Collusion by Exclusion in Public Procurement

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Motivation

- Public authorities in the EU spend around 14% of GDP on the purchase of services, works and supplies (≈ € 2 trillion per year)
- Bid rigging is considered to be a major threat to an efficient procurement process
- Literature mostly considers single-stage (standard) auction formats
 - Open auctions are more prone to collusion than sealed-bid auctions [Athey et al., 2011]
 - Minimum prices make it harder to collude [Chassang and Ortner, 2019]
- In practice an "invitation to quote" often precedes the actual auction
- Opening bids submitted there are used for preselection of bidders

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Do opening bids affect strategy and profitability of cartels?

Theory:

- Requesting opening bids results in a two-stage auction where a limited number of firms is allowed to proceed after the first stage
- In private value settings: auctioning off entry rights may increase efficiency, e.g. [Ye, 2007, Bhattacharya et al., 2014, Sweeting and Bhattacharya, 2015]
- In common value settings: a sealed-bid auction stage followed by an opening descending auction combines the best of two worlds, leads to aggressive price competition and low collusion incentives [Klemperer, 1998]³
- \Rightarrow We consider a different (and widely used) auction format for the entry stage and show that cartels may achieve higher cartel profits with preselection

³See also [Maurer and Barroso, 2011].

Contribution

Empirics:

- Detection of bid-rigging via collusion markers informed by theory [Bajari and Ye, 2003, Kawai and Nakabayashi, 2022, Chassang et al., 2022]
- Comparing different auction format w.r.t. cartel's ability to rig them
 - Open vs. closed [Athey et al., 2011]
 - minimum price [Chassang and Ortner, 2019]
 - \Rightarrow We use theory-informed collusion markers to make a new comparison both under competition and collusion

A reform in 2017 Slovakia allows us to observe outcomes for two-stage and standard auctions

Overview

1 Theory

2 Auction rules and reform

3 Empirical Analysis

- Data description
- Collusive marker
- Effect of the reform

4 Conclusion

Theory

- N risk-neutral firms $i \in \{1, ..., N\}$. $K \subset N$ coordinate their bids.
- Cost of providing a good to the procurer follows i.i.d. cumulative distribution function F(c) on support [c, c]
- Timeline:
 - (0) Procurer announces preselection rule $n \in \{1, ..., N\}$ and reserve price $r > \overline{c}$.
 - (1) **Preselection stage:** Each firm *i* submits a sealed bid $b_i \leq r$. *n* firms with lowest b_i get preselected
 - (2) **Main auction:** Preselected firms are allowed to participate in a modified English auction with opening bid b_i as binding first bid. The firm with the lowest final bid q_i wins.

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- Hence, in the main auction *(Lemma 1)*:
 - The firm with the lowest cost among preselected will win the main auction.
 - Final price will be either lowest cost among non-colluding rival firms or own opening bid.

Under competition, changing the preselection rule from n < N to N neither affects firm profits nor overall savings.

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Intuition:

- Bidding in the preselection stage is not restricting potential bids in the main auction, hence outcomes are the same
- Essentially: Revenue Equivalence since IPV setting with risk-neutral, symmetric and competitive agents, no entry cost.

Suppose there exists a cartel. If competitive rivals are not aware of it, changing the preselection rule from n < N to N decreases cartel profits and increases savings.

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Intuition:

- (Lemma 3) In case with preselection rule n < N, at least n cartel members submit the same cartel bid in equilibrium.
- Cartel members have nothing to lose from this strategy because only the lowest cartel bid matters for the main auction
- But coordinating on the same bid has the huge potential of being jointly preselected
- ⇒ With preselection a cartel can, in addition to eliminating competition from within the cartel, also eliminate competition from outside the cartel!

