

# Welfare Effects of Buyer and Seller Power

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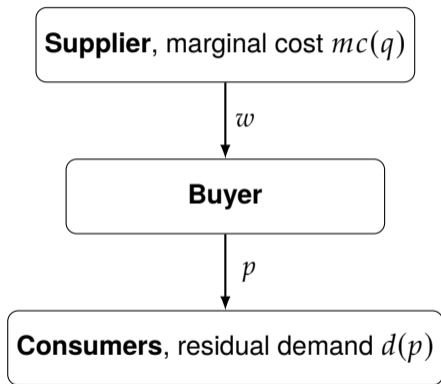
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**When are buyer & seller power anti-competitive or pro-competitive?**

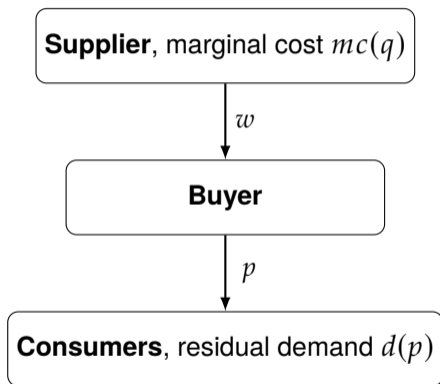
## Stylized Framework



- Single supplier and buyer
- Supplier sells  $q$  units to buyer at  $w$
- Buyer sells  $q$  to consumers at  $p$

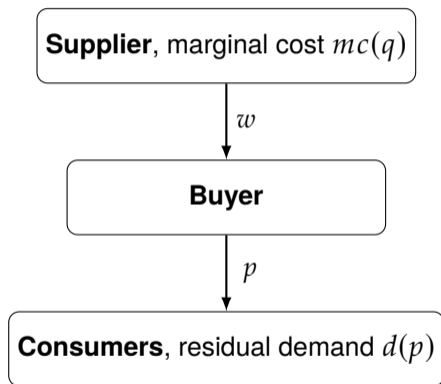


## Stylized Framework: Classical Monopsony



- $mc'(q) > 0$
- $d'(p) = 0$
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- Inefficiency: **buyer exercises monopsony power** when setting  $w$

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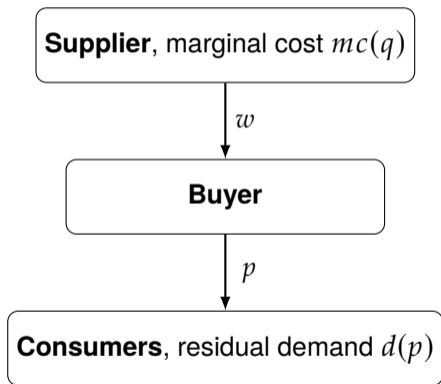


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### Examples:

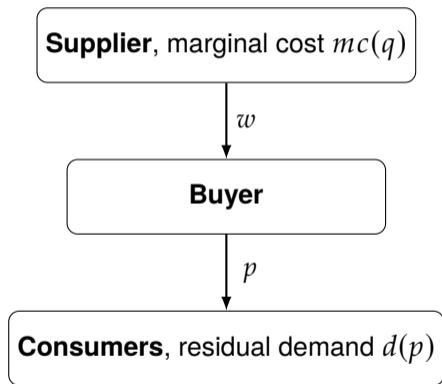
- Robinson (1969); Card, Cardoso, Heining, Kline (2018); Berger, Herkenhoff, Mongey (2022)

## Stylized Framework: Sequential Monopoly



- $d'(p) < 0$
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### Examples:

- Grennan (2013), Ho and Lee (2017); Crawford, Lee, Whinston, Yurukoglu (2018); Hosken, Larson-Koester, Tarragin (2023)

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- Increasing marginal cost of seller  $mc'(q) \geq 0$  , decreasing demand curve of buyer  $d'(p) \leq 0$
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- Conduct (**monopsony** or **monopoly**) is endogenously determined
- Nests most commonly used vertical models in the literature

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## Application to coal procurement of power plants from coal mines

- ERCOT ISO (Texas) market, 2005-2015
- Rich data on upstream + downstream cost curves
- Observe transacted wholesale prices + contract information

# Contribution to the Literature

## 1. **Empirical models of bargaining**

- Ho, Lee (2017); Crawford, Lee, Whinston, Yurukoglu (2018); Collard-Wexler, Gowrisankaran, Lee (2019); Alviarez, Fioretti, Kikkawa, Morlacco (2022), Hosken, Larson-Koester, Tarragin (2023) ;

→ These assume downstream picks  $p$  (or  $q$ ), double marginalization due to upstream monopoly power



# Contribution to the Literature

## 1. Empirical models of bargaining

## 2. Monopsony/oligopsony models:

- Prager & Schmitt (2021); Arnold (2019); Berger, Hasenzagl, Herkenhoff, Mongey, & Posner, (2023)

→ These assume upstream chooses its supply, double marginalization due to downstream monopsony power.

# Contribution to the Literature

1. **Empirical models of bargaining**

2. **Monopsony/oligopsony models:**

3. **Countervailing power:**

- Galbraith (1954), Hemphill & Rose (2018); Barrette, Gowrisankaran, Town (2022), Loertscher & Marx (2022)

→ We allow for countervailing power in complete-information Nash-in-Nash bargaining models

# Contribution to the Literature

1. **Empirical models of bargaining**
2. **Monopsony/oligopsony models:**
3. **Countervailing power:**
4. **Vertical conduct inference:**
  - Bonnet & Dubois (2010), De Loecker & Scott (2015), Atkin, Blaum, Fajgelbaum, Ospital, 2024
  - Rather than testing for conduct in equilibrium, we present a model in which vertical conduct is a function of the model primitives

## Model Primitives

Seller  $u$  and buyer  $d$  negotiate over **linear contract**  $w$ .

- Profits:  $\pi_d = [p(q) - w]q$ ,  $\pi_u = [w - c(q)]q$ . Zero disagreement payoff.

