

Past Performance and Procurement Outcomes

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Background

This paper is a **case study** of an **experimental auction design**, performed in 2007 by a large private utility company **ACEA** (the buyer), in Italy.

Traditionally, **ACEA** outsources part of utility works to local contractors and smaller firms using a simple tender, that is reverse first-price auction.

The **goal** of the reform **was to increase contractual performance** by means of a **scoring auction** where **past performance** (as opposed to **ex-post performance**) was used as part of the awarding mechanism.

The outcome was

- lasting increase in performance
- no noticeable increase in price
- bidders did not like it

The prices seem to actually go down for the buyer.

Today I will try to explain this empirical puzzle.

But before that, you should probably ask yourself

- what is a scoring auction?
- why is it so experimental?
- why is this an empirical puzzle?

What is a scoring auction

Scoring auction

A scoring auction is a variation on the procurement (reverse first-price auction), where instead of awarding the contract to the supplier with highest discount, it is awarded to the supplier with the highest score

$$\text{score} = \alpha \cdot \text{quality} + (1 - \alpha) \cdot \text{discount}$$

where quality is typically a weighted average of certain parameters of the contract design (e.g. speed of delivery) or firm's observed characteristics (e.g. experience, years on the market, access to special equipment).

The theory of a scoring auction is traditionally attributed to [Che \(1993\)](#) and [Asker and Cantillon \(2010\)](#).

Scoring auction

Consider the baseline model, as in Che (1993).

- q for quality, r for reserve ($r = 1$)
- b for bid, $d = r - b$ for discount
- c for costs, $\theta = r - c$ is the **efficiency type**
- α is the weight

Furthermore, denote

- $s := \alpha q + (r - b)$ as the **score**
- $\rho := \alpha q + (r - c)$ as the **pseudo-type**

Thus the player's interim profit is

$$\pi = (b - c)Pr(win|b, q) = (\rho - s)Pr(win|s)$$

Scoring auction

Turns out, the solution is isomorphic to that of classic first-price auction:

$$\text{envelope conditions: } s = \rho - \frac{\int^{\rho} F^{n-1}(x|\alpha) dx}{F^{n-1}(\rho|\alpha)} \quad (1)$$

$$\text{first order conditions: } \rho = s + \frac{G(s|\alpha)}{(n-1)g(s|\alpha)} \quad (2)$$

where F is the pseudo-type distribution, and G is the score distribution, as long as the reserve price is not binding. This also allows for a non-parametric estimation a-la Guerre Perrigne Vuong (2000).

Crucially, it is the distribution of pseudo-type that matters for the calculation of strategies and informational rents.

This distribution of pseudo-type is endogenous and depends unpredictably on the scoring weight α .

Why is it so experimental

Experimental

Many countries (Italy, Russia, China...) have a hard time contracting **ex-post performance**, so the performance is often unsatisfactory.

- in Italy, several workers in ACEA's contracts were electrocuted due to poor standards at the work site (probably not wearing special gloves)
- In Italy, average bid auctions were used
- in Russia, bids that are below 25% of the reserve price are subject to additional scrutiny (anti-damping regulation)

Scoring **past performance** solves this problem. How?

- **controlling for hidden ability**
- **giving new incentives to increase performance**

Also, it is **is more credible** due to the absence of moral hazard on the buyer's side (work now - score tomorrow).

To achieve this, a special **system of audits was introduced** by ACEA, where auditors would randomly visit a worksite and take notes. The firm's performance would be evaluated and used as part of the score in "future" auctions, **giving incentives to show better performance**.

And for a while, this sounded like a very good idea.

However, a formal analysis of **the temporal link** between the auctions **is far from obvious**. For example, by the time the "future" auction happens, all the **extra investments made in the past are effectively sunk**.

We can try to hammer this into the model...

An appropriate model would not be

$$\pi = (b - C(q))Pr(win|b, q)$$

but rather

$$\pi = (b - c)Pr(win|b, q) - C(q)$$

in other words, a scoring auction **with sunk costs**.

Indeed, one could argue that **pastness is an extreme form of sunkness**.

The paradox

The paradox

Auction data shows that **quality has increased across all parameters**, the higher the weight in the scoring formula, the bigger the increase.

But the prices did not increase. To the contrary, it appears that higher quality came at a somewhat lower price for the buyer, which **seems to violate the theory of the firm**.

After all, the supply curve is increasing (recall micro 101) so the price should have increased.

This is the paradox.

The paradox

My solution to this paradox is to argue that, while the firm's costs have increased, the informational rents (profit margins) have decreased, creating an illusion of cheaper and better procurement.

$$quality \uparrow, \quad cost \uparrow, \quad price \downarrow = cost \uparrow + margin \downarrow$$

In other words, there was a transfer of wealth towards the buyer.