- The focus of the previous section is to show how cartels can exploit preselection
- But there is also a potential benefit of preselection in competitive settings
- Entry costs lead to endogenous entry into auctions
 - Then the number of bidders in the main auction is *random*:
 - **1** Too few bidders \rightarrow little competition
 - **2** Too many bidders \rightarrow not worth the total entry costs
- \Rightarrow Introducing preselection by an entry-rights auction may increase surplus as it ensures a more stable number of bidders
- ⇒ Under appropriate assumptions, our opening-bid format is revenue-equivalent to previously considered auction formats, but optimal collusive bidding strategy continues to hold

Main predictions:

- With preselection, frequent close bidding in the preselection stage is indicative of being a member of a partial bid-rigging cartel.
- 2 Joint participation of cartel firms is less likely without preselection compared to with preselection
- **3** Removing preselection is more beneficial for the procurement agency when a cartel is present

Auction rules and reform

E-Public Procurement Auctions and Reform in Slovakia



Empirical Analysis

Data

We have the universe of public procurement auctions published on ECS:



- Sample period is February 2016 January 2020: 77.694 auctions worth €1.2 billion
- \blacksquare > 6.000 distinct bidders, of which \approx 4500 won at least one auction
- > 3.000 procurement agencies from 1.300 different municipalities in Slovakia

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Collusive Markers exploit Suspicious Bid Pattern before the Reform

Step 1: With preselection, cartel members should bid closely to be able to exclude rivals

Close Bidding: Identify auctions where at least 3 firms submit bids in a value range of 0.1% of the reserve price of each other in the selection stage
[Robustness: consider 0.5% and 0.05%]

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Step 2: We are interested in colluders, not auctions per se

Potential Colluders: Mark firms as potentially collusive, if they frequently participate in close bidding: more than 90% of firms in our sample [Robustness: consider 85% and 95%]



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How well does this capture cartels?

Validation I: Overlap with convicted cartel



Validation II: Close bidding in stable groups



Validation III: Little competition in main auction



Regression specification:

 $CartelOpponent_{ia} = \alpha_0 + \alpha_1 Post + \alpha_2 PotentialColluder_i \times Post$ (1) + $\gamma_t + \delta_p + \theta_c + \omega_i + \epsilon_{ia},$

- γ_t : Year and Months FE
- δ_p : Procurer FE
- θ_c : CPV category FE
- ω_i : Bidder FE
- Standard errors clustered at the bidder level



The Effect of the Reform on Facing Colluder

With Preselection Without Preselection Probability of facing potential colluder .1 **Competitive bidders** 0 -.1 -.2 -.3 Collusive bidders -.4 -3 -2 12 .1 -1 q 10 11 Quarters from the reform

Auction is Potentially rigged if at least one colluder participates

Regression specification:

 $\begin{aligned} \text{Savings}_{a} &= \alpha_{0} + \alpha_{1} \text{Post} + \alpha_{2} \text{PotentiallyRigged}_{a} \times \text{Post} \\ &+ \alpha_{3} \text{PotentiallyRigged}_{a} + \beta_{1} \text{Bidder} \# 2_{a} + \beta_{2} \text{Bidder} \# 2_{a} \times \text{Post}_{t} \\ &+ \beta_{3} \text{Bidder} \# 3_{a} + \beta_{4} \text{Bidder} \# 3_{a} \times \text{Post}_{t} \\ &+ \beta_{5} \text{Bidder} \# 4_{a} + \beta_{6} \text{Bidder} \# 4_{a} \times \text{Post}_{t} \\ &+ \beta_{7} \text{Bidder} \# 5_{a} + \beta_{8} \text{Bidder} \# 5_{a} \times \text{Post}_{t} + \gamma_{t} + \delta_{p} + \theta_{c} + \epsilon_{i}, \end{aligned}$



(2)

The Effect of the Reform on Savings



So how much did bid rigging cost the procurement authorities?

- In the year before the reform, contracts with a total value of €256 million were published on the platform
- Auctions where a collusive bidder participated were worth \in 73.1 million
- Procurement agencies ended up paying €63.6 million: Savings of €9.5 million
- Their savings could have been 14.7% higher on these contracts had they introduced post-reform rules one year earlier

Conclusion

Cartels can exploit preselection rules and thereby decrease savings below what would be possible without preselection

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- The profitability of selective procedures, among others, depends on the prevalence of cartels in the bidder population
- Procurement agents need to strike the right balance

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Some Background on Slovakia

- Attractive data: the system reliably tracks the identity of procurer and bidder and is one of the most transparent
- Comparable to other European countries according to indicators based on different public procurement aspects (competitiveness, transparency, SME inclusion)

2. Overall performance (all 12 indicators combined)



Leaflet | Credit: EC-GISCO, @ EuroGeographics @ UN-FAO for the administrative boundaries