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### **Assumptions:**

- Decreasing and concave downstream demand  $p'(q) \leq 0, p''(q) \leq 0$
- Increasing and convex upstream average costs  $c'(q) \geq 0, c''(q) \geq 0$

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### Notation:

- $mc(q) \equiv \frac{\partial(c(q)q)}{q}$ ,  $mr(q) \equiv \frac{\partial(p(q)q)}{q}$
- $0 \leq \beta \leq 1$ : bargaining power of buyer, 'buyer power'

# Possible Conduct Types

Two possible types of 'vertical conduct':

**'Monopolistic bargaining' ('mpl'):**  $\begin{cases} \max_w (\pi_u)^{(1-\beta)} (\pi_d)^\beta \\ \max_q \pi_d \end{cases} \rightarrow (q^{mpl}, w^{mpl})$

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We will compare to, but do not allow for, **joint profit maximization ('jpm')**:

$$q^{jpm} = \arg \max_{w,q} (\pi_u)^{(1-\beta)} (\pi_d)^\beta \rightarrow (q^{jpm}, w^{jpm})$$

# Timing Assumptions

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1. Upstream and downstream observe  $c(\cdot), p(\cdot), \beta$
2. Upstream **or** downstream choose  $q$ , simultaneously they bargain over  $w$

## Extension: Sequential Model

Alternatively, consider sequential model:

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This nests often-used models:

	<b>Monopolistic</b>	<b>Monopsonistic</b>
$\beta = 0$	Sequential monopoly	Seller makes TIOLI offer $(w, q)$
$\beta = 1$	Buyer makes TIOLI offer $(w, q)$	Classical monopsony

## Result 1: Existence of Equilibrium

**Result** 'Nash-in-Nash' (Horn & Wolinsky, 1988) equilibrium: equilibrium conditions

- $c'(q) = 0$ : equilibrium only exists under **monopolistic conduct**
- $d'(p) = 0$ : equilibrium only exists under **monopsonistic conduct**
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Denote  $q^{mps}(\beta), q^{mpl}(\beta)$  as equilibrium output under each conduct

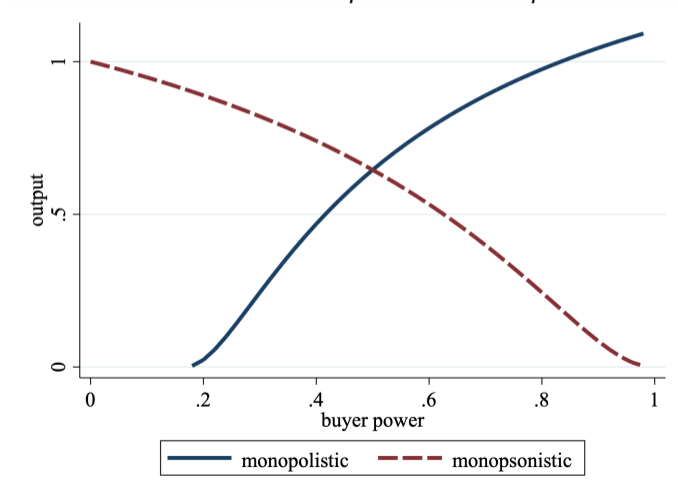
## Result 2: How does Equilibrium Quantity Changes with Buyer Power

**Result:**  $q'(\beta)$  depends on conduct:  $\frac{\partial q^{mpl}(\beta)}{\partial \beta} \geq 0$ ,  $\frac{\partial q^{mps}(\beta)}{\partial \beta} \leq 0$

