ENERGYECOLAB

Market Power and Price Discrimination: Learning from Changes in Renewables Regulation

Imperial College (London), March 2020

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• Often seen as: the outcome of market power + unfair

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Electricity markets are typically organized as **sequential markets**: **day-ahead and real time markets**

- Evidence of forward premia (Longstaff et al., JF 2004)
- Consistent with market power (Ito and Reguant, AER 2016)

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Related policy debates:

- **1** Should virtual bidding be allowed to promote arbitrage?
- 2 How should renewables be paid?
 - Key question for the energy transition!
 - EUs 2030 climate target will require 260 billion per year, a fraction of which will finance need investment in renewables to achieve 32% of of final energy consumption.

Paying for Renewables

Most commonly used pricing schemes:

- **Feed-in-Premia** (FiP): market prices + fixed premium
 - This encompasses ROCs, RPS, tax credits...
- **Feed-in-Tariffs** (FiT): fixed prices
 - Acts like a forward contract (Allaz and Villa, JET 1993)

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This paper:

For given capacities,

what are the market impacts of renewables regulation?

Market Impacts of Renewables Regulation

Ito and Reguant (2016):

- Under market prices: wind firms arbitrage price differences
- This reduces price discrimination
- Under fixed prices: wind firms stop arbitraging

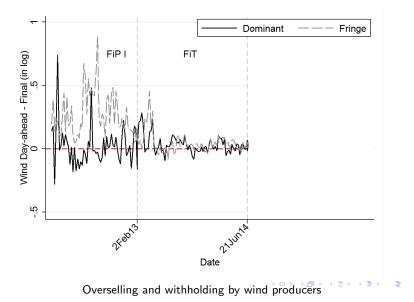
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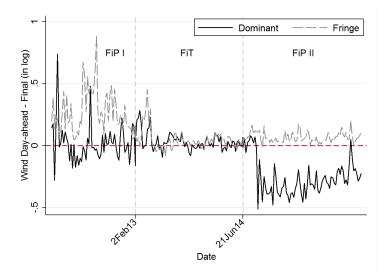
- Provides further evidence confirming the above results
- Uncovers the forward-contract effect of fixed prices (FiTs):
 - Dominant firms exercise less market power
 - Price discrimination reduced, despite weakening arbitrage

A First Look at the Data



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A First Look at the Data



Overselling and withholding across markets by wind producers $a \to a \to a$

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Roadmap

- Related literature
- Theoretical analysis
- Institutional background
- Empirical analysis
 - Pricing incentives in the day-ahead market

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- Price discrimination across markets
- Arbitrage across markets
- Mark-ups in the day-ahead market

Conclusions

Related Literature

1 Forward contracting and market power:

- Allaz and Villa (JET, 1993)
- Bushnell et al. (AER, 2008); Wolak (IEJ, 2000)

2 Welfare effects of price discrimination:

Aguirre et al. (AER, 2010)

- **8** Price arbitrage in electricity markets:
 - Ito and Reguant (AER, 2016)
 - Borenstein, Bushnell, Knittel and Wolfram (JIE, 2008); Jha and Wolak (2019); Mercadal (2019)

4 Pricing schemes for renewables:

Dressler (EE, 2016); Bohland and Schwenen (2019)

Theoretical Analysis

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Sequential markets: day-ahead and real-time markets, m = 1, 2

Demand A is inelastically bought in day-ahead market

Firms:

Dominant firm (d) and fringe firms (f)

Technologies:

- Wind: zero marginal costs; availability $w_i \leq k_i$, i = d, f
- Conventional: marginal costs c for dominant; q/b for fringe

Technology Ownership:

- Fringe firms own either wind or conventional technologies
- Dominant firm owns both

Baseline (Ito and Reguant, 2016)

