

Bhattacharya et al. (2022):  
Bidding and Drilling under Uncertainty: An Empirical Analysis  
of Contingent Payment Auctions

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# Motivation: Auction Design and Post-Auction Investment

- The winner's payment in auction is **contingent** on the asset's future cash flows.
    - **Oil & Gas Leases:** Upfront bonus + royalty on production revenue.
    - **Timber Auctions:** Payment based on amount/type of wood harvested.
    - **Procurement:** Contracts with cost-overrun clauses.
  - This creates a direct link: **Auction design** → **Post-auction investment incentives** → **Bidders' valuations**.
- ⇒ This link is largely unexplored in the empirical auction literature.

# Research Question

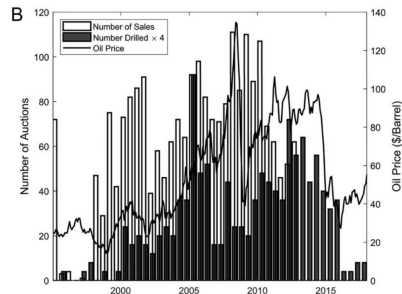
How does auction design affect both seller revenue and the winner's subsequent decision to drill for oil?

- Cash auction: bid on cash payment
- Bonus auction: bid on cash + a fraction of future cashflow (pre-specified royalty)
- Equity auction: bid on the fraction of future cashflow
- Debt auction: bid on cash payment conditional on drilling

# New Mexico Oil Auctions

- New Mexico State Land Office (NMSLO) for oil exploration leases in the Permian Basin
  - Bonus auction with Bid-Bonus and Fixed-Royalty  $\phi$
  - The highest bidder wins the lease
  - $\phi$  is fixed by the NMSLO before the auction (typically  $1/8$  or  $1/6$ )
  - If the winner drills and produces oil, they pay  $\phi \times (\text{Revenue})$  to the state
  - The lease grants the right, but not the obligation, to drill within a five-year period
- Data sources
  - NMSLO auction data: bids, bidders, location
  - Drillinginfo data: well spud dates, location
  - FRED oil prices

# Data Overview: Drilling Activities



- The sample period sees huge fluctuations in oil prices.
- Both winning bids and drilling frequency appear to track the price of oil closely. This motivates a model where prices are a key state variable.

# A Two-Stage Model of Bidding and Drilling

Linking the auction (bidding stage) to the subsequent investment problem (drilling stage).

## Stage 2: Drilling Decision

- After winning, the firm learns the true oil quantity  $q$  and its private drilling cost  $c_i$ .
- It then faces an **optimal stopping problem**: when (if ever) to drill before the lease expires at time  $T$ .
- The winner chooses a stopping time  $\tau \leq T$  to maximize expected discounted profit.

## Stage 1: Bidding Decision

- Bidders have a common value for the quantity of oil,  $q$ .
- Each bidder  $i$  receives a private signal  $\tilde{q}_i = q\xi_i$ .
- Bidders are forward-looking: their value for winning the lease is the expected value from the drilling stage.
- They account for the "winner's curse."

# The Drilling Stage: An Optimal Stopping Problem

- The price of oil,  $P_t$ , evolves stochastically according to a geometric Brownian motion:

$$\frac{dP_t}{P_t} = \mu_p dt + \sigma_p dB_t$$

- If the winner drills at time  $\tau$ , her payoff is  $(1 - \phi)P_\tau q - c_i$ .
- The ex-ante value of the drilling option for a winner with cost  $c_i$  is:

$$V(q, c_i) = \max_{\tau \leq T} \mathbb{E}_{P_0} [e^{-r\tau} ((1 - \phi)P_\tau q - c_i)^+]$$

where  $(\cdot)^+ = \max(\cdot, 0)$ .

## Optimal Drilling Rule

The winner drills at the first time  $t$  that the oil price  $P_t$  hits a time-dependent threshold  $P_t^*(c_i/q)$ . This threshold is higher for tracts with higher unit costs  $(c_i/q)$ .

# The Bidding Stage: Common Values

- A bidder's value for winning, given true quantity  $q$ , is the expected value from the drilling stage, integrated over their private cost distribution  $H(\cdot; q)$ :

$$v(q) = \mathbb{E}_{c \sim H(\cdot, q)}[V(q, c)]$$

- Bidders submit bids  $b(\tilde{q}_i)$  to maximize expected profit, conditional on their signal and on winning the auction. The problem for bidder  $i$  is:

$$\max_b \left( \mathbb{E}_q[v(q) - X - b \mid \tilde{q}_i, \text{win}] \right) \cdot \Pr(\text{win} \mid \tilde{q}_i)$$

## Key Feature: Value Endogeneity

A bidder's value  $v(q)$  is not a primitive. It is an **endogenous** object that depends directly on the auction design (e.g., the royalty rate  $\phi$ ).