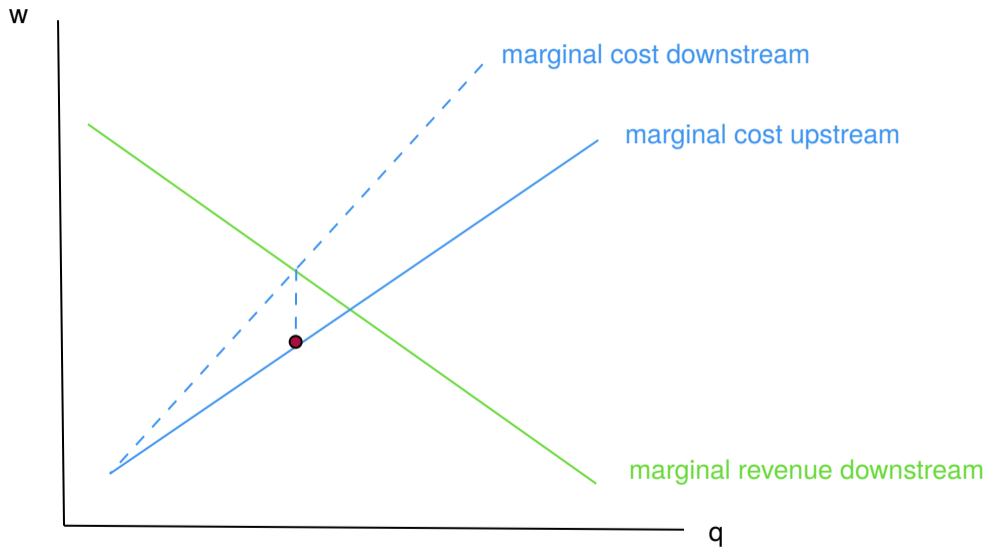


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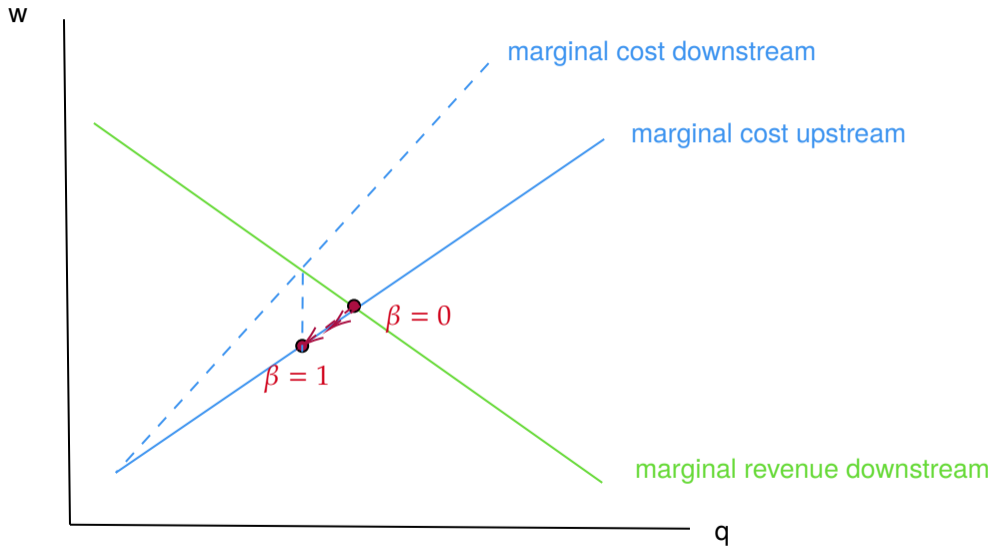
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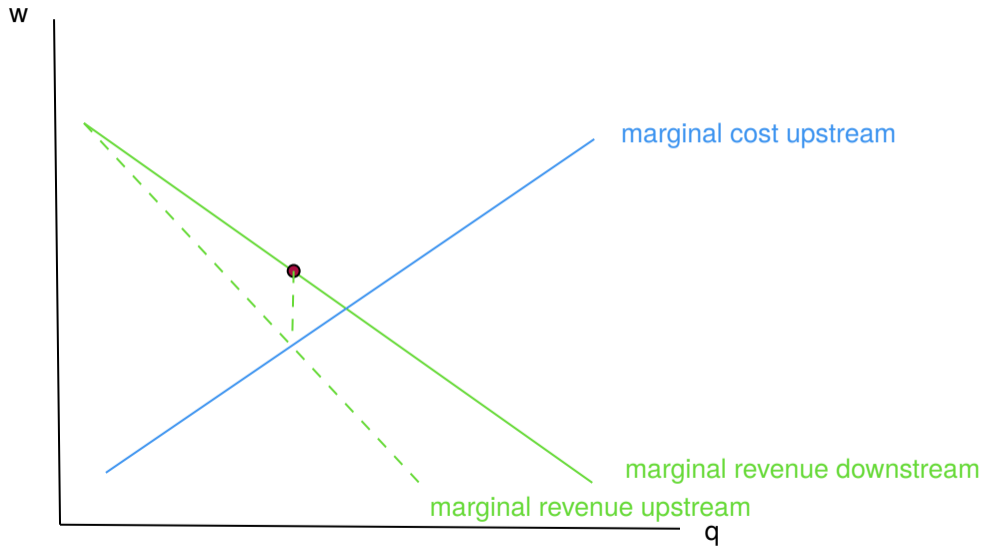
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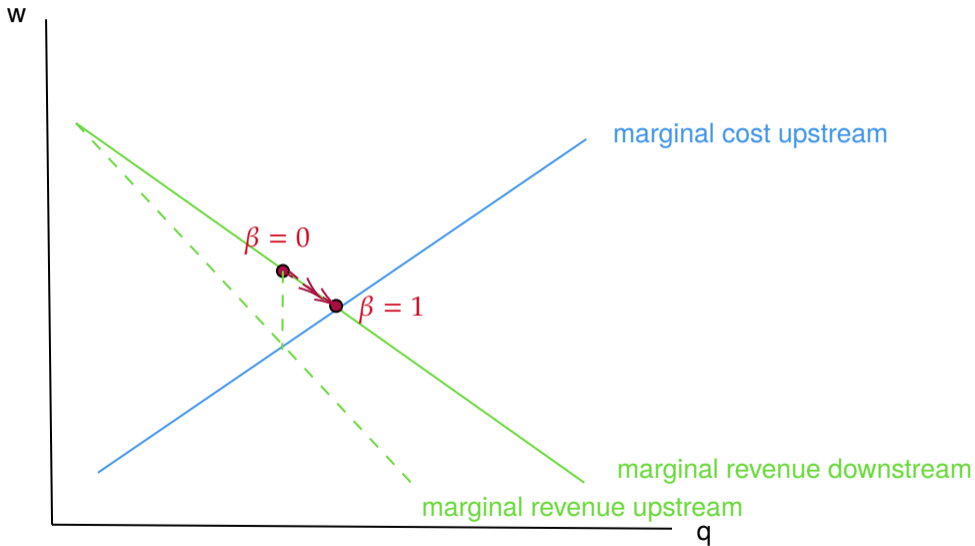
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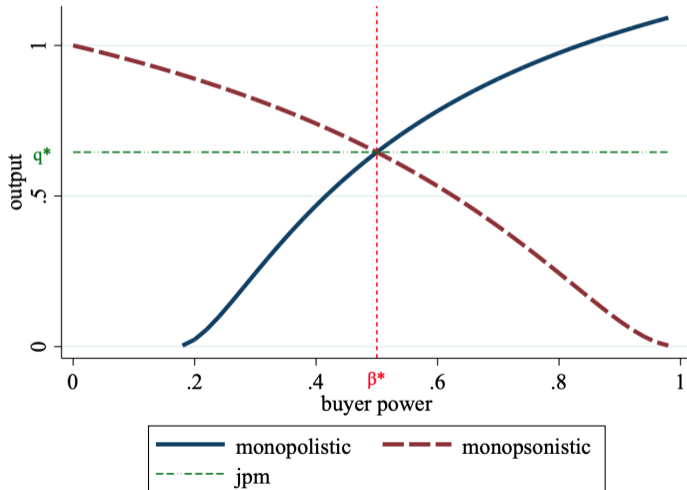


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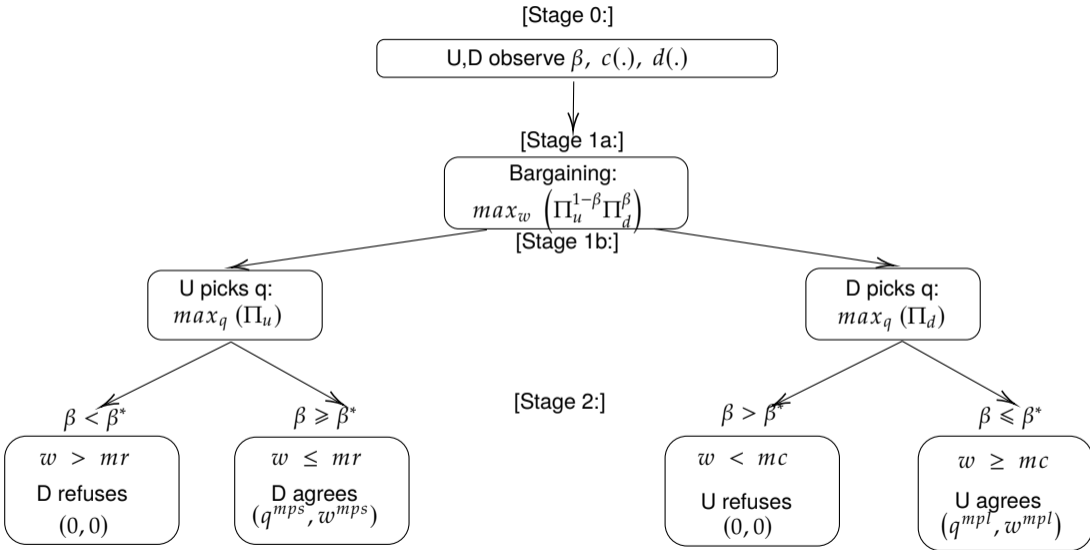
·  $w \geq mc(q)$  (A1)

·  $w \leq mr(q)$  (A2)

This has two relevant implications:

- Output bounded by  $q^{jpm}$  (testable)
- Output-setting party cannot improve by moving to JPM

