

# Iteratively Weighted Least Squares in Stochastic Frontier Estimation

**Applied to the Dutch Hospital Industry**

**IDEAs 2012, Natal, Brazil**

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**August 2012**

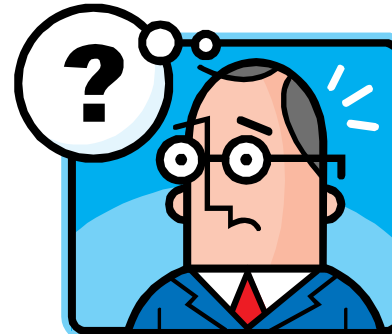
# Background

- How to improve transparency SFA?

Policymaker + DEA →



Policymaker + SFA →



# Central question

- Is there an alternative for SFA, that is more transparent, less complicated and more robust?
- → YES.

# Outline

1. SFA is a problem and a blessing;
2. Alternative for SFA;
3. Application;
4. Further research.

# Problems SFA

- A priori specification;
- Distributional assumptions on efficiency component;
- Far from transparent;
- Convergence issues;
- Hard to apply in system of equations;
  
- Conceptual: search for inefficiency !

# DEA

- Advantages:
  - No distributional assumptions;
  - No a priori specifications.
- Conceptual: search for efficiency!
- Drawbacks:
  - No stochastics;
  - Hard to include control variables;
  - Hard to derive economic features.

# Alternatives

- Thick Frontier (TFA) (Berger & Humphrey, 1991) ;
- Recursive thick frontier (RTFA) (Wagenvoort and Schure, 2006);
  - ➔ selecting efficient firms by iterative procedure;
  - ➔ Estimation based on efficient firms.
- Also serious drawbacks:
  - Loss of degrees of freedom;
  - Use of panel data (RTFA);
  - Firm specific efficiency (RTFA).

# Iteratively Weighted Least Squares

- Search for the efficient firms (transparency);
- Single or multiple equations model;
- Easy programming (single eq. even in Excel);
- Promising results.



# How does IWLS work?

- Choose parametric specification;
- Conduct LSQ estimation;
- Use residuals for establishing weights, for instance

$$w = \frac{1}{\left(1 + \frac{\hat{\varepsilon}}{\sigma_{LSQ}}\right)} \text{ if } \hat{\varepsilon} > 0, \text{ else } w = 1$$

- Re-estimate model with WLS;
- Repeat until parameter change  $|\beta| < \delta$ ;
- Derive efficiency scores (eventually corrected for random noise).

# Application: Dutch hospitals

- Data: about 80 hospitals 2003-2009;
- Outputs: 4 types of discharges;
- Inputs prices: 6 types of inputs;
- Input biased technical change;
- Translog specification cost function + share equations.

# Results LSQ+IWLS

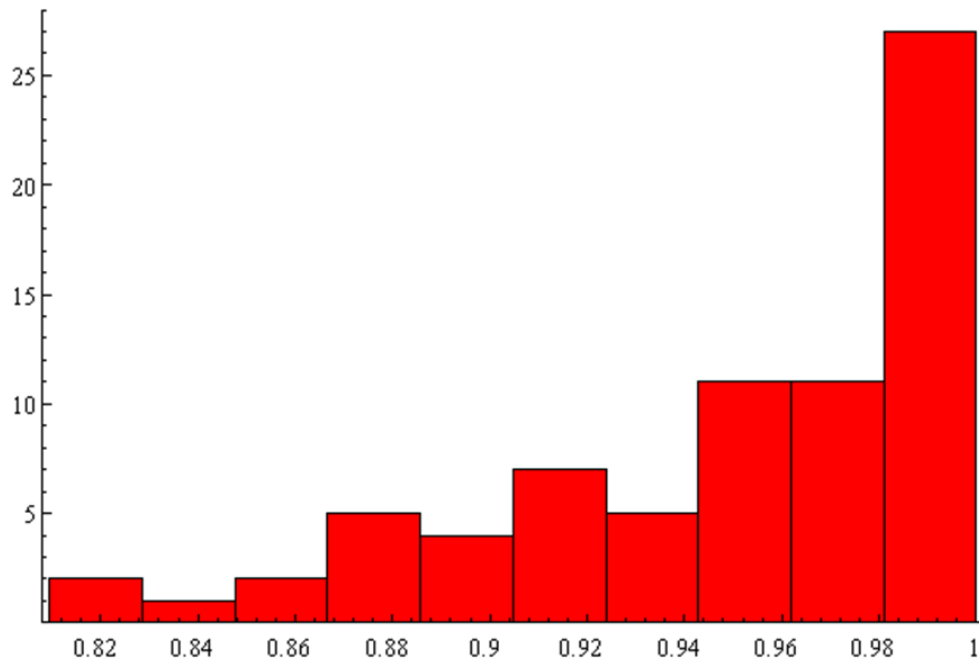
- Parameters plausible;
- Many parameters significant;
- Monotonicity and concavity conditions fulfilled.
  
- BUT:

# IWLS

- Show different pattern of technical change
  - TC 2003-2009: 18.6% (LSQ) versus 16.5% (IWLS);
- Parameters more efficient;
- Slight change in production parameters;
- No change in input price parameters.