- **1** Wind producers are exposed to **variable prices**
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$$D_1(p_1) = A - bp$$

$$D_2(p_1, p_2) = (p_1 - p_2) b$$

Spot market:

$$p_{2}^{*}\left(p_{1}
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Day-ahead market:

$$p_1^* = \arg \max \left[p_1 q_1 + p_2^* q_2^* - c \left(q_1 + q_2^* - w_d \right) \right]$$

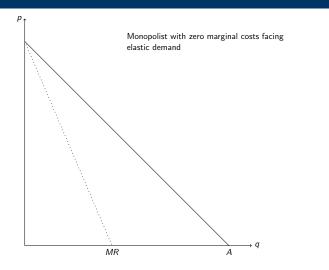
Equilibrium, for
$$\beta = (3b)^{-1} > 0$$
:

$$p_1^B = 2\beta \left(A - w_f\right) > p_2^B = \beta \left(A - w_f\right)$$

Properties of the equilibrium:

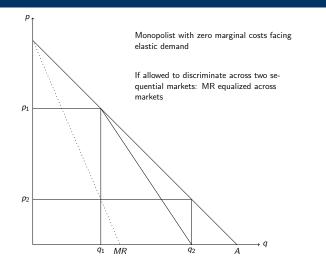
- Positive price premium: $p_1^B > p_2^B > 0$
- Wind w_f reduces prices in both markets
- Price premium increasing in $A w_f$ and decreasing in b

Baseline



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Baseline



- **1** Wind producers receive variable prices + fixed premium
- 2 They are allowed to arbitrage their idle capacity

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Lower day-ahead demand $-k_f$, higher spot demand $(k_f - w_f)$:

$$D_1(p_1) = A - bp - k_f$$

$$D_2(p_1, p_2) = (p_1 - p_2) b + (k_f - w_f)$$

- **Wind producers receive variable prices** + fixed premium
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$$D_1(p_1) = A - bp - k_f$$

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Otherwise, same profit maximization problem as in baseline:

$$p_{2}^{*}(p_{1}) = \arg \max \left[p_{2}q_{2} - c \left(q_{1} + q_{2} - w_{d} \right) \right],$$

$$p_{1}^{*} = \arg \max \left[p_{1}q_{1} + p_{2}^{*}q_{2}^{*} - c \left(q_{1} + q_{2}^{*} - w_{d} \right) + \overline{\rho}w_{d} \right]$$

$$(a) \quad (a) \quad (b) \quad (c) \quad$$

Equilibrium

$$p_{1}^{P} = p_{1}^{B} - \beta (k_{f} - w_{f})$$

$$p_{2}^{P} = p_{2}^{B} + \beta (k_{f} - w_{f})$$

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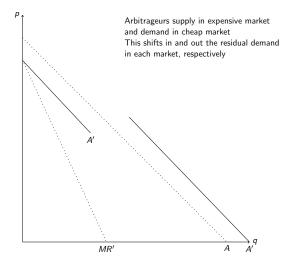
Equilibrium

$$p_1^P = p_1^B - \beta (k_f - w_f)$$

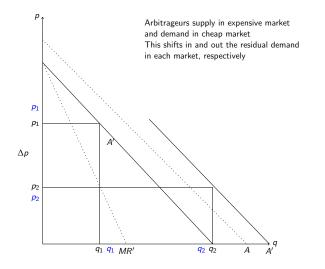
$$p_2^P = p_2^B + \beta (k_f - w_f)$$

The **arbitrage effect** is captured by $\pm \beta (k_f - w_f)$:

- Fringe oversells $(k_f w_f)$ in the day-ahead market $ightarrow p_1^P \downarrow$
- Fringe buys $(k_f w_f)$ in the spot market $ightarrow p_2^P \uparrow$
- Arbitrage lowers the prime premium $\Delta p^P \downarrow$



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Fixed prices (FiTs)

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- \blacksquare No arbitrage \rightarrow **Demands** as in baseline
- No arbitrage → **Spot market price** as in baseline

