

# A structural risk-neutral model for pricing and hedging power derivatives

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# Looking for a power spot price model

## Applications

- pricing of derivatives on the spot
- asset valuation (strip of hourly fuel spread options)
- hedging
- energy market risk management

## Model requirements

- realistic
- robust
- tractable
- consistent

# Two types of modeling

## Modeling futures prices

- pros** modeling the real available instruments
- cons** introduction of many parameters to reconstruct hourly futures prices

## Modeling spot prices

- 1** Exogeneous
  - pros** tractability
  - cons** correlation
- 2** Equilibrium
  - pros** correlation
  - cons** complexity

## Related works

### Electricity prices exogeneous dynamics

Deng (00), Benth et al. (03, 07, 09), Burger et al. (04), Kolodnyi (04), Cartea & Figueroa (05), Geman & Roncoroni (06)

### Equilibrium model

	Spot	Futures	Options
Pirrong & Jermakyan (00)	×	×	
Barlow (02)	×		
Kanamura & Ohashi (07)	×		
Cartea & Villaplana (08)	×	×	
Coulon & Howison (09)	×	×	
Lyle & Elliot (09)	×	×	×

# This talk

## Objectives

pricing and hedging power derivatives...

... using an improved version of Aïd, C., Nguyen & Touzi  
 (09) Structural Risk-Neutral model

	Spot	Futures	Options
Aïd, C., Nguyen & Touzi (09)	×	×	
improved SRN model	×	×	×

# Initial SRN Model

## Variables

$n$	fuels, $1 \leq i \leq n$
$D_t$	demand (MW)
$C_t^i$	capacities (en MW)
$S_t^i$	fuel prices
$h_i$	heat rates ( $h_i S_t^i$ en €/MWh, $\nearrow$ en $i$ )

Electricity price (€/MWh)

$$\hat{P}_t = \sum_{i=1}^n h_i S_t^i \mathbf{1}_{\{\sum_{k=1}^{i-1} C_t^k \leq D_t \leq \sum_{k=1}^i C_t^k\}}$$

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# Initial SRN model

## Pros

- Consistency between electricity prices and fuel prices
- Consistency between electricity prices and demand

# Initial SRN model

## Pros

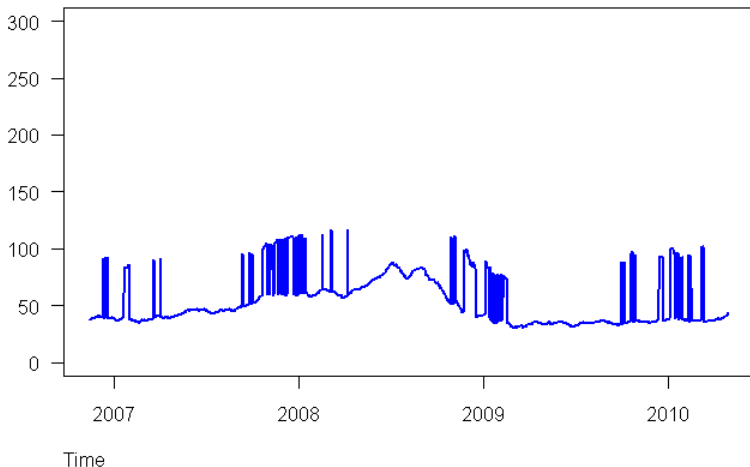
- Consistency between electricity prices and fuel prices
- Consistency between electricity prices and demand

## Cons

- Marginal fuel cost is not the spot price
  - 1 Non-convex technical constraints
  - 2 Strategic behaviour (Hortaçsu & Puller, RAND J. of Economics 2008)
  - 3 Fixed cost recovery problem for peak-load generation plants

# Initial SRN Model - illustration

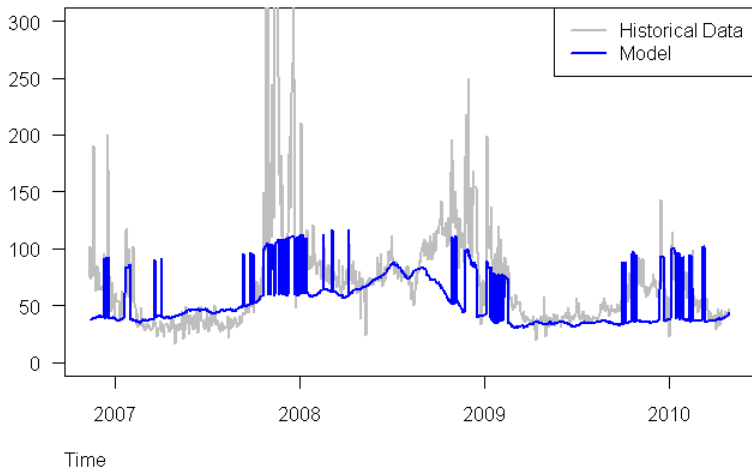
Spot price (in €/MWh)





