

# An Extension of Data Envelopment Analysis using an Interactive Tri-Criteria Linear Programming Package (TRIMAP)

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# DEA-CCR MODEL

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$$\text{Max } h_0 = \sum_{r=1}^s u_r y_{rj_0}$$

*sujeito a*

$$\sum_{i=1}^m v_i x_{ij_0} = 1$$

$$\sum_{r=1}^s u_r y_{rj} - \sum_{i=1}^m v_i x_{ij} \leq 0, j = 1, \dots, n$$

$$u_r, v_i \geq 0, \forall r, i$$

Relative Efficiency evaluation concerning Decision Making Units (DMU's) – maximizing a ratio of a weighted sum of outputs to a weighted sum of inputs (here weights are “multipliers”).

Constant returns of scale

Some Drawbacks:

-a lot of ties among efficient DMU's,

- multipliers nil valued.

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# MOLP-DEA (based on Li and Reeves)

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$$\text{Min } d_0$$

$$\text{Min Max } d_j$$

$$\text{Min } \sum_{j=1}^n d_j$$

*subject to:*

$$\sum_{i=1}^m v_i x_{ij_0} = 1$$

$$\sum_{r=1}^s u_r y_{rj} - \sum_{i=1}^m v_i x_{ij} + d_j = 0, j=1, \dots, n$$

$$u_r, v_i \geq 0, \quad \forall r, i, j$$

**Motivation:** dealing with the following concerns in classical DEA – multipliers with a nil value and discrimination improvement in the presence of few DMUs.

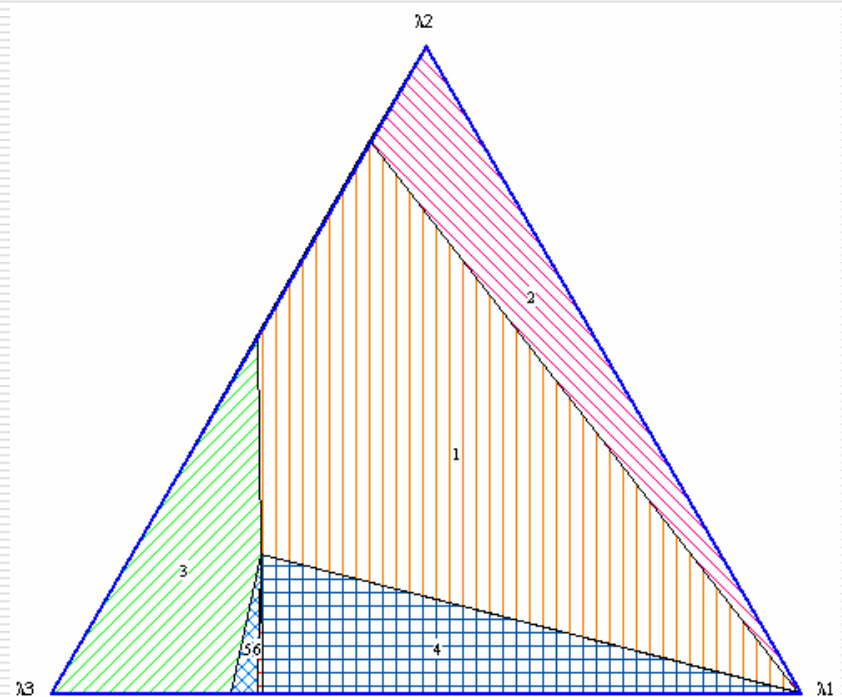
**Objective functions:**

- 1- DMU efficiency =  $1 - d_0$
  - 2- equity function
  - 3- a global benevolence function
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# TRIMAP

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- A Tri-criteria linear programming package.
- It is an interactive decision environment...