# Some other features

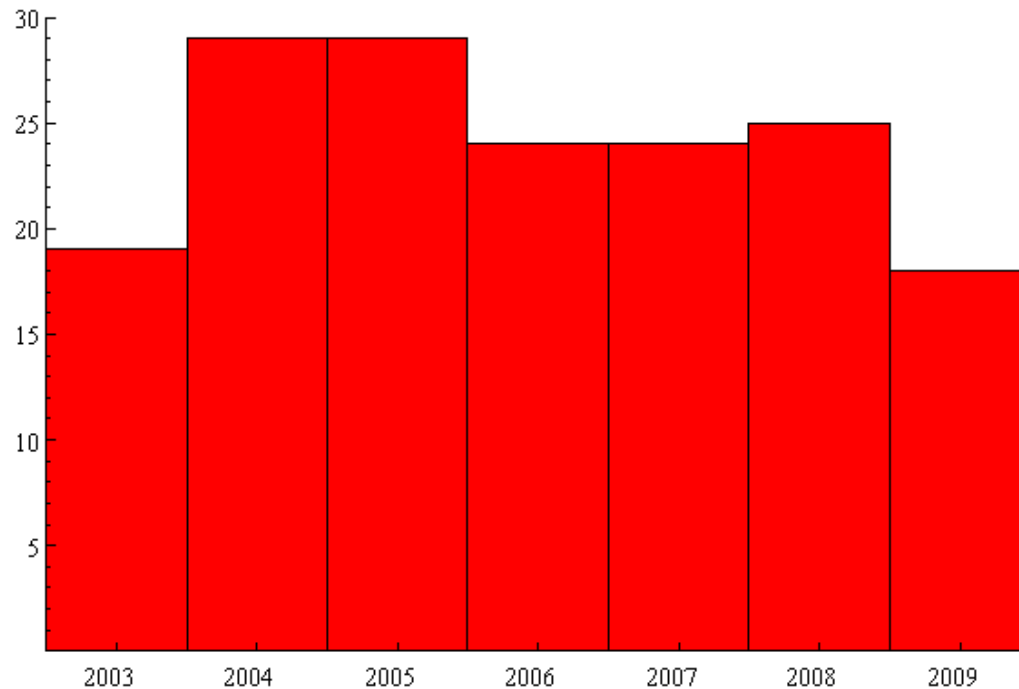
- 11 iterations to converge;
- Distribution of efficiency scores plausible.



# Representativeness in time

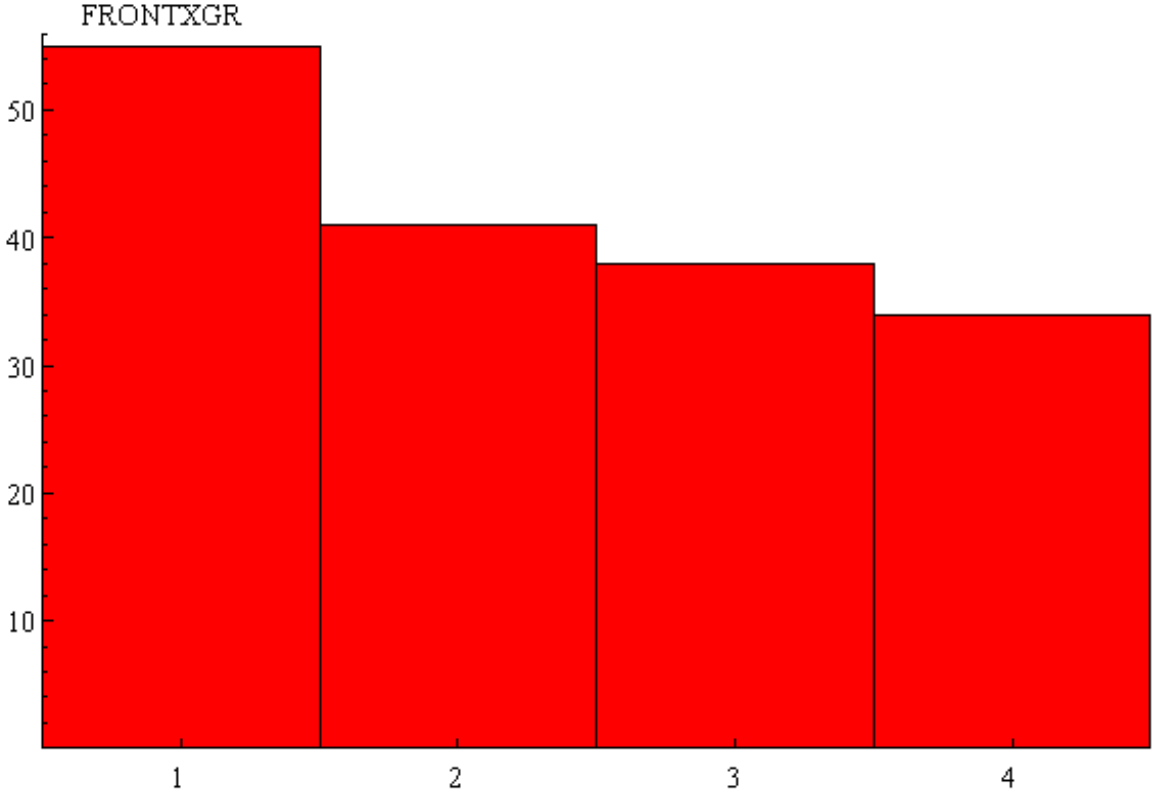
- Note: no stratification;

Figure 1 Number of efficient hospitals by year



# Representativeness wrt size

Figure 1 Number of efficient hospitals by size



# Conclusions + further research

- Promising results;
  - Improved transparency;
  - No loss of degrees of freedom;
  - Easy programming, et cetera;
  - No distributional assumptions.
- 
- Comparisons with SFA, RTFA;
  - Comparisons on other data sets;
  - Maybe Monte Carlo simulations.



# The end

- How to improve transparency SFA?

Policymaker + DEA →



Policymaker + IWLS →