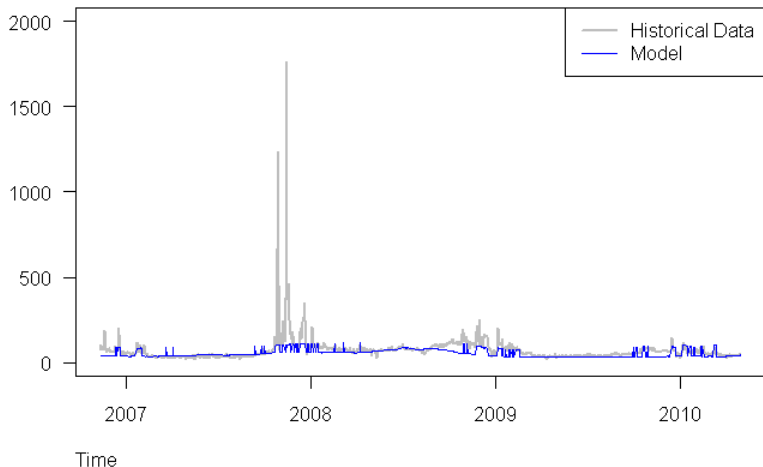
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Spot price (in €/MWh)



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Spot price (in €/MWh)



## Improved SRN model

- Marginal fuel cost  $\hat{P}_t := \sum_{i=1}^n h_i S_t^i \mathbf{1}_{\{\sum_{k=1}^{i-1} C_t^k \leq D_t \leq \sum_{k=1}^i C_t^k\}}$

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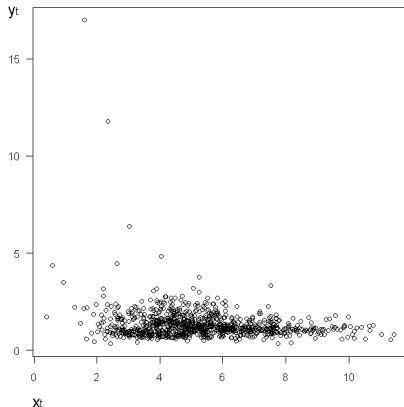
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$y_t := \frac{P_t}{\bar{P}_t}$  as a (nonlinear) function of  $x_t := \bar{C}_t - D_t$

# Improved SRN model - Estimation



## Observation

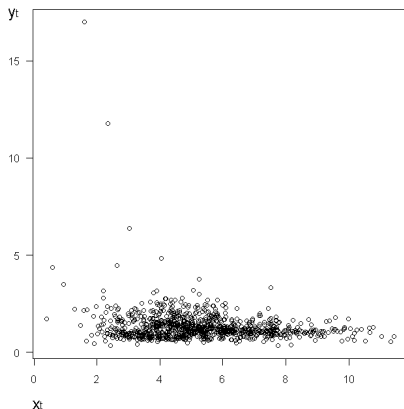
- Decreasing relation
- Difficult estimation