This also explains why the firms were so dissatisfied. While the reform was optimal for the buyer, but not a Pareto improvement.

But, there must be strong reasons for the decrease in profit margins...

$$price \downarrow = cost \uparrow + margin \downarrow$$

... otherwise, it is pure speculation.

The paradox

There will be three key ingredients in my solution:

- theory of scoring auction (classical, risk neutral)
- **sunkness of costs** (it helps but it is not necessary)
- some **extra heterogeneity** of firms (necessary)

The last ingredient is, perhaps, the most unexpected.

A stylized model

Consider n firms that have the following profit function:

$$\pi_i = (\rho - s)Pr(win|s) - C_i(q) \rightarrow \max_{s, q \geq \underline{q}_i}, \quad C_i(q) = \frac{(q - \underline{q}_i)^2}{2\beta}$$

in a scoring auction where

$$s = \alpha q + (r - b), \quad \rho = \alpha q + (r - c)$$

and the **scoring weight** α switches from 0 to 1 (to 1/3 in the data).

The **quadratic term captures the opportunity cost of building up quality** q via past performance, while β is a model **tuning parameter**.

Finally, \underline{q}_i captures **extra firm heterogeneity** in their ability to invest in q .

No heterogeneity

No heterogeneity

Let there be no extra heterogeneity ($\underline{q}_i = 0$).

Below is an example where $\theta = 1 - c$ is the efficiency parameter, distributed uniformly on $[0, 1]$ and there are $N = 2$ firms.

design	total profits	profit margin	discount	quality
price-only	$\theta^2/2$	$\theta^2/2$	$\theta/2$	0
scoring	$\theta^2/2$	$(1 + \alpha^2)\theta^2/2$	$(1 - \alpha^2)\theta/2$	$\alpha\theta$

The firm's **profit margins are higher in the scoring auction**, because she has to compensate for the investments made. On the other hand, the firm's **total profits** (profit margin + investment costs) **are the same**.

No heterogeneity

I can prove this as a theorem.

Theorem: If there is no firm heterogeneity (all \underline{q}_i are the same), the both expected quality and price increase when moving from the first price to the scoring auction.

In other words, the paradox is impossible.

Let's prove it.

No heterogeneity

Proof:

Without heterogeneity, for any weight α , the cost-efficient firm always wins. In a sense, a scoring auction is just another screening mechanism.

Thus, by Revenue Equivalence, the firm's expected interim (total) profits are the same across all auction designs:

$$\pi_i = (b - c)Pr(win|s) - C_i(q)$$

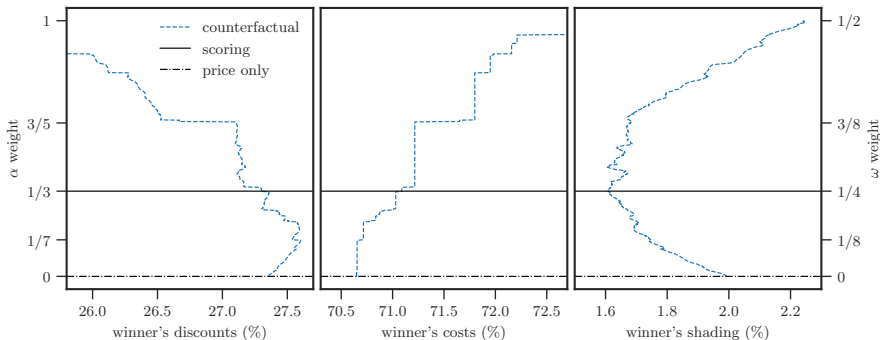
but they have paid their investment costs $C_i(q)$, thus their expected reimbursement must increase by that exact amount.

Which completes the proof.

Structural analysis

Equilibrium

I estimated the model with quadratic costs, quality fixed ($\beta = 0$), and simulated counterfactuals. Interestingly, for $\alpha = 0$, the counterfactual does not depend on β or the shape of the cost function.



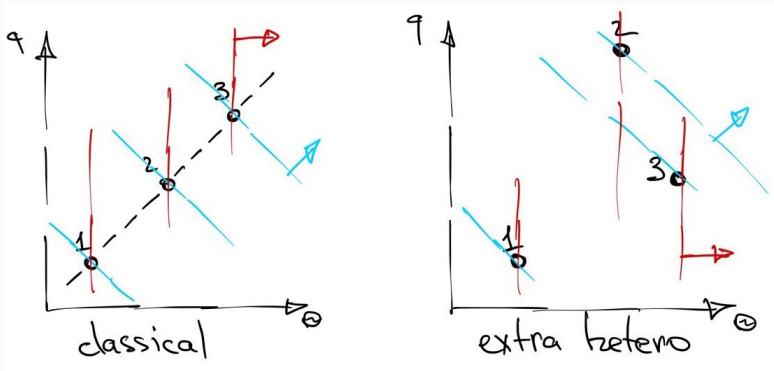
As you can see, **winner's costs increase, but shading decrease**, leaving the discounts virtually unchanged (statistically insignificant).