**START**

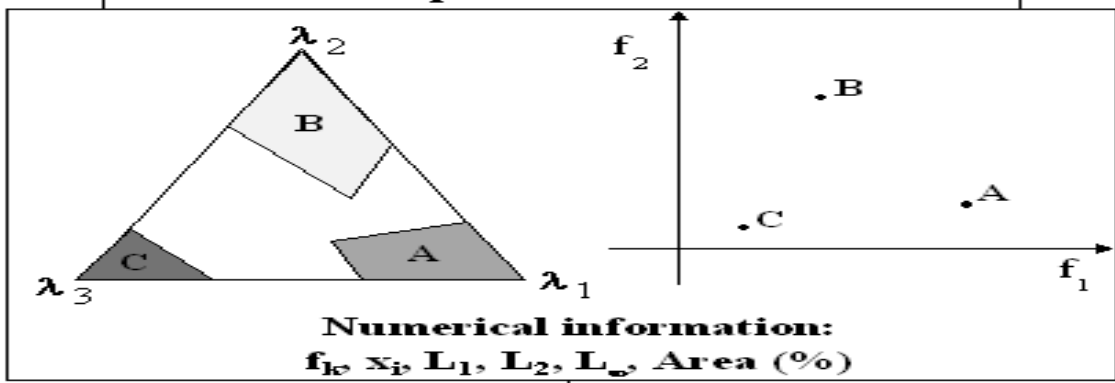
Computation of the non dominated solutions optimize each objective function

Computation of the non dominated solution minimise a weighted Tchebycheff ideal solution

Computation of non dominated solutions by direct (on the graph) selection of weights

Computation of non dominated solutions by indirect selection of weights

**Information updated in each interaction**



**Cuts of the feasible polyhedron**

**Decision phase**

**Elimination of triangle subregions by imposing limitations:**  
- on the objective function values  
- directly on the weights

Computation of the non dominated solution which minimise a Tchebycheff distance to a reference point

Continuous scanning of non dominated faces

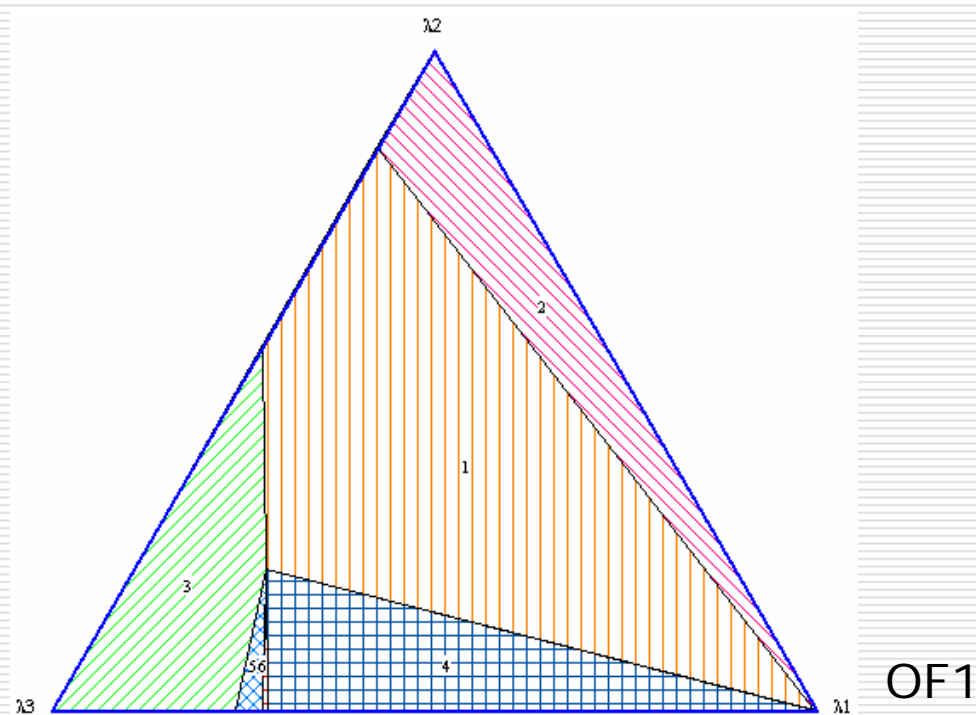
**The DM considers that a decision can be made based on the information obtained**