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- **Day-ahead market**: *w*_d does not receive *p*₁

$$p_1^* = \arg\max\left[p_1\left(q_1 - w_d\right) + p_2^*q_2^* - c\left(q_1 + q_2^* - w_d\right) + \overline{p}w_d\right]$$

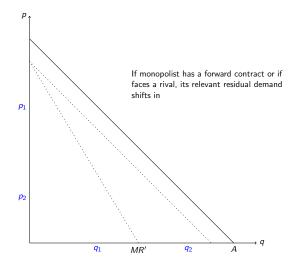
Equilibrium

$$p_1^T = p_1^B - 2\beta w_d$$
$$p_2^T = p_2^B - \beta w_d$$

The forward contract effect is captured by $-2\beta w_d$:

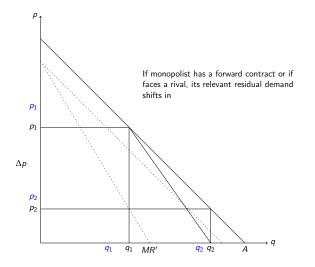
- **Dominant firm exerts less market power day-ahead** $\rightarrow p_1^T \downarrow$
- This lower price is passed on to the real-time market $ightarrow p_2^{\mathcal{T}}\downarrow$
- **–** Reduced market power lowers the prime premium $\Delta p^T \downarrow$

Fixed prices (FiTs)



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Fixed prices (FiTs)



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Summary of Results

| | Variable prices | Fixed prices |
|-----------------------|----------------------------------|------------------------|
| <i>p</i> 1 | $\downarrow\downarrow\downarrow$ | $\downarrow\downarrow$ |
| p ₂ | 1 | Ļ |
| Δp | \downarrow | \downarrow |
| Channel | Arbitrage | Forward contract |

- p_1 , p_2 **Consumer surplus** comparison depends on w_d/w_f
 - p2 Total welfare is higher with fixed prices
 - Δp **Price discrimination** comparison depends on w_d/w_f



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Forward contract effect under fixed, not under variables prices

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2 Arbitrage by fringe firms across markets:

Arbitrage effect under variable, not under fixed prices

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- 8 Price discrimination across markets:
 - Comparison btw fixed and variable prices could go either way
 - Market power should enlarge Δp
 - Wind reduces (increases) Δp under fixed (variables) prices

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4 Market power in the day-ahead market:

Comparison btw fixed and variable prices could go either way

Institutional Setting

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The Spanish electricity market

Market design and market structure:

- Day-ahead market + intra-day markets + balancing markets
- Mix of dominant and fringe firms
- Mix of vertically integrated and stand-alone firms
- Mix of various technologies

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Rich data:

- Sample: 2012-2015
- Detailed bid data at the unit level, including data on:
 - net positions of vertically integrated companies
 - bilateral contracts
- Hourly data on equilibrium outcomes
- Detailed data on marginal costs at plant level

Summary Statistics

| | FiP I | | FiT | | FiP II | |
|-------------------------|-------|--------|------|--------|--------|--------|
| | Mean | SD | Mean | SD | Mean | SD |
| Price DA | 50.2 | (13.8) | 38.1 | (22.2) | 52.0 | (11.2) |
| Price ID 1 | 48.9 | (14.2) | 37.2 | (22.1) | 51.7 | (11.7) |
| Price premium | 1.2 | (5.0) | 1.0 | (5.6) | 0.3 | (3.9) |
| Marginal Cost | 47.5 | (6.6) | 42.3 | (7.2) | 37.0 | (3.8) |
| Demand Forecast | 29.8 | (4.8) | 28.5 | (4.6) | 28.1 | (4.3) |
| Wind Forecast | 5.7 | (3.4) | 6.5 | (3.6) | 5.0 | (3.2) |
| Dominant wind share | 0.6 | (0.0) | 0.7 | (0.0) | 0.6 | (0.0) |
| Fringe wind share | 0.4 | (0.0) | 0.3 | (0.0) | 0.4 | (0.0) |
| Dominant non-wind share | 0.8 | (0.0) | 0.8 | (0.1) | 0.8 | (0.1) |
| Fringe non-wind share | 0.2 | (0.0) | 0.2 | (0.1) | 0.2 | (0.1) |

