Introduction Optimization Model Optimal Bid Function Case Study Conclusions

# Stochastic programming models for optimal bid strategies in the Iberian Electricity Market

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This work was supported by the Ministerio de Educación y Ciencia of Spain Project DPI2008-02153

August 2009

# Iberian Electricity Market: MIBEL



#### **Derivatives Market**

#### **Physical Futures Contracts**

Financial and Physical Settlement. Positions are sent to OMEL's Mercado Diario for physical delivery.

#### Financial Futures Contracts

OMIClear cash settles the differences between the Spot Reference Price and the Final Settlement Price

#### **Bilateral Contracts**

#### Organized markets

- Virtual Power Plants auctions (EPE)
   Distribution auctions (SD)
- International Capacity Interconnection auctions
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#### Non organized markets

National BC before the spot market
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Hourly action. The matching procedure takes place 24h before the delivery period.

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# Characteristics of Physical Futures and Bilateral Contracts

#### Base Load Futures Contract

- Base Load Futures Contract j consists in a pair  $(L_j^{FC}, \lambda_j^{FC})$ 
  - L<sub>j</sub><sup>FC</sup>: amount of energy (MWh) to be procured each interval of the delivery period by the set U<sub>j</sub> of generation units.
  - $\lambda_i^{FC}$ : price of the contract (c $\in$ /MWh).

#### Bilateral Contracts

- ullet Bilateral Contract k consists in a pair  $\left(L_{kt}^{\mathit{BC}},\lambda_k^{\mathit{BC}}\right)$   $t\in\mathcal{T}$ 
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# Integration of the futures and bilateral contracts in the day-ahead bid

The energies  $L_j^{FC}$  and  $L_{kt}^{BC}$  should be integrated in the MIBEL's day-ahead bid respecting the two following rules:

- If generator i contributes with  $f_{itj}$  MWh at period t to the coverage of the FC j, then the energy  $f_{itj}$  must be offered to the pool for free (instrumental price bid).
- If generator i contributes with  $b_{it}$  MWh at period t to the coverage of the BCs, then the energy  $b_{it}$  must be excluded from the bid to the day-ahead market. Unit i can offer its remaining production capacity  $\overline{P}_i b_{it}$  to the pool.

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- the optimal economic dispatch of the physical futures
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- the optimal bidding at Day-Ahead Market abiding by the MIBEL rules
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The objective of the study is to decide:

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- Stochastic mixed integer quadratic programming model
- Price-taker generation company
- Set of thermal generation units, I, with quadratic generation costs.
- Optimization horizon of 24h, T
- Set of physical futures contracts, F, of energy  $L_j^{FC}$   $j \in F$ .
- A pool of bilateral contracts of energy  $L_t^{\mathit{BC}} = \sum_k L_{kt}^{\mathit{BC}}, \ t \in \mathcal{T}.$
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#### First stage variables: $t \in T$ , $i \in I$

- Instrumental price offer bid :  $q_{it}$
- Scheduled energy for futures contract j:  $f_{itj}$   $j \in F$
- Scheduled energy for bilaterals contract: b<sub>it</sub>

#### Second stage variables $t \in T$ , $i \in I$ , $s \in S$

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# Physical Future and Bilateral Contracts model

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$$\sum_{i \in U_j} f_{itj} = L_j^{FC} , j \in F , t \in T$$
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#### Instrumental price bid:

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Problem definition
Variables
FC and BC model constraints
Day-Ahead Market model constraints
Objective function
Problem OBIFUC

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# Objective function

## Maximization of the E.V. of the profit from the day-ahead market

$$\max_{p,q,f,b} \sum_{t \in T} \sum_{i \in I} \sum_{s \in S} P^s \left[ \lambda_t^s p_{it}^{\scriptscriptstyle M,s} - \left( c_i^I p_{it}^s + c_i^I (p_{it}^s)^2 \right) \right]$$

### Incomes from Futures and Bilateral contracts (constant):

- Futures contracts:  $\sum_{t \in T} \sum_{j \in J} \left( \lambda_j^{FC} \lambda_t \right) L_j^{FC}$
- Bilateral contracts:  $\sum_{t \in T} \sum_{k \in K} \lambda_k^{BC} L_{kt}^{BC}$