**END**

# Alternative optimal multipliers

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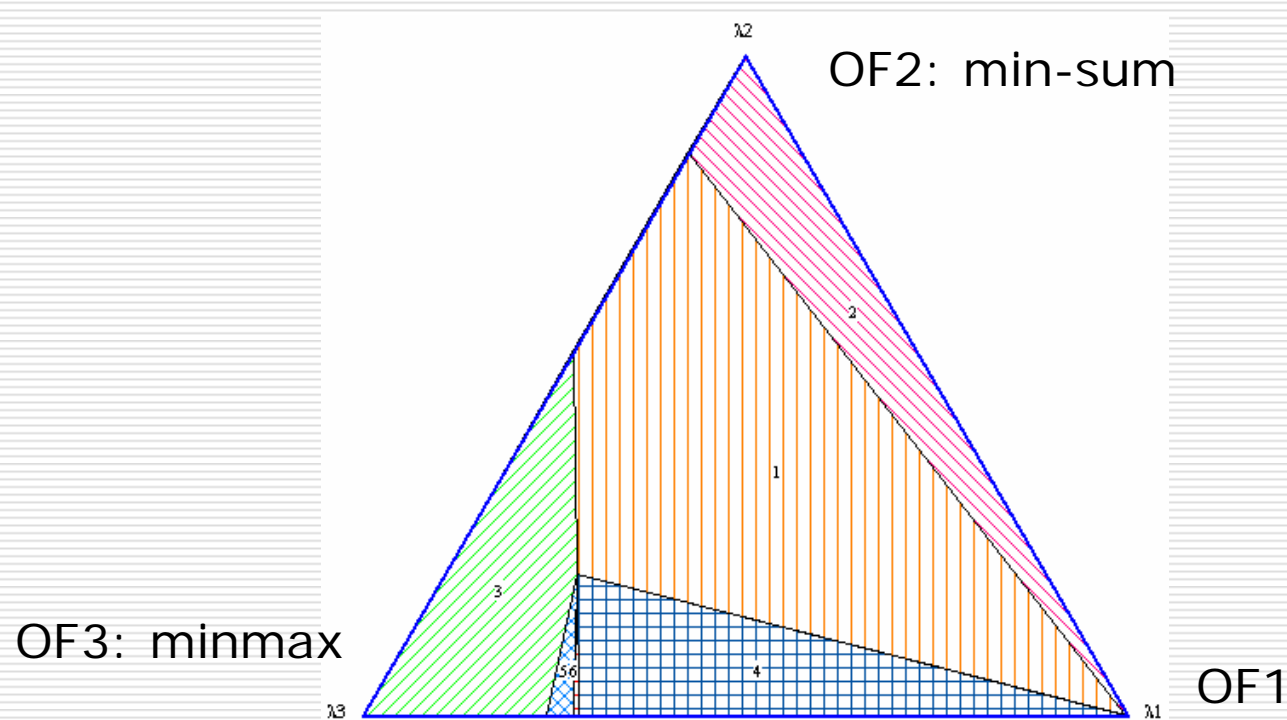
- Alternative optimal multipliers are identified by the sub-regions (three in this case) converging on objective function 1 vertex



# A DMU is min-sum efficient...

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- This DMU is min-sum efficient: Sub-region 2 corresponds simultaneously to objective functions 1 and 2 optimum.



# Numerical example

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DMU	<i>Input 1</i>	<i>Input 2</i>	<i>Output</i>
1	0,5	5	8
2	2	1	4
3	3	5	20
4	4	2	8
5	1	1	4