# How Auction Design Changes the Value Function

The paper considers several alternative auction designs, which change the winner's payoff and thus the value of the lease.

- **Bonus Auction (Baseline):** Royalty  $\phi$  is fixed. Bid is an upfront cash bonus.

$$V(q, c) = \max_{\tau \leq T} \mathbb{E}_{P_0} [e^{-r\tau} ((1 - \phi)P_\tau q - c)^+]$$

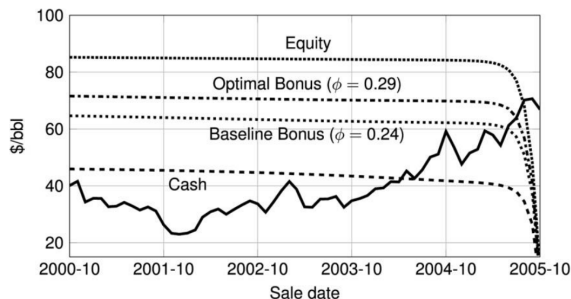
- **Cash Auction:** Fixed Royalty  $\phi = 0$ . Bid is an upfront cash bonus.
- **Equity Auction:** Bidders bid the royalty rate  $\phi^{\text{Equity}}$ . The winner is the one who bids the highest royalty.

$$V(q, c)^{\text{Equity}} = \max_{\tau \leq T} \mathbb{E}_{P_0} [e^{-r\tau} ((1 - \phi^{\text{Equity}})P_\tau q - c)^+]$$

- **Debt Auction:** Bidders bid a dollar amount  $d$ . The winner pays  $\min(d, \text{Revenue})$ .

$$V(q, c)^{\text{Debt}} = \max_{\tau \leq T} \mathbb{E}_{P_0} [e^{-r\tau} (P_\tau q - c - d)^+]$$

# Auction Design Changes the Drilling Decision



- Higher royalty rates (e.g., Bonus  $\phi = 0.26$  vs.  $\phi = 1/6$ ) or royalty bids (Equity) raise the price threshold, delaying or preventing investment.
- A pure cash auction ( $\phi = 0$ ) provides the strongest incentive to drill.

# Identification Strategy

## Intuition from an Affiliated Private Values Model:

### (1) Drilling Delays identify Unit Costs:

- The optimal drilling rule,  $P_t = P_t^*(c/q\xi)$ , creates a one-to-one mapping between the drilling delay ( $\tau$ ) and the effective unit cost ( $c/q\xi$ ).
- Thus, the observed distribution of drilling delays identifies the distribution of unit costs.

### (2) Bids identify Total Value:

- Standard results (Guerre, Perrigne, Vuong 2000; Li et al. 2002) show that the distribution of bids identifies the distribution of bidders' total values,  $v_i = b_i + \frac{G(b_i|b_i)}{g(b_i|b_i)}$
- Total Value = (Quantity)  $\times$  (Per-Unit Profit).

$$v_i = (1 - \phi)q\xi_i \cdot \mathbb{E}[\text{Per-Unit Profit}] - X$$

- Since we identify per-unit profit from delays (step 1) and total value from bids (step 2), we can back out the distribution of quantities  $q\xi_i$ .

# What if New Mexico Used a Different Auction Design?

## Alternative Designs Considered:

- (1) **Baseline Bonus:** The actual design ( $\phi = 1/6$ ).
- (2) **Equity:** Bidders bid the royalty rate  $\phi$ . Winner is highest  $\phi$ .
- (3) **Debt:** Bidders bid a dollar amount  $d$ . Winner pays  $\min(d, \text{Revenue})$ .
- (4) **Cash:** A bonus auction with  $\phi = 0$ .
- (5) **Revenue-Optimal Bonus:** A bonus auction where the seller sets  $\phi$  to maximize total revenue ( $\phi^* = 0.29$ ).