⁴https://ec.europa.eu/internal_market/scoreboard/_docs/2019/performance_per_policy_area/ public_procurement_en.pdf



| | (1) | | | (2) | | (3) | | (4) | | |
|-----------------------------|--------|-------------|------|---------|-----------------|--------|----------------|--------|------------------------|--|
| | | Full Sample | | | Before Feb 2017 | | After Feb 2017 | | Difference $(2) - (3)$ | |
| | Mean | SD | min | max | Mean | SD | Mean | SD | b | |
| Savings | 0.14 | 0.17 | 0.00 | 1.00 | 0.15 | 0.17 | 0.13 | 0.17 | 0.01*** | |
| Savings realized in Stage 1 | 0.05 | 0.11 | 0.00 | 1.00 | 0.10 | 0.15 | 0.03 | 0.08 | 0.07*** | |
| Reserve price (k€) | 15.50 | 37.37 | 0 | 1860.00 | 10.80 | 30.27 | 17.56 | 39.92 | -6.76*** | |
| Final bid (k€) | 14.33 | 35.224 | 0 | 1855.00 | 9.93 | 28.72 | 16.26 | 37.60 | -6.33*** | |
| Notified contractors | 418.09 | 209.20 | 0.00 | 2396.00 | 432.96 | 217.04 | 411.56 | 205.32 | 21.40*** | |
| No. of bidders | 3.10 | 2.09 | 1.00 | 24.00 | 3.37 | 2.44 | 2.99 | 1.91 | 0.39*** | |
| No. of bidders in Stage 2 | 1.57 | 1.46 | 0.00 | 11.00 | 1.20 | 1.16 | 1.73 | 1.55 | -0.52*** | |
| No. of bids in Stage 2 | 26.12 | 55.80 | 0.00 | 2185.00 | 17.94 | 42.67 | 29.70 | 60.32 | -11.76*** | |
| Observations | 77694 | | | | 23701 | | 53993 | | 77694 | |

Table: Summary statistics

Notes: The table summarizes auction-level variables for the sample used in our analysis, covering auctions on the EKS platform from February 2016 to January 2020. * p < 0.05, ** p < 0.01, *** p < 0.001

Mechanical Effect of the Reform



First look at the reform: Huge shift in Competition



Back

Fined firms

- In May 2021, the competition authority convicted 6 companies of rigging EKS auctions
- Court case describes derived strategy: cartel members bid in groups of 3 with close opening bids, inactive afterwards
- Case was supported by hard evidence: bidding from the same IP address
- We correctly predict 5 out of 6 colluding firms
- 276 auctions investigated (251 pre-reform, 23 post-reform)
- 6 firms, highly asymmetric in size
- Biggest firm ca. 200 employes, revenue €10 million, manufacturing of workwear, shoes, gloves
- \blacksquare The rest much smaller <15 employees, retail
- 2 most active won contracts worth of ca. €1.5 million EUR, fined only €162.000 and €8.600
- Largest firm participated in 10 and won 1 contract (\in 5.900) but fined \in 0.9 million

| | (1) No rivals present | | (2) Rivals excluded | | (3) Rivals not excluded | | (4) Rivals not excluded | |
|----------------------|--------------------------|------|------------------------|-------|----------------------------|-------|----------------------------|-------|
| | | | | | | | | |
| | Mean | SD | Mean | SD | Mean | SD | Mean | SD |
| Savings | 0.03 | 0.04 | 0.12 | 0.12 | 0.28 | 0.13 | 0.20 | 0.18 |
| Preselection savings | 0.03 | 0.04 | 0.12 | 0.12 | 0.24 | 0.14 | 0.14 | 0.15 |
| Reserve price | 7.53 | 6.66 | 12.14 | 22.35 | 10.24 | 15.44 | 11.92 | 18.36 |
| Winning bid | 7.32 | 6.61 | 11.90 | 22.24 | 9.83 | 14.59 | 11.55 | 17.58 |
| Main auction bidders | 0.19 | 0.54 | 0.05 | 0.37 | 1.57 | 1.15 | 1.66 | 1.06 |
| Preselection bidders | 2.53 | 0.77 | 5.67 | 2.32 | 6.02 | 2.50 | 4.66 | 2.54 |
| Total bids | 2.90 | 1.28 | 8.37 | 6.60 | 19.16 | 19.60 | 31.05 | 48.76 |
| Cartel bidder | 2.53 | 0.77 | 3.01 | 0.12 | 3.02 | 0.15 | 1.31 | 0.47 |
| Cartel winner | 1.00 | 0.00 | 1.00 | 0.00 | 0.27 | 0.45 | 0.72 | 0.45 |
| Observations | 73 | | 73 | | 44 | | 61 | |