The Empirical Analysis

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 Dominant firms do not internalize the effects of price increases on wind output under fixed prices (FiTs) – forward-contract effect

 Dominant firms do not internalize the effects of price increases on wind output under fixed prices (FiTs) – forward-contract effect

Profit maximization in day-ahead market:

$$p = c_i + \left|\frac{\partial DR_i}{\partial p}\right|^{-1} (q_i - I_t w_i)$$

where $I_t = 1$ with fixed prices and $I_t = 0$ with variable prices.

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Empirical bidding equation:

$$b_{ijt} = \rho c_{ijt} + \beta \left| \frac{q_{it}}{DR'_{it}} \right| + \theta \left| \frac{w_{it}}{DR'_{it}} \right| I_t^s + \alpha_{ij} + \gamma_t + \epsilon_{ijt},$$

| | 2SLS | | | | | |
|---|----------|----------|----------|------------------|--|--|
| | (1) | (2) | (3) | (4) | | |
| Marginal Cost _{it} | 0.72* | 0.79*** | 0.85*** | 0.63** | | |
| | (0.38) | (0.25) | (0.26) | (0.29) | | |
| FiP I $\times \frac{w_{it}}{DR'_{it}}$ | 0.63 | -6.43 | -7.26 | -8.84* | | |
| | (6.82) | (4.68) | (4.68) | (4.95) | | |
| $FiT \times rac{w_{it}}{DR'_{it}}$ | -32.5*** | -26.2*** | -27.4*** | -18.4*** | | |
| | (8.56) | (7.19) | (7.03) | (6.71) | | |
| FiP II $\times \frac{w_{it}}{DR'_{it}}$ | -0.78 | 0.69 | -0.92 | 2.45 | | |
| | (9.45) | (7.41) | (7.58) | (6.34) | | |
| $\frac{q_{it}}{DR'_{it}}$ | | | | 3.61** (1.42) | | |
| Month and DoW FE | Ν | Y | Y | Y | | |
| Hour FE | N | N | Y | Y | | |
| Observations | 20,100 | 20,100 | 20,100 | 20,100 | | |

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Arbitrage by fringe firms

Fringe wind firms engage in arbitrage only under variable prices (FiPs) – arbitrage effect

Does overselling respond to the predicted price premium?

$$\Delta \ln q_{tg} = \alpha + \theta_g \Delta \hat{p}_t + \gamma D_t^{er} + \delta w_t^{er} + \rho \mathbf{X}_t + \eta_{tg}$$

Overselling captured by overselling Δlnq_{tg}, could be due to:
 Arbitrage: if θ > 0, it responds to price premium.

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• Overselling captured by **overselling** $\Delta \ln q_{tg}$, could be due to:

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- Other factors: demand and wind forecast errors, outages...

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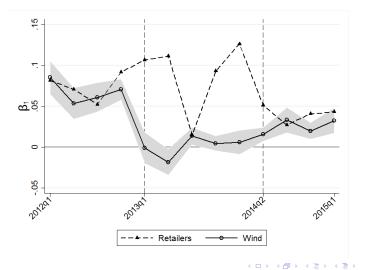
- Arbitrage: if $\theta > 0$, it responds to price premium.
- Other factors: demand and wind forecast errors, outages...