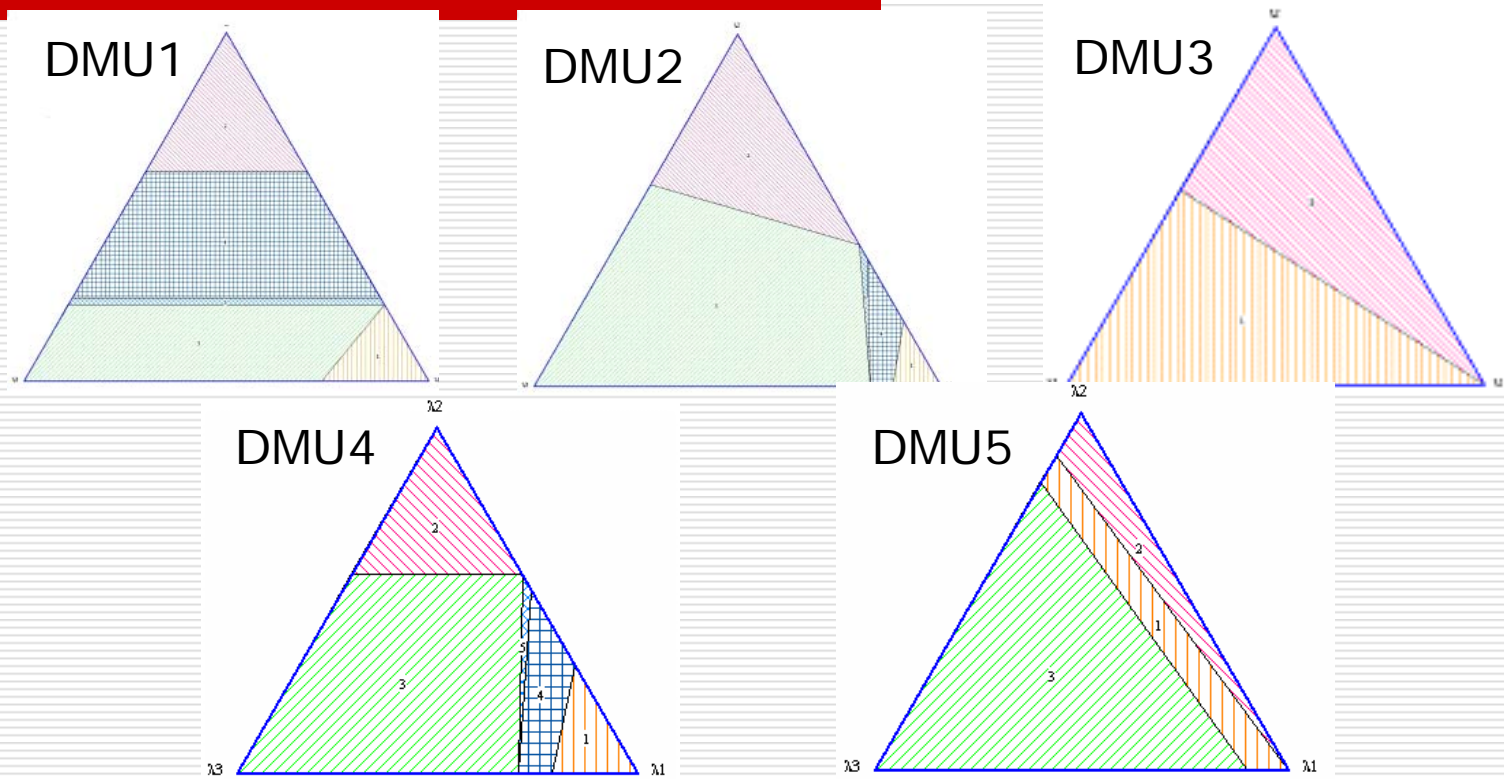
**Note: A DMU is efficient when**

**1-do is equal to 1**

**(in this case all of them are efficient)**

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# Numerical example



DMU 3 is minimax and minisum efficient.  
DMU 5 is minisum efficient.  
The others are just efficient...

# CASE STUDY

Brazilian privatized highways.

Efficiency evaluation (from the point of view of the users) taking into account the relations among **investments** and **traffic** as outputs and **number of crashes** and **income of the concessionary company** as inputs

<i>DMU</i> <i>(Brazilian</i> <i>privatised</i> <i>highways)</i>	Efficiency (%)	<i>Inputs</i>		<i>Outputs</i>	
		Crash/Km	Income/km	Investment/Km	Traffic/Km
CONCEPA	69,54	0,1897	0,1522	0,1400	0,0803
CONCER	100,00	0,1300	0,1312	0,2436	0,0472
CRT	71,10	0,0756	0,0984	0,0851	0,0309
Nova Dutra	71,06	0,3210	0,2708	0,3573	0,0492
Ponte	100,00	1,0000	1,0000	1,0000	1,0000

# CASE STUDY

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PONTE (RIO-NITEROI BRIDGE)



NOVA DUTRA (RIO-S.PAULO HIGHWAY)

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# CASE STUDY

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CONCR (RIO-JUIZ DE FORA HIGHWAY)

CRT (RIO-TERESÓPOLIS HIGHWAY)

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# CASE STUDY

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CONCEPA (OSÓRIO-PORTO ALEGRE HIGHWAY)

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# Tricriteria model for DMU1