The Effect of the Reform on Facing Colluder 🚥

| | (1) | (2) | (3) | (4) |
|----------------------------|----------|-----------|----------|-----------|
| | OLS | OLS | OLS | OLS |
| Post | -0.031** | -0.009 | 0.006 | 0.033* |
| | (0.012) | (0.012) | (0.014) | (0.014) |
| | | | | |
| Pot. Colluder $	imes$ Post | | -0.219*** | | -0.195*** |
| | | (0.045) | | (0.050) |
| | | | | |
| Constant | 0.258*** | 0.256*** | 0.252*** | 0.250*** |
| | (0.006) | (0.006) | (0.006) | (0.006) |
| Bidder FE | yes | yes | yes | yes |
| Month FE | yes | yes | yes | yes |
| Year FE | yes | yes | yes | yes |
| Procurer FE | yes | yes | yes | yes |
| CPV Category FE (2-digit) | yes | yes | no | no |
| CPV Category FE (full) | no | no | yes | yes |
| Adj. R2 | 0.34 | 0.34 | 0.44 | 0.44 |
| Avg. Outcome | 0.21 | 0.21 | 0.21 | 0.21 |
| Ν | 182724 | 182724 | 112944 | 112944 |

Standard errors in parentheses

* p < 0.05, ** p < 0.01, *** p < 0.001

The Effect of the Reform on Savings 🔤

| | (1) | (2) | (3) | (4) |
|----------------------------|----------|----------------------|----------|----------------------|
| | OLS | OLS | OLS | OLS |
| Post | -0.018** | -0.018** | -0.007 | -0.007 |
| | (0.006) | (0.006) | (0.008) | (0.008) |
| Potentially rigged | | -0.053*** (0.003) | | -0.032*** (0.004) |
| Pot. rigged \times Post | | 0.018*** (0.004) | | 0.019*** (0.005) |
| Bidder #2 | 0.087*** | 0.090*** | 0.090*** | 0.092*** |
| | (0.002) | (0.003) | (0.003) | (0.003) |
| Bidder #3 | 0.067*** | 0.072*** | 0.064*** | 0.067*** |
| | (0.004) | (0.004) | (0.004) | (0.004) |
| Bidder #4 | 0.044*** | 0.046*** | 0.037*** | 0.039*** |
| | (0.005) | (0.004) | (0.005) | (0.005) |
| Bidder #5 | 0.067*** | 0.075*** | 0.061*** | 0.067*** |
| | (0.004) | (0.004) | (0.005) | (0.005) |
| Bidder $\#2$ \times Post | -0.006* | -0.007** | -0.012** | -0.013*** |
| | (0.003) | (0.003) | (0.004) | (0.004) |
| Bidder #3 \times Post | 0.011** | 0.008 | 0.015** | 0.012* |
| | (0.004) | (0.004) | (0.005) | (0.005) |
| Bidder #4 \times Post | 0.001 | 0.000 | 0.006 | 0.005 |
| | (0.005) | (0.005) | (0.006) | (0.006) |
| Bidder $\#5$ \times Post | 0.019*** | 0.013* | 0.015* | 0.012 |
| | (0.005) | (0.005) | (0.006) | (0.006) |
| Constant | 0.022*** | 0.024*** | 0.021*** | 0.023*** |
| | (0.002) | (0.002) | (0.003) | (0.003) |
| Month FE | yes | yes | yes | yes |
| Year FE | yes | yes | yes | yes |
| CDV Catagory EE (2 digit) | yes | yes | yes | yes |
| CPV Category FE (2-digit) | yes | yes | 110 | 10 |
| Adi R2 | 0.38 | 0.30 | 0.45 | 0.46 |
| Avg. Outcome | 0.14 | 0.14 | 0.14 | 0.14 |
| N | 59101 | 59101 | 37046 | 37046 |

Standard errors in parentheses

* $\rho < 0.05$, ** $\rho < 0.01$, *** $\rho < 0.001$