Two alternative control groups: (g = 1, 2)

- Retailers: always incentives to arbitrage
- Other renewables under FiTs: no incentives to arbitrage

Response of overselling to price premium

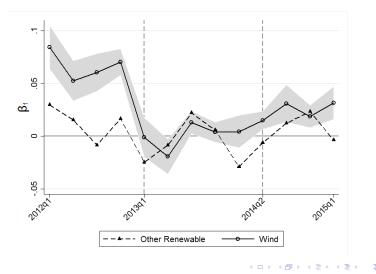
Figure: (1) using retailers as the control group



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Response of overselling to price premium

Figure: (2) using other renewable units as the control group



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Arbitrage by fringe firms: Diff-in-Diff

Two subsamples:

- d = 1: Feb 2012-Feb 2013 (includes FiP I \rightarrow FiT)
- d = 2: Feb 2013-Feb 2014 (includes FiT \rightarrow FiP II)

Arbitrage by fringe firms: Diff-in-Diff

Two subsamples:

- d = 1: Feb 2012-Feb 2013 (includes FiP I \rightarrow FiT)
- d = 2: Feb 2013-Feb 2014 (includes FiT \rightarrow FiP II)

Estimating equation (one for each sample; each control group):

$$\Delta \ln q_t = \alpha + \beta_1 W R_t^d \Delta \hat{p}_t + \beta_2 W \Delta \hat{p}_t + \beta_3 W R_t^d + \beta_4 R_t^d \Delta \hat{p}_{ht} + \beta_5 \Delta \hat{p}_t + \beta_6 W + \beta_7 R_t^d + \rho \mathbf{X}_t + \eta_t$$

- W = 1 treated group (Wind)
- $R_t^d = 1$ after regulatory change (R_t^1 : FiTs; R_t^2 : FiPs)
- **Treatment effect captured by** β_1

▶ Pre-trend

Overselling by the fringe (DID estimates)

| | Non-wind renewables | Reta | ilers |
|---|---------------------|-----------|----------|
| | (1) | (2) | (3) |
| $\Delta \hat{p} \times \text{Wind} \times \text{FiT}$ | -0.071*** | -0.069*** | |
| | (0.0068) | (0.014) | |
| $\Delta \hat{p} \times \text{Wind} \times \text{FiP}$ | | | 0.059*** |
| | | | (0.011) |
| Observations | 41,080 | 41,080 | 34,194 |

casted price premium.

▶ Full table

Price Discrimination Across Markets

Predictions:

- \blacksquare Factors than enhance market power o Price discrimination \uparrow
- 2 Wind reduces price differential more under fixed prices
- 3 Dominant/fringe's wind reduces the price differential

Price Discrimination Across Markets

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Estimating equation:

$$\Delta \boldsymbol{p}_t = \boldsymbol{\alpha} + \beta_1 \boldsymbol{w}_t \boldsymbol{I}_t^s + \beta_2 \boldsymbol{w}_t + \beta_3 \boldsymbol{I}_t^s + \alpha_1 D \boldsymbol{R}_{1t}' + \alpha_2 D \boldsymbol{R}_{2t}' + \gamma \boldsymbol{X}_t + \boldsymbol{\epsilon}_t$$

- I_t^s = FiP I, FiP II (FiT is reference point)
- β_1 : impact of wind across pricing regimes
- Two measures: wind forecast; dominant/fringe's wind

Price discrimination across markets

| | | 25 | LS | |
|---|-------------------|------------------|------------------|------------------|
| | (1) | (2) | (3) | (4) |
| Wind Forecast (GWh) | -0.1*** (0.03) | () | (-) | () |
| FiP I \times Wind Forecast (GWh) | 0.2*** (0.03) | | | |
| FiP II \times Wind Forecast (GWh) | 0.1*** (0.03) | | | |
| w _{dt} w _{ft} | | -0.5*** (0.1) | -0.7*** (0.1) | -0.4*** (0.1) |
| $FiP \ I \ \times \ \tfrac{w_{dt}}{w_{ft}}$ | | 0.9*** (0.2) | 0.4* (0.2) | 0.7*** (0.2) |
| FiP II $\times \frac{w_{dt}}{w_{ft}}$ | | 0.7*** (0.2) | 0.7*** (0.2) | 0.7*** (0.2) |
| DoW FE | Y | Y | Ν | Y |
| Year X Month FE | Ν | Y | Ν | Y |
| Week FE | Ν | Ν | Y | Y |
| Observations | 25,334 | 25,334 | 25,334 | 25,334 |

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We have found evidence of:

- **Forward contract effect** under fixed prices (FiTs)
- Arbitrage effect under variable prices (FiPs)

Our model predicts that their weight depends on market structure

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Our model predicts that their weight depends on market structure

What does the evidence tell us?