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# Summary of the model

#### Problem OBIFUC

(Optimal bid with BIlateral and FUtures Contracts)

Max E[Profit from the Day-ahead market]

s.t:

Physical future contract coverage

Bilateral contract coverage

Matched energy

Instrumental price bid

Total energy generation

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# Optimal Matched Energy

#### Lemma

Let  $x^{*'} = [p^*, p^{M,*}, q^*, f^*, b^*]'$  be an optimal solution of problem (OBIFUC). Then for any thermal unit i the optimal value of the matched energy  $p_{it}^{M,s*}$  can be expressed as:

$$p_{it}^{M,s*} = \max\{q_{it}^*, \rho_{it}^s(b_{it}^*)\}$$
 (1)

where  $\rho_{it}^s(x)$  is a known function

(Proof: KKT conditions of problem (OBIFUC))

# Function $\rho_{it}^s(x)$

## Function $\rho_{it}^s(x)$

$$\rho_{it}^{s}(x) = \begin{cases} [\underline{P}_{i} - x]^{+} & \theta_{it}^{s} - x < [\underline{P}_{i} - x]^{+} \\ \theta_{it}^{s} - x & [\underline{P}_{i} - x]^{+} \le \theta_{it}^{s} - x \le \overline{P}_{i} - x \\ \overline{P}_{i} - x & \theta_{it}^{s} > \overline{P}_{i} \end{cases}$$
(2)

with 
$$\theta_{it}^s = (\lambda_t^s - c_i^I)/2c_i^q$$

# Bid function's optimality conditions

## Definition (Bid function's optimality conditions)

Let  $x^{*'}=[p^*,p^{M,*},q^*,f^*,b^*]'$  be the optimal solution of the (OBIFUC) problem. The bid function  $\lambda^{b*}_{it}$  of a thermal unit i committed on period t is said to be optimal if the value of the matched energy function associated to any scenario's clearing price  $\lambda^s_t$ ,  $p^M_{it}(\lambda^s_t)$ , coincides with the optimal matched energy  $p^{M,s*}_{it}$ , that is:

$$p_{it}^{\mathit{M}}(\lambda_{t}^{\mathit{s}}) = p_{it}^{\mathit{M},\mathit{s}*} = \max\{q_{it}^{*}, \rho_{it}^{\mathit{s}}(b_{it}^{*})\}$$

## Lemma (Optimal bid function)

Let  $x^{*'} = [p^{M,*}, p^*, q^*, f^*, b^*]'$  be an optimal solution of the (OBIFUC) problem and i any thermal unit committed on period t at the optimal solution. Then the bid function:

$$\lambda_{it}^{*}(p_{it}; b_{it}^{*}, q_{it}^{*}) = \begin{cases} 0 & \text{if } p_{it} \leq q_{it}^{*} \\ 2c_{i}^{q}(p_{it} + b_{it}^{*}) + c_{i}^{l} & \text{if } q_{it}^{*} < p_{it} \leq (\overline{P}_{i} - b_{it}^{*}) \end{cases}$$
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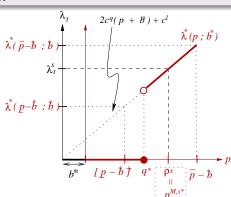
This result is also valid when the unit commitment is included in the (OBIFUC) model.

## Matched energy at scenario s:

$$p_{it}^{M}(\lambda_t^s) = p_{it}^{M,s*} = \max\{q_{it}^*, \rho_{it}^s(b_{it}^*)\}$$

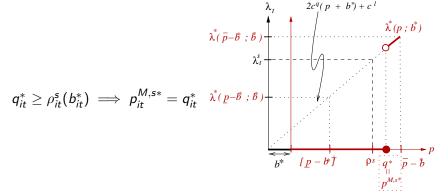
$$\tag{4}$$

$$q_{it}^* \leq \rho_{it}^s(b_{it}^*) \Longrightarrow$$
 $\Longrightarrow p_{it}^{M,s*} = \rho_{it}^s(b_{it}^*)$ 



## Matched energy at scenario s:

$$p_{it}^{M}(\lambda_{t}^{s}) = p_{it}^{M,s*} = \max\{q_{it}^{*}, \rho_{it}^{s}(b_{it}^{*})\}$$
(4)



- Real data from the Spanish Market about the generation company and the market prices (from January 1<sup>rst</sup> to December 31<sup>rst</sup>, 2008).
- 9 thermal generation units (6 coal, 3 fuel) from a Spanish generation company with daily bidding in the MIBEL

$[\overline{P} - \underline{P}] (MW)$	160-243		250-550				160-340		
						4			
$[\overline{P} - \underline{P}]$ (M	W)	60-140	160-34		0 110-1		.57   110-1		
					4				

- 61 scenarios simulated from a multivariate times series + factor model.
- Model implemented and solved with AMPL/CPLEX 11.0.