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$$\text{Min } d_1$$

$$\text{Min } (d_1 + d_2 + d_3 + d_4 + d_5) / 5$$

$$\text{Min } (\text{Max } d_i)$$

*Sujeito a:*

$$0,1897v_1 + 0,1522v_2 = 1$$

$$-0,1897v_1 - 0,1522v_2 + 0,1400u_1 + 0,0803u_2 + d_1 = 0$$

$$-0,1300v_1 - 0,1312v_2 + 0,2436u_1 + 0,0472u_2 + d_2 = 0$$

$$-0,0756v_1 - 0,0984v_2 + 0,0851u_1 + 0,0309u_2 + d_3 = 0$$

$$-0,3210v_1 - 0,2708v_2 + 0,3573u_1 + 0,0492u_2 + d_4 = 0$$

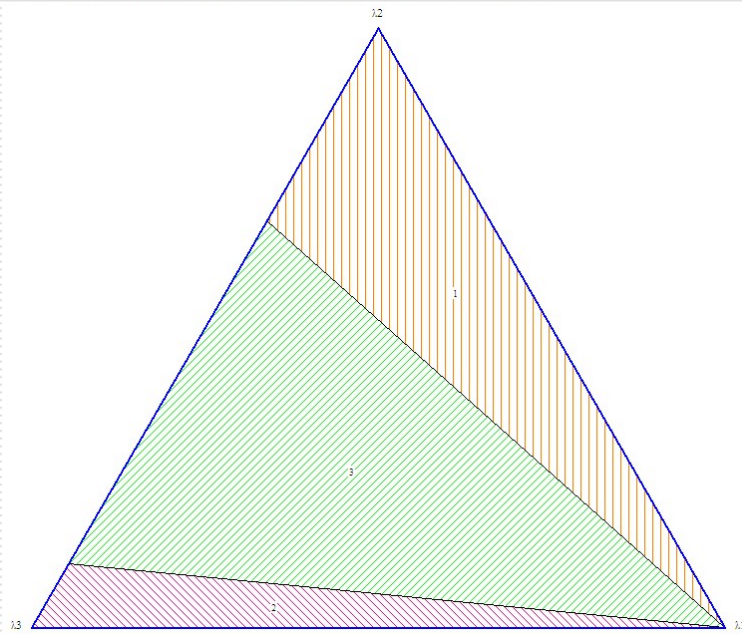
$$-v_1 - v_2 + u_1 + u_2 + d_5 = 0$$

$$d_1, d_2, d_3, d_4, d_5, v_1, v_2, u_1, u_2 \geq 0$$

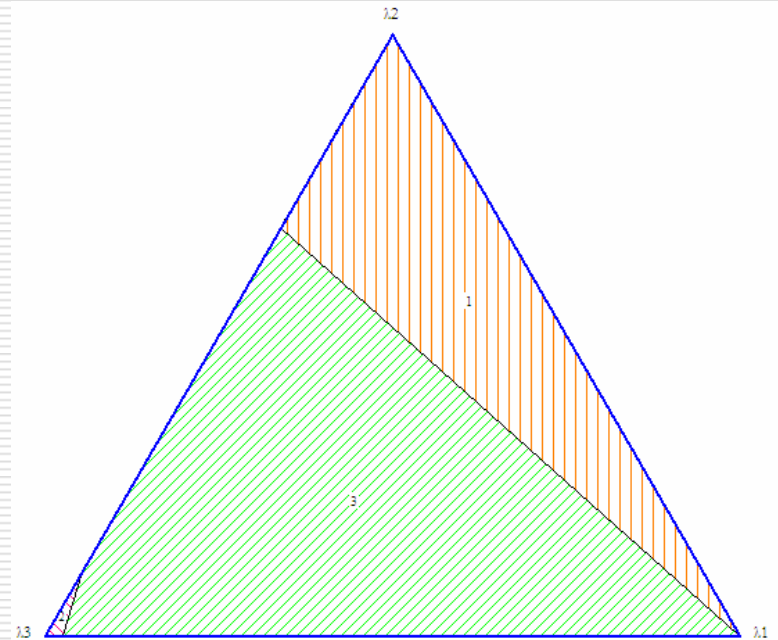
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# Weight space decomposition for efficient DMUs

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CONCERT (DMU 2)



PONTE (DMU 5)

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CONCERT EFFICIENCY IS 1 IN ANY CASE...

# New Model

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## Objective functions

$$\text{Max} \sum_{r=1}^s u_{r0} y_{rj_0}$$

$$\text{Max } I$$

$$\text{Max } O$$

*subject to*

$$\sum_{i=1}^m v_i x_{ij_0} = 1$$

$$\sum_{r=1}^s u_r y_{rj} - \sum_{i=1}^m v_i x_{ij} \leq 0, \quad j=1, \dots, n$$

$$I \leq v_{i_0}, \quad i=1, \dots, m$$

$$O \leq u_{r_0}, \quad r=1, \dots, s$$

$$u_r, v_i \geq 0, \quad \forall r, i, j$$

**Motivation:** avoiding null multipliers

**Objective functions:**

1- Classical DEA

2- Maximizes the minor multiplier regarding the inputs

3- Maximizes minor multiplier regarding the outputs