• We leverage on structural estimates to **compute mark-ups**:

$$\frac{p-c_i}{p} = \left|\frac{\partial DR_i}{\partial p}\right|^{-1} \frac{q_i - l_t w_i}{p}$$

for $I_t = 1$ with fixed (FiTs); $I_t = 0$ with variable prices (FiPs).

| | FiP I | | FiT | | FiP II | | |
|--------|----------|-------|----------|-------|----------|-------|--|
| | Mean (%) | SD | Mean (%) | SD | Mean (%) | SD | |
| All | 8.3 | (3.3) | 6.3 | (3.3) | 10.9 | (3.7) | |
| Firm 1 | 7.0 | (2.2) | 7.0 | (2.6) | 11.9 | (4.4) | |
| Firm 2 | 12.3 | (4.1) | 8.2 | (5.1) | 14.4 | (4.6) | |
| Firm 3 | 7.7 | (2.3) | 6.0 | (3.3) | 10.5 | (3.4) | |
| | | | | | | | |

Table: Average Markups on Day-ahead Market

Notes: Simple average of markups using structural estimates.





Conclusions

- Arbitrage need not be the most efficient way to reduce price discrimination and mitigate market power
- 2 Addressing market power directly might be more efficient

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- **Empirical evidence** (Spanish electricity market):
 - FiTs mitigated market power and price discrimination
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Conclusions

- Arbitrage need not be the most efficient way to reduce price discrimination and mitigate market power
- 2 Addressing market power directly might be more efficient
- **Empirical evidence** (Spanish electricity market):
 - FiTs mitigated market power and price discrimination
 - FiPs increased arbitrage but led to more market power

Work ahead!

 Counterfactual analysis: effects of combining the forward contract and arbitrage effects

Thank you!

ENERGYECOLAB

Comments? Questions? natalia.fabra@uc3m.es







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Contracts-for-Differences

- 1 Payments settled by differences wrt reference price
- 2 Firms exposed to market prices: incentives to arbitrage

- Payments settled by differences wrt reference price
 Firms exposed to market prices: incentives to arbitrage
- A combination of the results under FiTs and FiPs:
 - Arbitrage effect reflected in the residual demands (FiPs):

$$D_{1}\left(p_{1}
ight) = A - bp_{1} - k_{f}$$
 and $D_{2}\left(p_{1}, p_{2}
ight) = \left(p_{1} - p_{2}
ight)b + \left(k_{f} - w_{f}
ight)$

Forward contract effect reflected in day-ahead profit (FiTs): $p_1^* = \arg \max \left[p_1 \left(q_1 - w_d \right) + p_2^* q_2^* - c \left(q_1 + q_2^* - w_d \right) + \overline{p} w_d \right]$

$$p_{1}^{C} = p_{1}^{B} - \beta (2w_{d} + (k_{f} - w_{f}))$$

$$p_{2}^{C} = p_{2}^{B} - \beta (w_{d} - (k_{f} - w_{f}))$$

$$\Delta p^{C} = \Delta p^{B} - \beta (w_{d} + 2 (k_{f} - w_{f}))$$

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- **Forward contract effect** is captured by $-2\beta w_d$
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- Day-ahead prices: $p_1^C < p_1^T$ and $p_1^C < p_1^P$