# Game tree

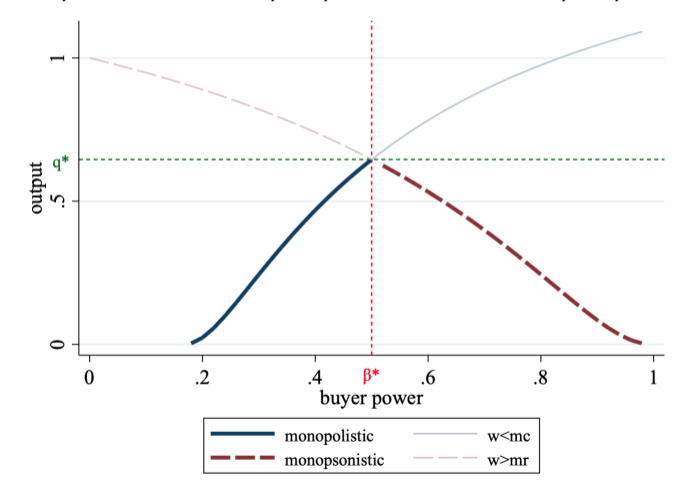


## Result 4: Unique Vertical Conduct

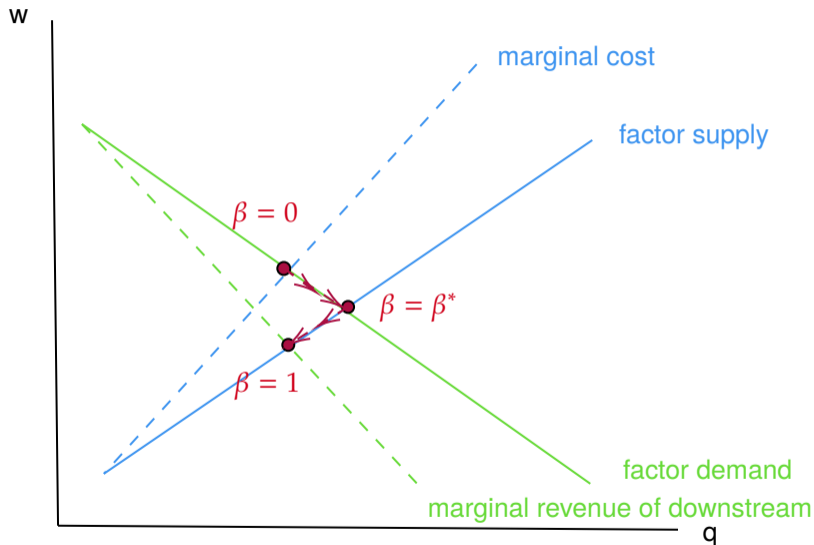
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## Intuition: Buyer and Seller Power



## Vertical Conduct: Determinants

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$$\beta^* = \frac{-p'(q^*)}{c'(q^*) - p'(q^*)}$$

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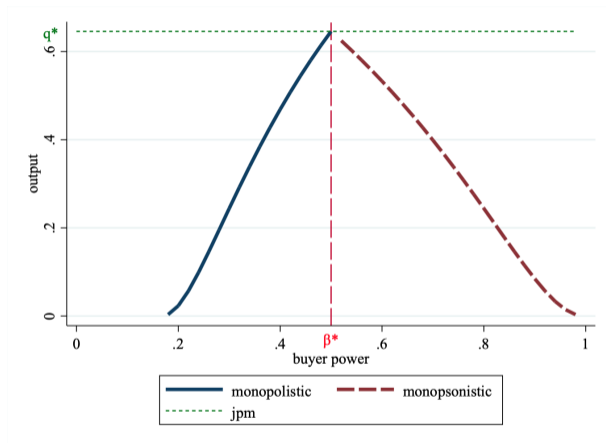
$\beta^*$  is a function of cost and demand curvature:

$$\beta^* = \frac{-p'(q^*)}{c'(q^*) - p'(q^*)}$$

- More inelastic demand ( $-p'(q^*) \uparrow$ )  $\rightarrow \beta^* \uparrow$
- Steeper marginal cost curve ( $c'(q^*) \uparrow$ )  $\rightarrow \beta^* \downarrow$
- $\beta^* = 0$  if fully elastic residual demand,  $\beta^* = 1$  if constant marginal cost



# Deadweight Loss



Parametrization

Deadweight loss as soon as  $\beta \neq \beta^*$ :

- **Buyer** power-induced if  $\beta > \beta^*$
- **Seller** power-induced if  $\beta < \beta^*$

# Generalizations

- **Multiple buyers** that compete à la Cournot

- # Competitors  $\Rightarrow \beta^* \downarrow$
- Increased competition makes residual demand curve more elastic
- This increases the range of  $\beta$  values for which monopsonistic conduct occurs in equilibrium

Cournot results

- **Sequential model**

- First bargaining, then output decision (as in Ho & Lee, 2019)
- Results generalize,  $q'(\beta)$  less steep, i.e. lowers deadweight losses

Sequential model results

- **Non-zero disagreement payoffs**

- Baseline: fix disagreement payoffs, vary  $\beta$
- Alternative: fix  $\beta$ , vary disagreement payoff of buyer ('z') & seller ('y')
- Results generalize:  $q(z - y)$  is inverted V-function

Disagreement payoff results

- **Alternative supergame** with JPM option

Game tree

## Takeaways

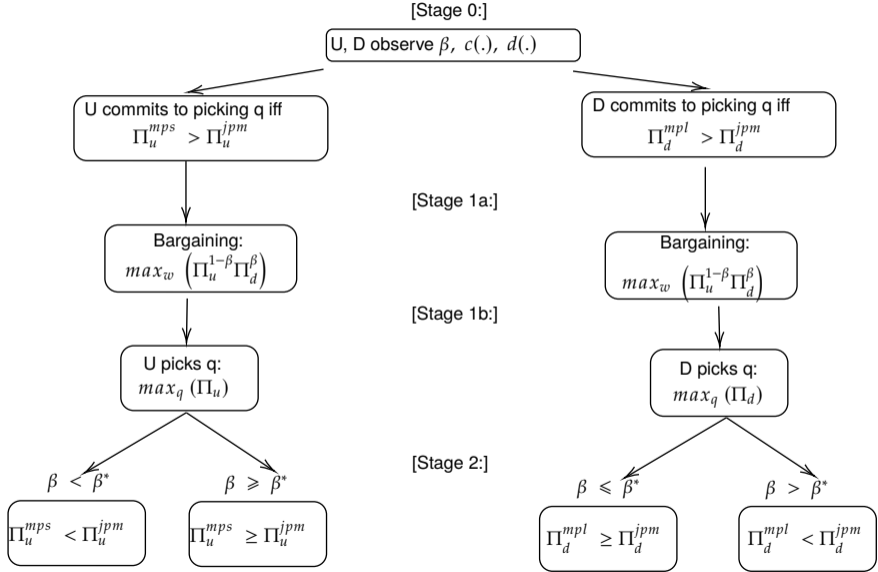
Consumer welfare losses of buyer / seller power depend on:

- shape of the marginal cost curve (upstream)
- shape of the demand curve (downstream)
- level of the bargaining parameter

Output is maximized when bargaining power is in the interior, except in extreme cases

Empirical question, requires knowledge of market primitives

# Alternative Game tree



back

## Empirical Application: Coal Procurement in ERCOT

- Study wholesale coal market in the US
- Focus on coal-fired power plants in the **ERCOT** ISO
- Objective: quantify deadweight loss, decompose into buyer and seller power
- Ideal empirical setting:
  - Transaction-level wholesale prices and quantities are observed
  - Upward sloping marginal cost of mining companies
  - Estimate upstream and downstream marginal cost curves using rich cost data

