

Allocative Efficiency Analysis using DEA in Stata

July 25–26, 2012

2012 San Diego Stata Conference



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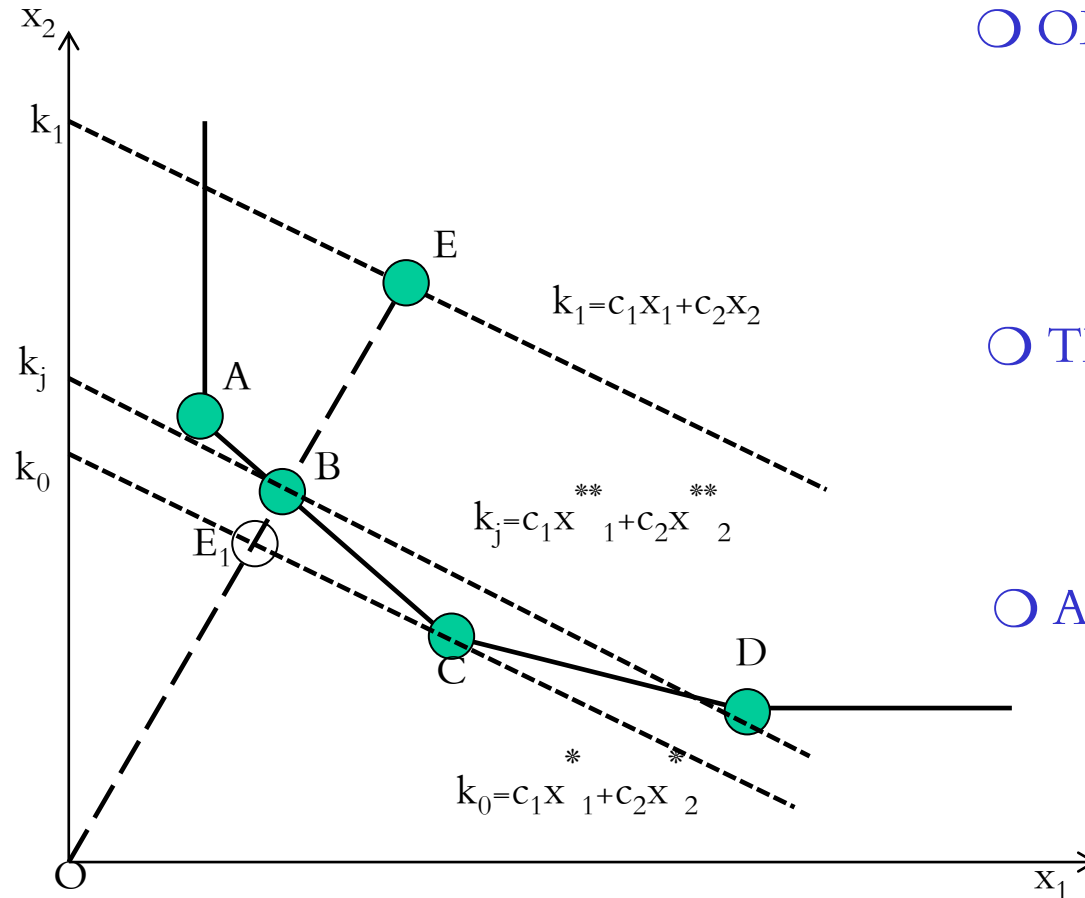
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I. The Concept of Allocative Efficiency

□ Overall(OE), Technical(TE), and Allocative Efficiency(AE)

○ Consider produce y with x_1 and x_2 .



○ OE:
$$0 \leq \frac{k_0}{k_1} = \frac{\sum_{i=1}^M c_i x_i^*}{\sum_{i=1}^M c_i x_i} = \frac{d(O, E_1)}{d(O, E)} \leq 1$$

○ TE:
$$0 \leq \frac{k_j}{k_1} = \frac{\sum_{i=1}^M c_i x_i^{**}}{\sum_{i=1}^M c_i x_i} = \frac{d(O, B)}{d(O, E)} \leq 1$$

○ AE:
$$0 \leq \frac{k_0}{k_j} = \frac{\sum_{i=1}^M c_i x_i^*}{\sum_{i=1}^M c_i x_i^{**}} = \frac{d(O, E_1)}{d(O, B)} \leq 1$$