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- **Forward contract effect** is captured by $-2\beta w_d$
- Arbitrage effect is captured by $\pm \beta (k_f w_f)$
- Day-ahead prices: $p_1^{\mathcal{C}} < p_1^{\mathcal{T}}$ and $p_1^{\mathcal{C}} < p_1^{\mathcal{P}}$
- Price premium: $\Delta p^{C} < \Delta p^{T}$ and $\Delta p^{C} < \Delta p^{P}$

$$p_{1}^{C} = p_{1}^{B} - \beta (2w_{d} + (k_{f} - w_{f}))$$

$$p_{2}^{C} = p_{2}^{B} - \beta (w_{d} - (k_{f} - w_{f}))$$

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- Day-ahead prices: $p_1^C < p_1^T$ and $p_1^C < p_1^P$
- Price premium: $\Delta p^{C} < \Delta p^{T}$ and $\Delta p^{C} < \Delta p^{P}$
- Spot prices (efficiency): $p_2^T < p_2^C < p_2^P$

▶ Back

Using quarterly splitted data, we regress:

 $\Delta \ln q_t = \alpha + \beta_2 W \hat{p}_t + \beta_5 \hat{p}_t + \beta_6 W + \gamma D_t^{er} + \delta w_t^{er} + \rho X_t + \eta_t$

Coefficients of interest:

- **1** β_2 price response to predicted price premium.
- Pre-trends assumption holds when the overselling behavior of treatment and control groups trend similarly when they face similar incentives.

Back

DiD estimates (other renewables as control group)

| | Pre-trends | FiT | FiP |
|----------------------------------|----------------------|----------------------|----------------------|
| | (1) | (2) | (3) |
| Wind | 0.05*** (0.01) | 0.2*** (0.009) | 0.03*** (0.009) |
| Ŷ | -0.002 (0.002) | -0.002 (0.002) | -0.004** (0.002) |
| $\hat{\rho} \times$ Wind | -0.004 (0.004) | 0.08*** (0.006) | 0.005 (0.003) |
| FiT | | 0.09*** (0.01) | |
| $Wind \times FiT$ | | -0.1*** (0.02) | |
| $\hat{p} \times FiT$ | | 0.0001 (0.003) | |
| $\hat{p} \times Wind \times FiT$ | | -0.08*** (0.007) | |
| FiP | | | -0.01 (0.010) |
| $Wind\timesFiP$ | | | -0.04*** (0.01) |
| $\hat{p} \times FiP$ | | | -0.003 (0.004) |
| $\hat{p} \times Wind \times FiP$ | | | 0.03*** (0.006) |
| Control Observations | Renewables 16,900 | Renewables 34,478 | Renewables 32,780 |



DiD estimates (retailers as control group)



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Response of overselling to price premium

| Pricing | Price Response of Group: | | | Difference in the | | |
|-----------|--------------------------|----------|-----------|-------------------|---------|--|
| Regimes | Wind | Non-wind | Retailers | Price R | esponse | |
| | Renewables | | | | | |
| | (1) | (2) | (3) | (1)-(2) | (1)-(3) | |
| FiPI | 0.064 | 0.008 | 0.079 | -0.076 | -0.006 | |
| | (0.000) | (0.000) | (0.000) | (0.000) | (0.529) | |
| FiT | -0.001 | -0.004 | 0.086 | -0.005 | 0.063 | |
| | (0.882) | (0.004) | (0.000) | (0.151) | (0.000) | |
| FiPII | 0.032 | -0.006 | 0.053 | -0.036 | 0.004 | |
| | (0.000) | (0.000) | (0.000) | (0.000) | (0.503) | |
| FiPI→FiT | -0.065 | -0.013 | 0.008 | -0.071 | -0.069 | |
| | (0.000) | (0.000) | (0.334) | (0.000) | (0.000) | |
| FiT→FiPII | 0.026 | -0.000 | -0.049 | . , | 0.059 | |
| | (0.000) | (0.812) | (0.000) | | (0.000) | |

Notes: This table reports the coefficient of $\Delta \hat{p}_t$ from 14 different regressions similar to equation (??).