# Data

1. **Power Plant Data**: EPA, EIA, Velocity Suite, ERCOT
  - Hourly fuel consumption and generation
  - Fuel Type, Capacity, Location, Ownership
  - Hourly nodal prices

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1. **Power Plant Data**: EPA, EIA, Velocity Suite, ERCOT
  
2. **Coal Mine Data**: Mine Safety and Health Administration, Coal Cost Guide, Velocity Suite
  - Quarterly production of coal mines
  - Variable and fixed cost by mine type, hourly wages at the county level
  - Ownership and mergers and acquisitions

# Data

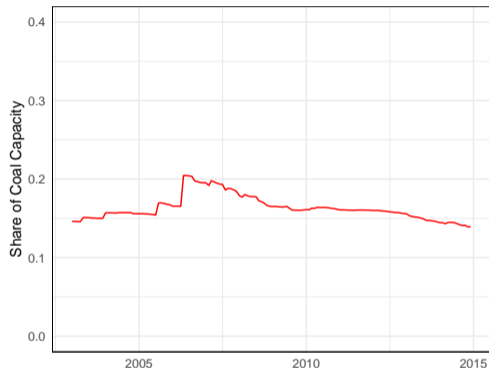
1. **Power Plant Data**: EPA, EIA, Velocity Suite, ERCOT
2. **Coal Mine Data**: Mine Safety and Health Administration, Coal Cost Guide, Velocity Suite
3. **Coal Transaction Data**: Velocity Suite (based on EIA data)
  - Monthly coal shipment with prices, quantities and coal type
  - Contract duration
  - Transportation mode and transportation cost



# Summary Statistics

	Upstream	Downstream
<i>Unit Characteristics</i>		
# of Units (Plant or Mine)	25	9
# of Firms	9	3
# of Units per Firm	2.51	2.88
Avg. # of Trade Partners	22.09	2.65
Avg. Share of Largest Partner	0.42	0.53
<i>Transaction Characteristics</i>		
Average Fob Price (per mmtbu)	-	0.85
Contract Duration (year)	-	1.42
% Spot	-	0.04
% Railroad	-	0.77

# Ercot Market



- ▶ Ercot market is ideal empirical setting
  - No import and export
  - Most power plants are not regulated
  - Availability of nodal prices
- ▶ Stable coal capacity share between 2005 and 2015
- ▶ Existing evidence of market power  
(Hortacsu and Puller, 2008 ; Hortacsu et al, 2015)

# Empirical Model: Roadmap

Empirical model requires the following primitives

- **Mining Firm Supply Curves**

- Production function: Aggregate marginal cost of individual mines at the firm level

- **Downstream Demand Curve**

- Cournot Model: Assume power plants compete a la Cournot to estimate residual demand curves

- **Transactions and Disagreement Payoffs**

- Transaction Data: Whole prices and quantities, use spot prices to estimate disagreement payoff

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- With these primitives estimate bargaining model and bargaining weights, quantify welfare loss
- Define welfare as consumer surplus. Can adjust for externalities (e.g. environmental).

## Estimating Mining Supply Function

- A mining firm  $u$  consists of a portfolio of mines  $i(u)$
- Estimate Leontief production function in labor and non-labor inputs
- Mine  $i$  that produce  $q_i$  has the following marginal cost curve (quantities in terms of heat input)

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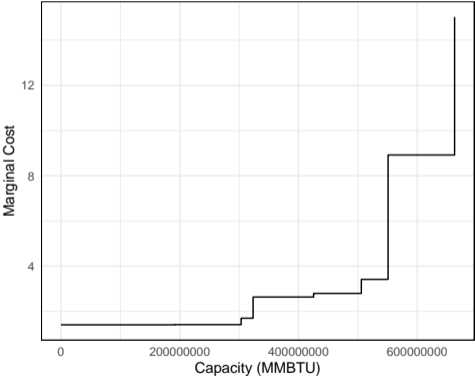
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$$\underbrace{c_i}_{\text{marginal cost}} = \frac{\overbrace{h_i l_i}^{\text{Labor cost}} + \overbrace{p^v v_i}^{\text{Non-labor variable costs}}}{\underbrace{q_i}_{\text{production}}} \quad \text{if } q_i < cap_i$$

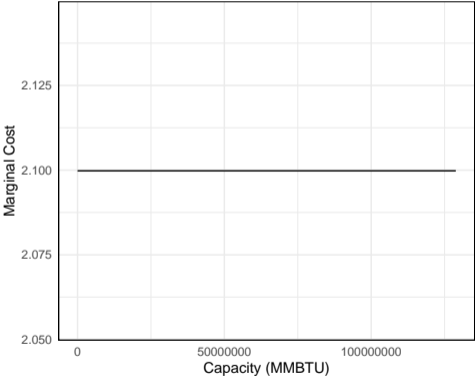
- **Supply curve of mining firm:** rank mines by increasing  $c_i$ , add start-up costs of idle mines  
 $c_u = \{c_1, c_2 + I_2, c_3 + I_3 \dots\}$

# Mining Supply Curves: Examples

### Vistra Energy (2015)



### Westmoreland Coal Company (2015)



## Power Plant Cost Curve

- Each power company  $d$  consists of a portfolio of power plants
  - Potentially different fuels (nuclear, gas, coal renewable)
  - Each power plant  $j$  has a technology characterized by heat rate



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Production technology for power plant  $j$ :

$$\underbrace{q_j^e}_{\text{electricity output}} = \underbrace{q_j^c}_{\text{heat input}} / \underbrace{\lambda_j}_{\text{heat rate}}$$

Marginal cost of each power plant:

$$c_j(q_j^e) = q^c \lambda_j \underbrace{w}_{\text{coal price per mmbtu}}$$

- $w^c = \text{fob price} + \text{transportation cost}$

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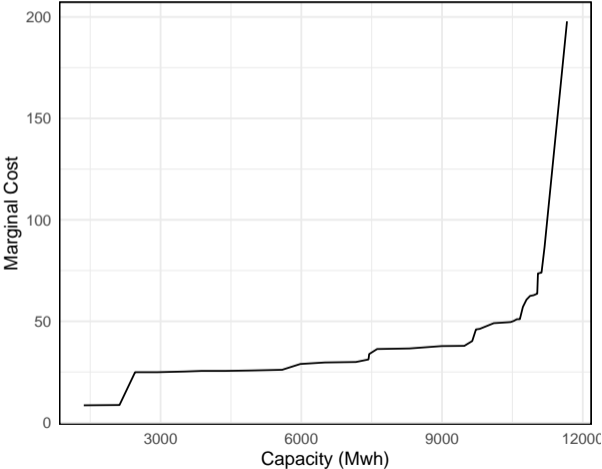
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- $w^c = \text{fob price} + \text{transportation cost}$
- Cost curve of power firm is the aggregation of individual marginal cost from lowest to highest