☞ $AE = OE/TE$

Fig. 1 Concept of Allocative Efficiency

I. The Concept of Allocative Efficiency

□ Mathematical Formulations of Allocative Efficiency

○ Recall TE, the Efficiency estimate of a DEA Model (see Lee, 2009)

○ the cost line passing through points k_0 and C can be obtained by solving the following Linear Programming (Cooper et. al., 2006)

$$k_0 = \mathbf{c}\mathbf{x}^* = \min_{\mathbf{x}, \lambda} \sum_{i=1}^M c_i x_i$$

s.t.

$$x_i \geq \sum_{j=1}^J x_m^j \lambda^j \quad (\text{input } m = 1, 2, \dots, M)$$

$$y_0 \leq \sum_{j=1}^J y_n^j \lambda^j \quad (\text{output } n = 1, 2, \dots, N)$$

$$\lambda^j \geq 0 \quad (j = 1, 2, \dots, J),$$

where c_i is unit input price or unit cost of i th input.

I. The Concept of Allocative Efficiency

□ Allocative Efficiency Measure matters?

○ points A, B, C in Fig. 1 are all Technically Efficient (CCR-efficient)

○ However, point C is less expensive than points A and B.

□ Revenue Efficiency, Profit Efficiency Defined

$$R = py^* = \max_{y, \lambda} \sum_{n=1}^N p_n y_n$$

s.t.

$$x_i \geq \sum_{j=1}^J x_m^j \lambda^j \text{ (input } m = 1, 2, \dots, M)$$

$$y_0 \leq \sum_{j=1}^J y_n^j \lambda^j \text{ (output } n = 1, 2, \dots, N)$$

$$\lambda^j \geq 0 \text{ (} j = 1, 2, \dots, J),$$

where p_n is unit price of n th output.

$$\pi = py^* - cx^* = \max_{x, y, \lambda} \left(\sum_{n=1}^N p_n y_n - \sum_{m=1}^M c_m x_m \right)$$

s.t.

$$x_i \geq \sum_{j=1}^J x_m^j \lambda^j \text{ (input } m = 1, 2, \dots, M)$$

$$y_0 \leq \sum_{j=1}^J y_n^j \lambda^j \text{ (output } n = 1, 2, \dots, N)$$

$$\lambda^j \geq 0 \text{ (} j = 1, 2, \dots, J),$$

🌀 model variations by allowing different cost and price, and returns to scale.

II. Allocative Efficiency in Stata

□ The User Written Command “`dea_allocative`”

○ Program Syntax

```
dea_allocative ivars = ovars [if] [in] [using/] [,  
  model(string) values(numlist>0) unitvars(varlist numeric)  
  rts(string) saving(filename)]
```

- model(*string*) specifies one of the cost, revenue, and profit.
- rts(*string*) specifies crs or vrs returns to scale. The default option is crs.
- values and unitvars are case sensitive. val(*numlist*) specifies the common unit cost or price and unit(*varlist*) specifies the variables that contain the unit cost or price to be used.
- saving(*filename*) specifies that the results be saved in filename.dta

II. Allocative Efficiency in Stata

□ The User Written Command “dea_allocative”

○ Data

| dmu | Inp_x1 | Inp_x2 | Out_y1 | Inp_c1 | Inp_c2 | Out_p1 |
|----------|--------|--------|--------|--------|--------|--------|
| A | 2 | 8 | 1 | 1 | 2 | 3 |
| B | 6 | 9 | 1 | 1 | 2 | 3 |
| C | 5 | 6 | 1 | 1 | 2 | 3 |
| D | 8 | 5 | 1 | 1 | 2 | 3 |
| E | 7 | 3 | 1 | 1 | 2 | 3 |
| F | 3 | 6 | 1 | 1 | 2 | 3 |
| G | 2 | 2 | 1 | 1 | 2 | 3 |

II. Allocative Efficiency in Stata

□ The User Written Command “dea_allocative”

○ Result: cost efficiency model w/unitvars option

```
. use "D:\...\alloc_lee_sd1.dta"
. do ldea
. dea_allocative inp_x1 inp_x2= out_y1,mod(c) unitvars(inp_c1 inp_c2)
sav(alloc_cost_exam1.dta)
```