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$[\overline{P} - \underline{P}]$ (MW)	160-243		250-550		80-260		160-340		30-70	
min <sub>on/off</sub> (h)	3			3		3		4		1
$\overline{[P-P]}$ (M	$\overline{[P-P]}$ (MW)		60-140		0	110-157		110-157		
min <sub>on/off</sub> (	min <sub>on/off</sub> (h)		3			4		4		

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min	$_{n/off}$ (h)	3			3		3		4		1
[	$\overline{[P-P]}$ (MW)		60-140		160-340		110-157		110-157		
	min <sub>on/off</sub> (h)		3		3		4		4		

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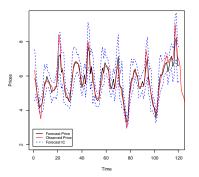
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$\overline{[P-P]}$ (M)	$[\overline{P} - \underline{P}]$ (MW)		60-140		10	110-15		57 110-1		
min <sub>on/off</sub> (I	min <sub>on/off</sub> (h)		3			4		4		

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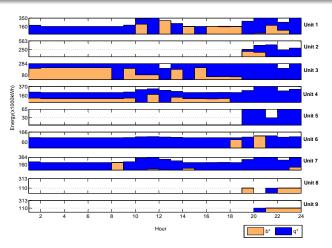
# Uncertainty characterization

- Uncertainty source: DAM Price,  $\lambda^s$ , characterized as a time series. The prices for the day in study must be forecasted.
- Price scenario forecasting method:



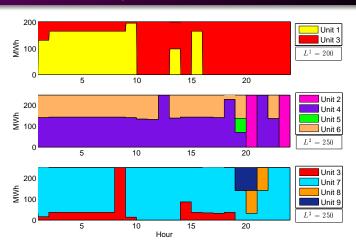
- 1 24 time series are considered
- Estimation of the factor model
- The forecasting model is specified as a linear multiple regression model with the factors as predictors
- Simulation of the price scenarios

## Results: bilateral and futures contracts settlement



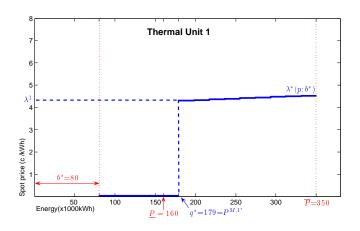
Settlement of the three futures contracts ( $L^{FC}$ =700MW) and the portfolio of bilateral contracts ( $L^{BC}$ =300MW)

# Results: economic dispatch of futures contracts



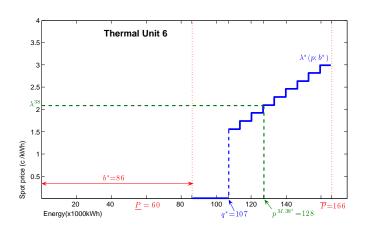
Economic dispatch of each futures contract among the corresponding set of units

# Results: optimal bidding curve



Optimal bidding curve for thermal unit 1 at interval 23

# Results: optimal bidding curve



Optimal bidding curve for thermal unit 6 at interval 18

## Conclusions

- It has been built an Optimal Bidding Model for a price-taker generation company operating both Futures and Bilateral Contracts.
- The stochasticity of the spot market price has been taken into account and it has been represented by a scenario set.
- The model developed gives the producer:
  - The optimal bid for the spot market.
  - Unit commitment
  - Optimal allocation of the physical futures and bilateral contracts among the thermal units

following in detail the MIBEL rules.

Introduction
Optimization Model
Optimal Bid Function
Case Study
Conclusions

# Stochastic programming models for optimal bid strategies in the Iberian Electricity Market

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This work was supported by the Ministerio de Educación y Ciencia of Spain Project DPI2008-02153

August 2009