# Power Plant Cost Curve: Example

**NRG Energy (2015)**



# Modeling Electricity Market: Cournot Competition

- We impose **Cournot competition** to model electricity market
  - (Borenstein et al., 1995; Borenstein and Bushnell, 1999 ; Puller, 2007)
- Market includes **fringe and strategic firms**
  - Fringe (competitive) firms: Small market share firms (less than 5% capacity) and regulated firms.
  - Strategic (Cournot) firms: Large firms compete à la Cournot
  - The market definition is an ISO (ERCOT)

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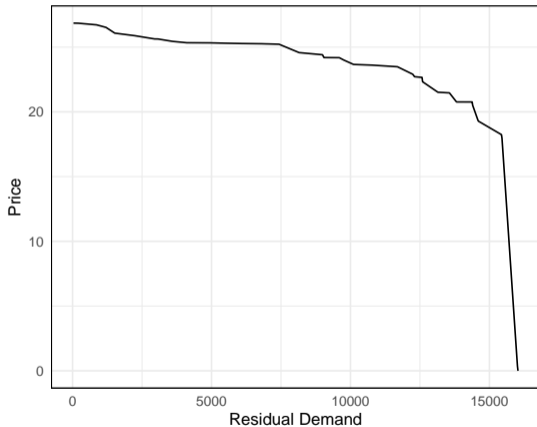
- We impose **Cournot competition** to model electricity market
  - (Borenstein et al., 1995; Borenstein and Bushnell, 1999 ; Puller, 2007)
- Market includes **fringe and strategic firms**
  - Fringe (competitive) firms: Small market share firms (less than 5% capacity) and regulated firms.
  - Strategic (Cournot) firms: Large firms compete à la Cournot
  - The market definition is an ISO (ERCOT)
- Strategic firms face the following demand curve every hour  $t$

$$\underbrace{Q_{\text{strat}}^D(P_t)}_{\text{Strategic demand at price } P_t} = \underbrace{Q_{\text{total}_t}^D}_{\text{Inelastic demand at hour } t} - \underbrace{Q_{\text{fringe}}^S(P_t)}_{\text{Supply from fringe firms at price } P_t}$$

- Supply elasticity of fringe firm determines the residual demand curve for strategic firms

# Electricity Demand: Example

## NRG Energy (January, Weekday 2pm)



- ▶ Estimate residual demand for every month-hour-(weekend/weekday) combination
- ▶ Use average fringe supply and demand to estimate firm's expected residual demand curve
- ▶ Aggregate hourly residual demand curves to yearly level

# Modeling Electricity Market: Cournot Competition

- Strategic firm  $d$  chooses quantity in period  $t$  to maximize profit subject to a capacity constraint:

$$\max_{q_{dt}} (P(q_{dt} + q_{-dt}) \cdot q_{dt} - C_{dt}(q_{dt})) \quad \text{s.t.} \quad q_{dt} \leq k_{dt}$$

- The annual profit of the power company is

$$\Pi_d = \sum_t \pi_{dt}(q_{dt}, q_{-dt})$$

## Solving the Model

We solve the model for every contracting pair-year using the estimated primitives

- (i) electricity demand curve at downstream firm
- (ii) coal mining marginal cost curve of upstream firm



# Solving the Model

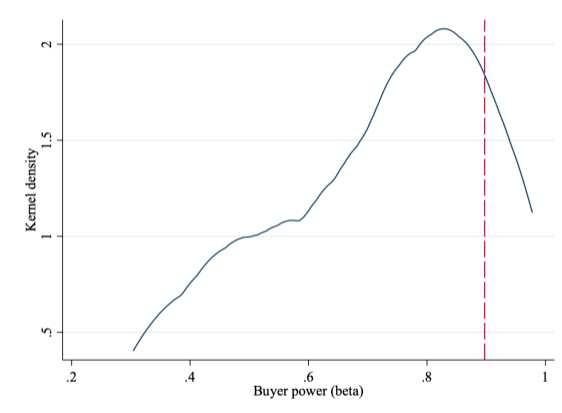
We solve the model for every contracting pair-year using the estimated primitives

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## Estimation Procedure

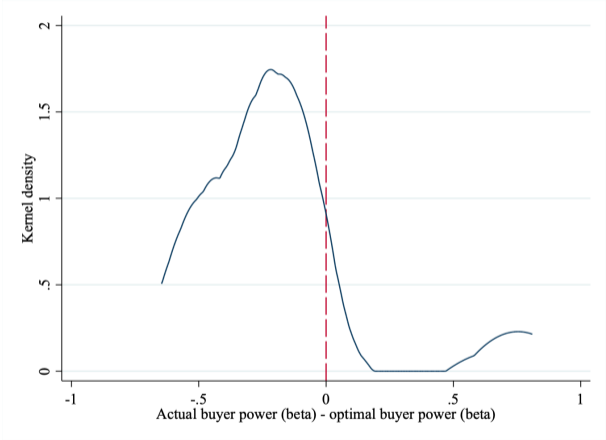
1. Solve equilibrium  $(q, p, w)$  under monopsonistic and monopolistic conduct to form payoff functions
2. For each  $\beta \in (0, 1)$ , form coal demand and supply curve under monopolistic and monopsonistic bargaining equilibrium conditions
3. Estimate  $\beta$  as value that rationalizes observed  $w$
4. Compare  $\beta$  to  $\beta^*$ ,  $q(\beta)$  to  $q(\beta^*)$

# Buyer Power: Estimates



- ▶ Power plants relatively more bargaining power than mines
- ▶ Output-maximizing bargaining parameter around 0.9
- ▶ Mines still have too much bargaining power, deadweight loss mostly due to double marginalization

# Actual vs. Output-Maximizing Buyer Power



# Counterfactuals

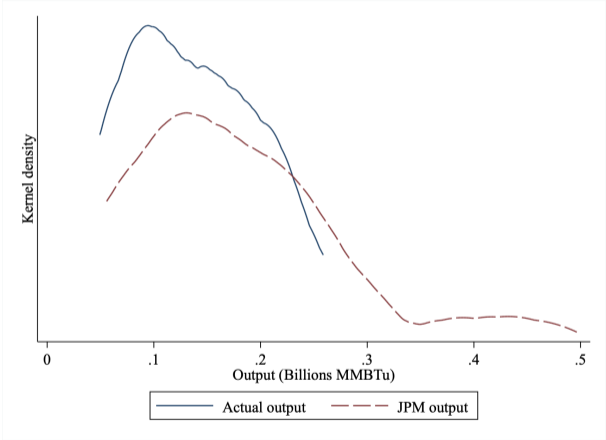
## Today:

1. First best: Comparison between actual conduct and joint profit maximization (first best), in terms of Q, CS, DS, US. Upper bound on the potential gains from eliminating seller + buyer power

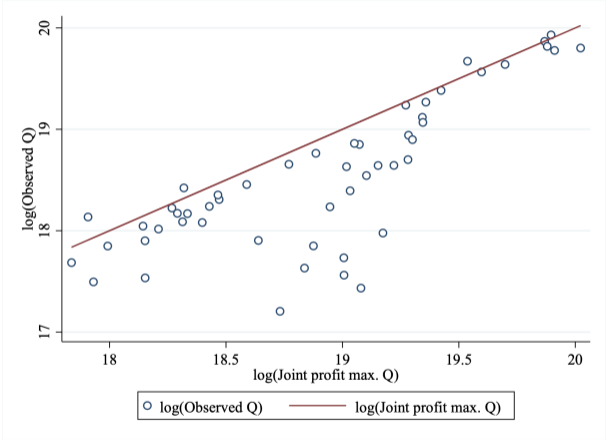
## In progress:

2. Vertical merger: Compute how far  $\beta$  is from  $\beta^*$  in vertically integrated plants on average. How close to first best can we get by vertically integrating?
3. Horizontal mergers between D: depending on whether  $\beta > \beta^*$  or  $\beta < \beta^*$ , we can get closer or further from the first best
4. Horizontal mergers between U: same, but opposite effect as mergers between D.