CRS DEA-Cost Efficiency Results:

| | CUR: inp_x1 | CUR: inp_x2 | CUR: cost | TECH: theta | TECH: inp_x1 | TECH: inp_x2 | TECH: cost | MIN: inp_x1 | MIN: inp_x2 |
|--------|----------------|----------------|--------------|----------------|-----------------|-----------------|---------------|----------------|----------------|
| dmu:A_ | 2 | 8 | 18 | 1 | 2 | 8 | 18 | 2 | 2 |
| dmu:B_ | 6 | 9 | 24 | .333333 | 2 | 3 | 8 | 2 | 2 |
| dmu:C_ | 5 | 6 | 17 | .4 | 2 | 2.4 | 6.8 | 2 | 2 |
| dmu:D_ | 8 | 5 | 18 | .4 | 3.2 | 2 | 7.2 | 2 | 2 |
| dmu:E_ | 7 | 3 | 13 | .666667 | 4.66667 | 2 | 8.66667 | 2 | 2 |
| dmu:F_ | 3 | 6 | 15 | .666667 | 2 | 4 | 10 | 2 | 2 |
| dmu:G_ | 2 | 2 | 6 | 1 | 2 | 2 | 6 | 2 | 2 |

| | MIN: cost | OE | AE | TE |
|--------|--------------|---------|---------|---------|
| dmu:A_ | 6 | .333333 | .333333 | 1 |
| dmu:B_ | 6 | .25 | .75 | .333333 |
| dmu:C_ | 6 | .352941 | .882353 | .4 |
| dmu:D_ | 6 | .333333 | .833333 | .4 |
| dmu:E_ | 6 | .461538 | .692308 | .666667 |
| dmu:F_ | 6 | .4 | .6 | .666667 |
| dmu:G_ | 6 | 1 | 1 | 1 |

II. Allocative Efficiency in Stata

□ The User Written Command “dea_allocative”

○ Result: cost efficiency model w/val option

```
. dea_allocative inp_x1 inp_x2= out_y1,mod(c) val(1 2) sav(alloc_cost_exam2.dta)
```

CRS DEA-Cost Efficiency Results:

| | CUR: inp_x1 | CUR: inp_x2 | CUR: cost | TECH: theta | TECH: inp_x1 | TECH: inp_x2 | TECH: cost | MIN: inp_x1 | MIN: inp_x2 |
|--------|----------------|----------------|--------------|----------------|-----------------|-----------------|---------------|----------------|----------------|
| dmu:A_ | 2 | 8 | 18 | 1 | 2 | 8 | 18 | 2 | 2 |
| dmu:B_ | 6 | 9 | 24 | .333333 | 2 | 3 | 8 | 2 | 2 |
| dmu:C_ | 5 | 6 | 17 | .4 | 2 | 2.4 | 6.8 | 2 | 2 |
| dmu:D_ | 8 | 5 | 18 | .4 | 3.2 | 2 | 7.2 | 2 | 2 |
| dmu:E_ | 7 | 3 | 13 | .666667 | 4.66667 | 2 | 8.66667 | 2 | 2 |
| dmu:F_ | 3 | 6 | 15 | .666667 | 2 | 4 | 10 | 2 | 2 |
| dmu:G_ | 2 | 2 | 6 | 1 | 2 | 2 | 6 | 2 | 2 |

| | MIN: cost | OE | AE | TE |
|--------|--------------|---------|---------|---------|
| dmu:A_ | 6 | .333333 | .333333 | 1 |
| dmu:B_ | 6 | .25 | .75 | .333333 |
| dmu:C_ | 6 | .352941 | .882353 | .4 |
| dmu:D_ | 6 | .333333 | .833333 | .4 |
| dmu:E_ | 6 | .461538 | .692308 | .666667 |
| dmu:F_ | 6 | .4 | .6 | .666667 |
| dmu:G_ | 6 | 1 | 1 | 1 |

II. Allocative Efficiency in Stata

□ The User Written Command “dea_allocative”

○ Result: revenue efficiency model

```
. dea_allocative inp_x1 inp_x2= out_y1,mod(r) val(3) sav(alloc_revenue_exam3.dta)
```

