allocation configurations/3

no	HC	initial capacity	HCs Capacities in optimal solutions									
			1	2	3	4	5	6	7	8	9	10
1	<b>Xylokaastro</b>	16886	16981	16981	16981	16981	16672	16981	x	17587	17343	17409
2	Ag. Nicolaos	-4192	x	x	x	x	x	x	x	x	x	x
3	Meligala	13821	x	x	x	x	x	x	x	x	x	x
4	Messini	24153	26420	26420	26420	26420	26412	26181	26181	26420	26175	26175
5	Pilos	-943	10302	10302	10302	10302	-943	-943	10302	-943	-943	-943
6	Kiato	34001	34001	34001	34001	34245	34001	37767	34001	34245	34245	34245
7	Kranidi	15875	15875	15875	15875	15875	15875	15875	15875	15875	15875	15875
8	Loutraki	28783	28783	28783	28783	28783	28783	28783	28783	28783	28783	28783
9	Ligourio	-600	-600	-600	-600	-600	-600	-600	-600	-600	-600	-600
10	Areopoli	-5289	-4143	-4143	-4143	-4914	-4914	-4914	-4914	-4914	-4914	-4914
11	Astros	-1372	-1372	-1372	-1372	-1372	-1372	-1372	-1372	-1372	-1372	-1372
12	Vlahioti	12782	x	x	x	x	x	x	x	x	x	x
13	Dimitsana	-5855	x	x	x	x	x	x	x	x	x	x
14	Leonidio	-819	-765	-765	-765	-765	-765	-765	-765	-765	-765	-765
15	<b>Megalopoli</b>	12108	x	x	12120	x	12120	x	12120	12120	x	12213
16	<b>Tropaia</b>	-2905	-1236	-1198	-1199	-1236	-1237	-1207	-1245	-1602	-1593	8360
17	Gargaliani	17756	x	x	x	x	x	21545	21545	x	21578	21578
18	Guthio	11379	x	x	x	12362	12362	12362	12362	12362	12362	12362
19	Filiatra	18163	20625	20625	20625	20625	20633	x	x	20625	x	x
20	Gkoura	-5918	x	x	x	x	x	x	x	x	x	x
21	Nemea	12920	13153	13153	13153	13153	13219	13153	13219	13185	13185	13119
22	Neapoli	-442	-442	-442	-442	-442	-442	-442	-442	-442	-442	-442
23	Akrata	-266	10086	10086	10086	10086	10093	10086	10208	x	x	x
24	Andrichena	-3655	-1957	-1995	-1995	-1957	-1957	-1969	-1931	-1987	-1977	-1931
25	Olimbia	24333	x	x	x	x	x	x	x	x	x	x
26	Varda	17421	18945	19661	19661	19661	19763	19661	19661	19661	19763	19763
27	Gastouni	31248	31248	x	x	x	x	x	x	x	x	x
28	Erimanthia	-3839	x	x	x	x	x	x	x	x	x	x
29	Kato Achaia	23653	x	x	x	x	x	x	x	x	x	x
30	Kleitoria	-4723	x	x	x	x	x	x	-4227	-4227	-4227	-4227
31	Chalandritsa	-3062	10490	10490	10490	10490	10490	10490	10490	10490	10490	10490
32	<b>Simopoulo</b>	10048	x	x	x	x	x	x	x	x	x	x
<b>Total</b>			<b>32</b>	<b>19</b>	<b>18</b>	<b>19</b>	<b>19</b>	<b>20</b>	<b>19</b>	<b>19</b>	<b>20</b>	<b>19</b>

“x”:  
**shaded cells**: HC closure, upgraded services,  
“-”:  
underachievement from treatment population of 10,000  
**(Bold)**:  
HCs with different configuration



Importance of Steady operational constraint on population

# [ Some remarks ]

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- Increase of Mean Efficiency by 3d objective
- Steady operational patterns
- Hospitals offer stability
- Importance of constraint on treatment population

# Re-assessment of efficiencies

- DEA inputs and outputs are replaced by expected ones
  - Treatment population is estimated by the solution of the DEA-LA model
  - Doctors and nurses are determined by the level of services offered
  - Outputs are estimated according to the outputs of neighboring HCs that are closed
- New average DEA efficiency increases by 18%
- These results are used as future targets



# Conclusions

- Combination of DEA with resource allocation models
- Model can be extended to include additional objectives
- More complicated restrictions may be considered
- Interesting to consider a dynamic version of the problem
- Create scenarios concerning changes in population over time, migration, etc