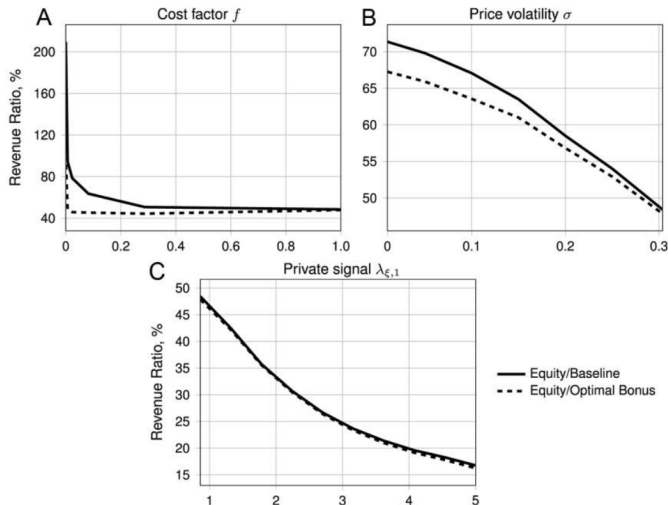
# Counterfactual Results: Revenue and Drilling

Security Type	Winning Bid	Revenue (\$K)		Pr(Drilling)	Drilling Delay(Days)	Total Oil
		Royalty	Total			
Pure cash	\$135,400	0	135.4	0.174	1,277	13,396
<b>A. Bonus:</b>						
Baseline bonus	\$79,900	129.2	209.1	0.118	1,353	9,273
Revenue-optimal bonus ( $\phi^* = 0.29$ )	\$71,000	140.5	211.6	0.105	1,363	8,319
<b>B. Equity:</b>						
Equity without land fees	38.6%	101.3	101.3	0.060	1,490	4,159
Revenue-optimal equity ( $K^* = \$110,000$ )	7.8%	91.1	146.8	0.103	1,309	8,438
<b>C. Debt:</b>						
Debt without land fees	\$581,400	53.6	53.6	0.023	1,688	3,017
Revenue-optimal debt ( $K^* = \$290,000$ )	\$59,100	49.2	138.4	0.062	1,391	6,286

## Key Findings:

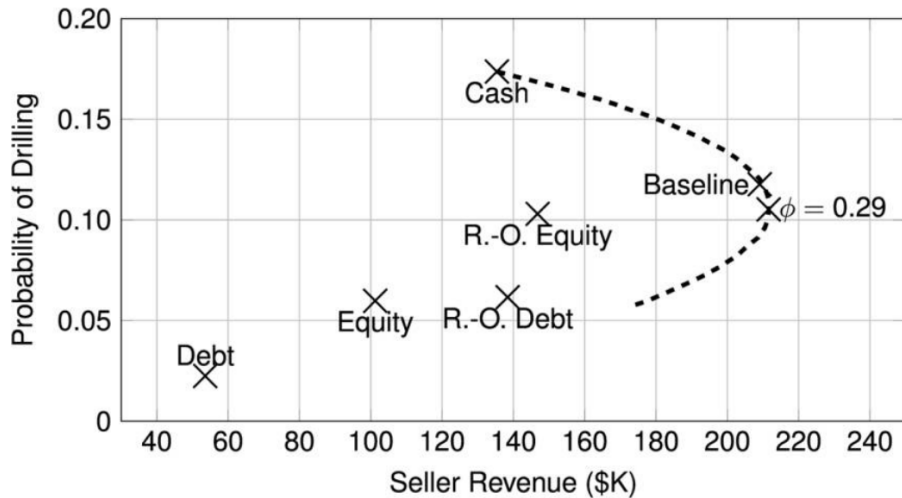
- **Bonus auctions outperform Equity and Debt** in both total revenue and drilling activity.
- **There is a revenue-drilling tradeoff.** The revenue-optimal bonus auction raises more money but leads to a 23% reduction in drilling compared to the baseline.
- The **Cash** auction maximizes drilling but leaves significant revenue on the table.

# Revenue and Drilling vs. Winner's Signal (for fixed $q$ )



- The revenue-optimal bonus auction generates the highest revenue across all initial price levels.
- Drilling activity under Equity and Debt is almost completely unresponsive to price, as high bids choke off investment.

# Revenue vs. Employment



# Conclusion

- This paper provides the first empirical analysis that structurally links contingent payment auction design to endogenous post-auction investment.
  - (1) **Auction design has a material impact on real economic activity.** It affects not just revenue, but also the rate and timing of oil drilling.
  - (2) **Bonus auctions appear superior to equity or debt auctions** in this setting. They generate more revenue and spur more investment by mitigating the "winner's curse on moral hazard."
  - (3) **A key policy tradeoff exists.** The revenue-maximizing bonus auction involves a higher royalty rate that increases government revenue but reduces drilling activity. The current policy ( $\phi = 1/6$ ) represents a balance between these two objectives.



# References I

Bhattacharya, V., A. Ordin, and J. W. Roberts (2022). Bidding and drilling under uncertainty: An empirical analysis of contingent payment auctions. *Journal of Political Economy* 130(5), 1319–1363.