Add heterogeneity

What to do?

Clearly, if I want to explain the paradox, I need to break the Revenue Equivalence, at the very least. But all classical models have RE.

To break RE, I need to make sure that the ranking of firms changes, when I switch from price-only to scoring (when I change the scoring weight α).



Heterogeneity

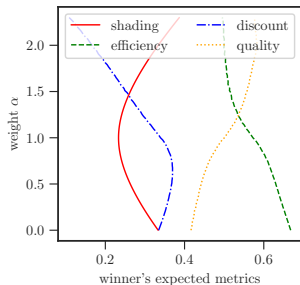
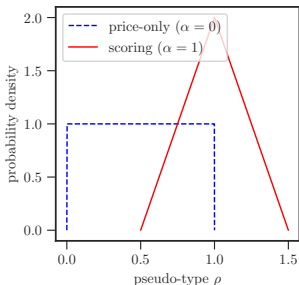
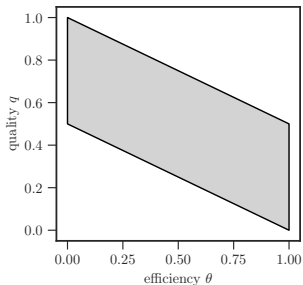
Finally, we need an example, where the shrinking of informational rents is greater than the rise in costs. This was not easy.

design (weight)	equilibrium pseudo-type distribution	expected winner's efficiency	expected winner's shading	expected winner's discount
price only ($\alpha = 0$)	$\rho, \rho \in (0, 1)$	40/60	20/60	20/60
scoring ($\alpha = 1$)	$\begin{cases} 2\rho^2 - 2\rho + 1/2 \\ -7/2 + 6\rho - 2\rho^2 \end{cases}$	37/60	14/60	23/60

But perhaps a visual representation is easier...

Heterogeneity

The idea is that the equilibrium distribution of cost ($c = 1 - \theta$) and quality should be such that the pseudo-type distribution is more concentrated for ($\rho = q + \theta$) than for ($\rho = \theta$).



This will produce the necessary effect of **shrinking profit margins**.

Negative correlation

Heterogeneity

You probably noticed that the correlation between **quality and cost-efficiency** was somewhat negatively correlated.

It is a version of something which is referred to in the literature as

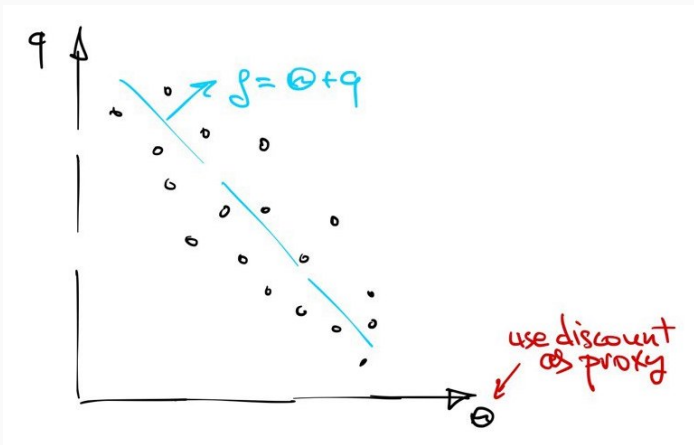
- **adverse selection**
- or **quality considerations** see Lopomo Persico Villa (2023).

In layman terms, it means that the firm which is cost-efficient is not necessarily the best in terms of quality.

Not only **it does make sense**, it was the whole point of running the reform in the first place!

Heterogeneity

This is cool, but are we ready to confront it with the data?



Heterogeneity

The data confirms this hypothesis...

<i>Dependent variable: discount</i>						
	(1)	(2)	(3)	(4)	(5)	(6)
quality	0.442*** (0.078)	0.478*** (0.069)	0.477*** (0.070)	-0.320** (0.128)	-0.355*** (0.069)	-0.357*** (0.068)
rank				-3.272*** (1.134)	-3.575*** (0.607)	-3.609*** (0.596)
quality * rank				0.017 (0.013)	0.019*** (0.007)	0.019*** (0.007)
Constant	-18.733*** (6.780)	-22.202*** (6.122)	-23.496*** (6.825)	61.415*** (11.404)	63.462*** (6.073)	62.332*** (6.077)
Auction FE		✓	✓		✓	✓
Lot FE			✓			✓
Observations	495	495	495	495	495	495
R ²	0.062	0.311	0.321	0.580	0.891	0.898
Adjusted R ²	0.060	0.291	0.284	0.578	0.888	0.892

Note:

*p<0.1; **p<0.05; ***p<0.01

Thank you!