# Deadweight Loss



# Deadweight Loss



## Deadweight Loss

Deadweight loss	Amount (Billion \$)	% of Total Loss
Total	\$9.05 (5.11%)	-
Due to Monopsony	\$1.56	17.29%
Due to Monopoly	\$7.48	82.71%

# Conclusion

We extend Nash-in-Nash bargaining models to allow for either monopsony or monopoly conduct and distortions



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We find that the relative distortions of buyer and seller power depend on

- Curvatures of the upstream marginal cost and downstream residual demand
- Level of the bargaining parameter

## Conclusion

We extend Nash-in-Nash bargaining models to allow for either monopsony or monopoly conduct and distortions

We find that the relative distortions of buyer and seller power depend on

- Curvatures of the upstream marginal cost and downstream residual demand
- Level of the bargaining parameter

Applying model to study coal fuel procurement in the ERCOT ISO, we find that

- A deadweight loss of 5.11% the total output.
- 83% of DWL due to seller power, 17 due to buyer power

# Appendix

# Parametrization

Consumer demand for  $q$ :

$$q(p) = p^\eta$$

Cost curve of  $U$ :

$$c(q) = q^\psi$$

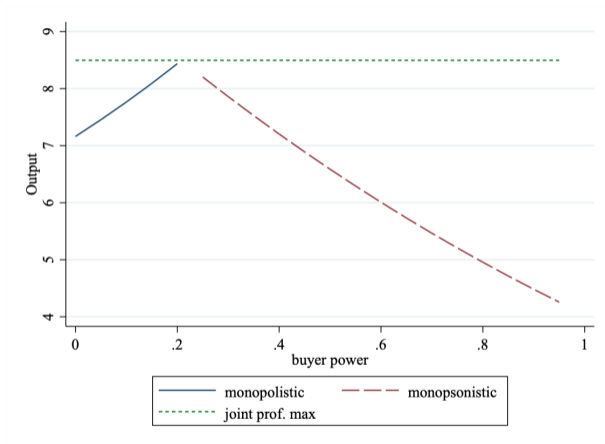
Solve for equilibrium using

- $\eta = -6$
- $\psi = 0.25$
- $\beta \sim \mathcal{U}[0, 1]$ ,

Back to conduct

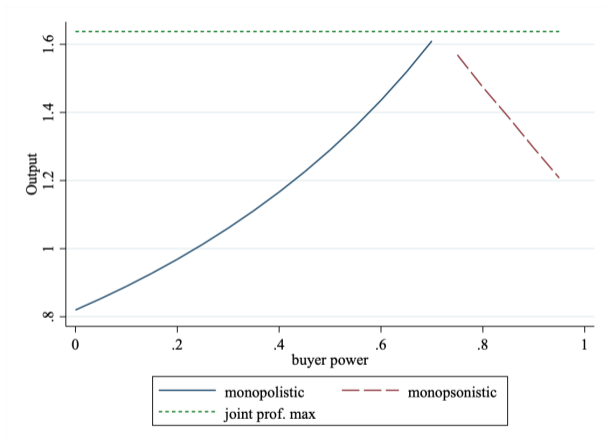
## More elastic demand

Let  $\eta = -20$ , rather than  $\eta = -6$



## More inelastic demand

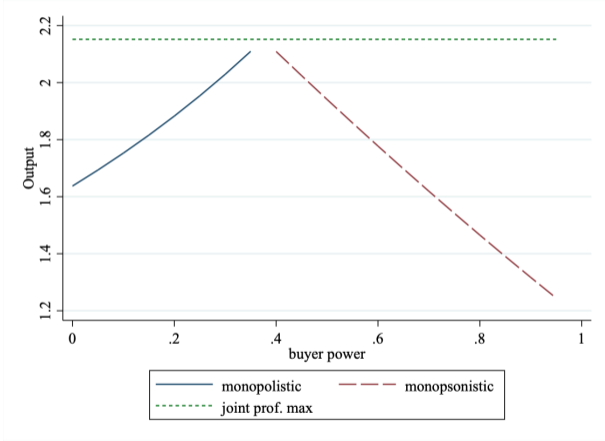
Let  $\eta = -3$ , rather than  $\eta = -6$



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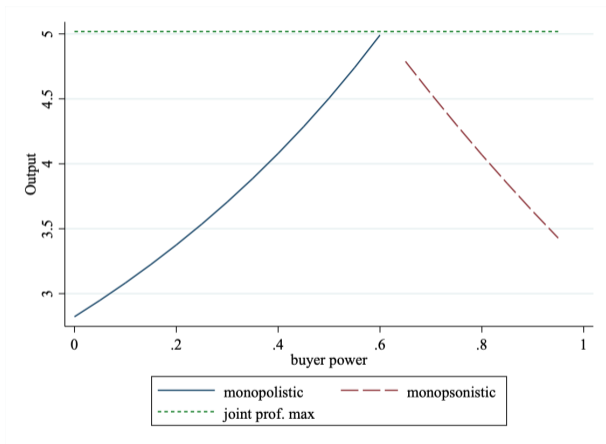
# More elastic supply

Let  $\psi = 0.5$  rather than  $\psi = 0.25$ :



## More elastic marginal costs curve

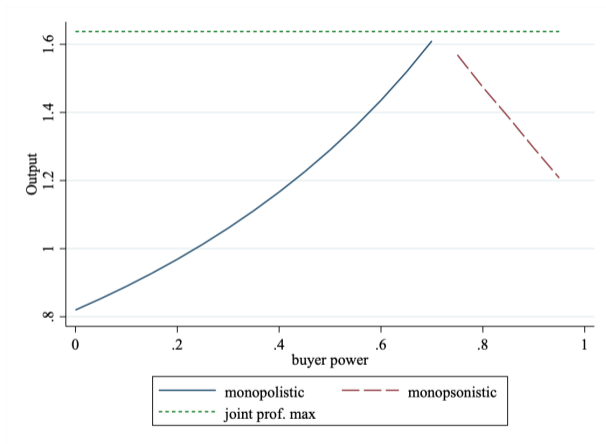
Let  $\psi = 0.15$  rather than  $\psi = 0.25$ :