CRS DEA-Revenue Efficiency Results:

| | CUR: out_y1 | CUR: price | TECH: eta | TECH: out_y1 | TECH: price | MAX: out_y1 | MAX: price | OE | AE |
|--------|----------------|---------------|--------------|-----------------|----------------|----------------|---------------|---------|----|
| dmu:A_ | 1 | 3 | 1 | 1 | 3 | 1 | 3 | 1 | 1 |
| dmu:B_ | 1 | 3 | 3 | 3 | 9 | 3 | 9 | .333333 | 1 |
| dmu:C_ | 1 | 3 | 2.5 | 2.5 | 7.5 | 2.5 | 7.5 | .4 | 1 |
| dmu:D_ | 1 | 3 | 2.5 | 2.5 | 7.5 | 2.5 | 7.5 | .4 | 1 |
| dmu:E_ | 1 | 3 | 1.5 | 1.5 | 4.5 | 1.5 | 4.5 | .666667 | 1 |
| dmu:F_ | 1 | 3 | 1.5 | 1.5 | 4.5 | 1.5 | 4.5 | .666667 | 1 |
| dmu:G_ | 1 | 3 | 1 | 1 | 3 | 1 | 3 | 1 | 1 |

| | TE |
|--------|---------|
| dmu:A_ | 1 |
| dmu:B_ | .333333 |
| dmu:C_ | .4 |
| dmu:D_ | .4 |
| dmu:E_ | .666667 |
| dmu:F_ | .666667 |
| dmu:G_ | 1 |

II. Allocative Efficiency in Stata

□ The User Written Command “dea_allocative”

○ Result: revenue efficiency model

```
. dea_allocative inp_x1 inp_x2= out_y1,mod(p) unitvars( inp_c1 inp_c2 out_p1)  
sav(alloc_profit_exam4.dta)
```

CRS DEA-Profit Efficiency Results:

| | MAX^: out_y1 | MAX: revenue | MIN^: inp_x1 | MIN^: inp_x2 | MIN: cost | MAX: profit | CUR: profit | OE |
|--------|-----------------|-----------------|-----------------|-----------------|--------------|----------------|----------------|---------|
| dmu:A_ | 1 | 3 | 2 | 2 | 6 | -3 | -15 | 5 |
| dmu:B_ | 1 | 3 | 2 | 2 | 6 | -3 | -21 | 7 |
| dmu:C_ | 1 | 3 | 2 | 2 | 6 | -3 | -14 | 4.66667 |
| dmu:D_ | 1 | 3 | 2 | 2 | 6 | -3 | -15 | 5 |
| dmu:E_ | 1 | 3 | 2 | 2 | 6 | -3 | -10 | 3.33333 |
| dmu:F_ | 1 | 3 | 2 | 2 | 6 | -3 | -12 | 4 |
| dmu:G_ | 1 | 3 | 2 | 2 | 6 | -3 | -3 | 1 |

III. Some Related User-written Programs

□ The Updated User-written codes are available upon request

○ dea.ado : data envelopment analysis model

○ ldea.do : batch module to run the updated dea models since Oct. 2011

○ malmq.ado : productivity analysis model

○ dea_allocative.ado : allocative efficiency model

○ dea_additive.ado : additive dea model

○ dea_sbm : slack-based dea model

○ dea_super : super-efficiency dea model(radial)

○ dea_imprecise : imprecise dea model(IDEA) /basic

○ dea_virtual : virtual price dea model

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References

- Cooper, W. W., Seiford, L. M., & Tone, A. (2006). Introduction to Data Envelopment Analysis and Its Uses, Springer Science+Business Media.
- Ji, Y., & Lee, C. (2010). “Data Envelopment Analysis”, The Stata Journal, 10(no.2), pp.267–280.
- Lee, C.(2011). “Malmquist Productivity Analysis using DEA Frontier in Stata”, Chicago11 Stata Conference.
- Lee, C. (2010). “An Efficient Data Envelopment Analysis with a large Data Set in Stata”, BOS10 Stata Conference.
- Lee, C., & Ji, Y. (2009). “Data Envelopment Analysis in Stata”, DC09 Stata Conference.

Thank You !