## More inelastic demand

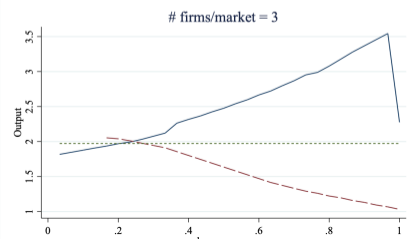
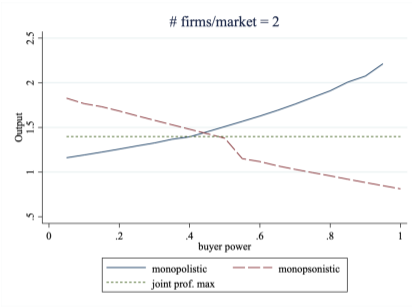
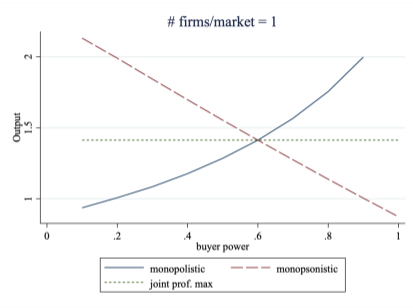
Let  $\eta = -3$ , rather than  $\eta = -6$



# Cournot competition

$\eta = -3, \psi = 0.25, 1$  to 3 firms

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# Coal Mining Production Model Estimation

- Mines  $m$  characterized by 'type'  $\theta_m$ : (capacity, vein thickness, technology)

- Coal Cost Guide:  $\gamma\theta_m = \frac{p^v v}{hl}$

$$\Rightarrow c_m = h_m \frac{l_m}{q_m} (1 + \gamma\theta_m) + v_m (cap_m - q_m) \text{ if } q_m \leq cap_m$$

- Estimate  $c_m - v_m(cap_m - q_m)$  by  $cap_m$ , then find  $v_{cap_m}$  by linear interpolation

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# Bargaining model

- **Monopolistic bargaining:**

$$\begin{cases} \max_{Q_d^e} \pi_d(Q_d^e, W_d) \\ \max_{W_{kl}} \left[ \left( \pi_d(Q_d^e, W_d) - \pi_d(\tilde{Q}_d^e, W_{u,-d}) \right)^{\beta_{ud}} \left( \pi_u(Q_u^c, W_u) - \pi_u(\tilde{Q}_u^c, W_{u,-d}) \right)^{1-\beta_{ud}} \right] \end{cases}$$

- **Monopsonistic bargaining:**

$$\begin{cases} \max_{Q_u} \pi_u(Q_u^c, W_u) \\ \max_{W_{kl}} \left[ \left( \pi_d(Q_d^e, W_d) - \pi_d(\tilde{Q}_d^e, W_{u,-d}) \right)^{\beta_{ud}} \left( \pi_u(Q_u^c, W_u) - \pi_u(\tilde{Q}_u^c, W_{u,-d}) \right)^{1-\beta_{ud}} \right] \end{cases}$$

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## Equilibrium conditions

- Each pair  $ij$  forms a contract  $\mathbb{C}_{ij} \in \mathcal{C}_{ij}$ , no agreement is  $\mathbb{C}_0$
- Given all contracts  $\mathbb{C} \equiv \{\mathbb{C}_{ij}\}$ , downstream profit is  $\Pi_j^d(\mathbb{C})$ , upstream  $\Pi_i^u(\mathbb{C})$
- Set of contracts with non-negative gains to trade for  $i$  and  $j$  is:

$$\mathcal{C}_{ij}^+(\mathbb{C}_{-ij}) \equiv \{\mathbb{C}_{ij} \in \mathcal{C}_{ij} : [\Pi_j^d(\mathbb{C}_{ij}, \mathbb{C}_{-ij}) - \Pi_j^d(\mathbb{C}_0, \mathbb{C}_{-ij})] \geq 0$$

$$\text{and } [\Pi_j^u(\mathbb{C}_{ij}, \mathbb{C}_{-ij}) - \Pi_j^u(\mathbb{C}_0, \mathbb{C}_{-ij})] \geq 0$$

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## Nash-in-Nash bargaining equilibrium

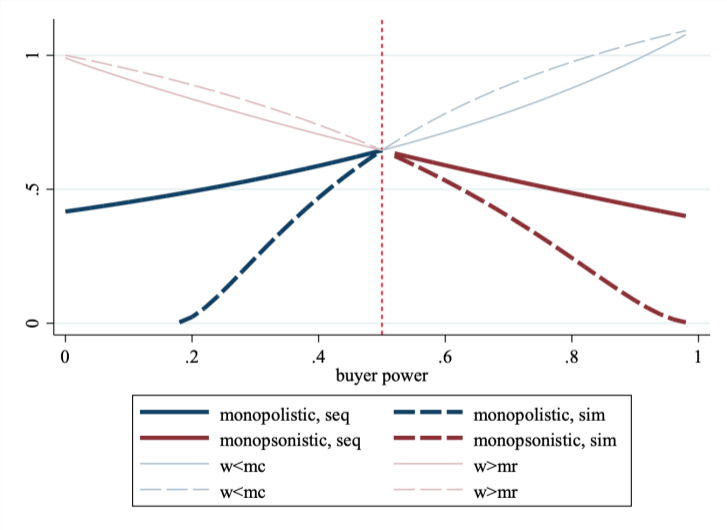
$\hat{\mathbb{C}} \equiv \{\hat{\mathbb{C}}_{ij}\}$  is a **Nash-in-Nash equilibrium** if:

(i)  $\forall i, j$  such that  $\hat{\mathbb{C}}_{ij} \neq \mathbb{C}_0$ :

$$\{\hat{\mathbb{C}}_{ij}\} \in \arg \max [\Pi_j^d(\{\{\mathbb{C}_{ij}\}, \{\hat{\mathbb{C}}_{-ij}\}\}) - \Pi_j^d(\{\{\mathbb{C}_0\}, \{\hat{\mathbb{C}}_{-ij}\}\})]^{b_{ij}} \\ \times [\Pi_i^u(\{\{\mathbb{C}_{ij}\}, \{\hat{\mathbb{C}}_{-ij}\}\}) - \Pi_i^u(\{\{\mathbb{C}_0\}, \{\hat{\mathbb{C}}_{-ij}\}\})]^{1-b_{ij}}$$

(ii)  $\forall i, j$  such that  $\hat{\mathbb{C}}_{ij} = \mathbb{C}_0$ , there is no contract in  $C_{ij}^+(\mathbb{C}_{-ij})$  that gives strictly positive gains from trade to both  $i$  and  $j$ . [back to main slide deck](#)

# Simultaneous vs. sequential model



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Parametrization

## Non-zero disagreement payoffs

$$\pi^u = (w - c(q - y))q, \quad \pi^d = (p(q) - w - z)q$$