## Idea

- Quantiles

Figure: PowerNext - 19th hours  
Nov, 13th 06 to April 30th 10

# Improved SRN model - Estimation



## Observation

- Decreasing relation
- Difficult estimation

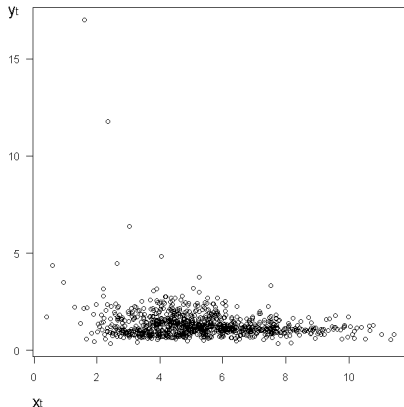
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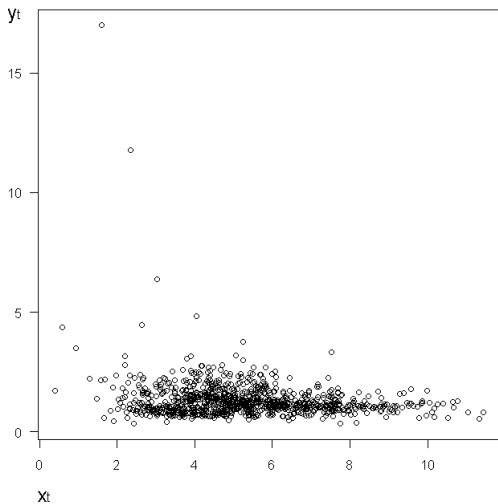
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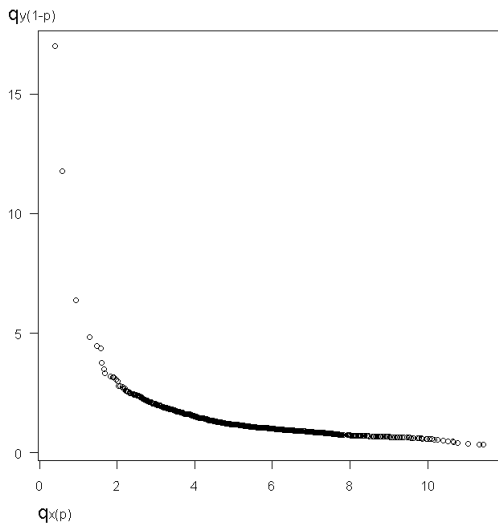
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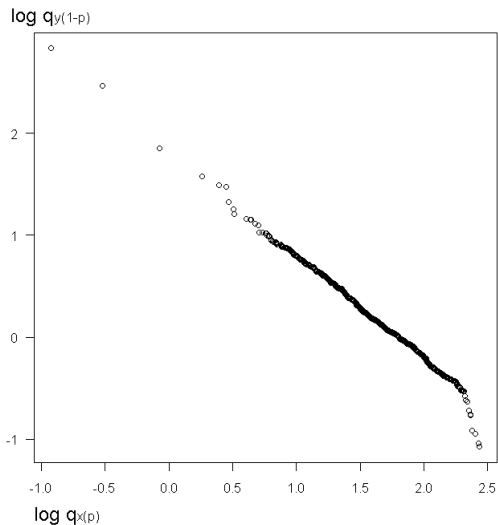
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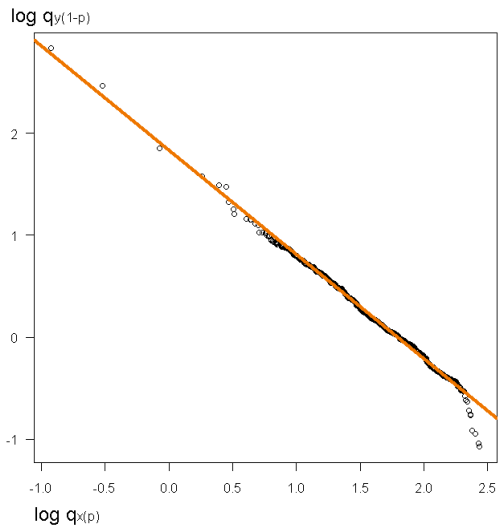
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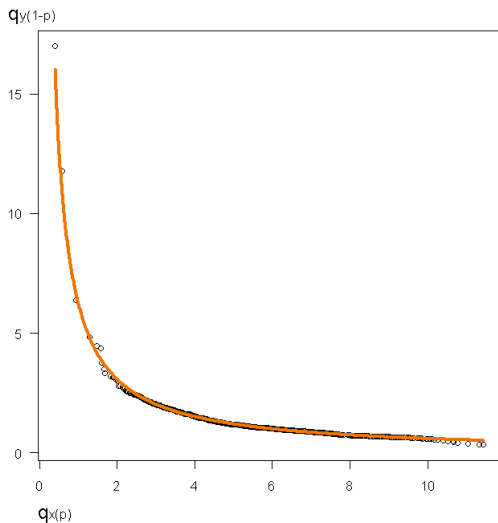
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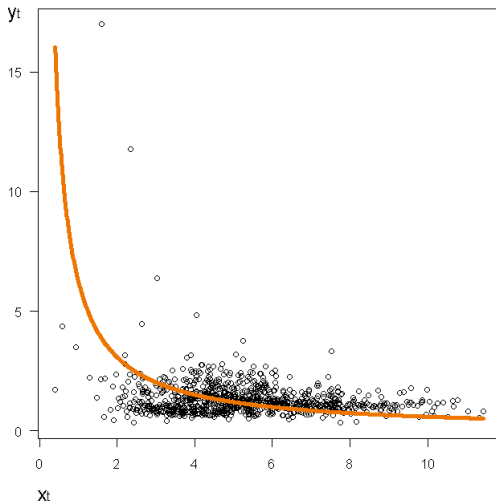
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Estimated relation :  $y_t = \frac{\gamma}{x_t^\nu}$

## Improved SRN model

$$P_t = g \left( \sum_{k=1}^n C_t^k - D_t \right) \times \left( \sum_{i=1}^n h_i S_t^i \mathbf{1}_{\left\{ \sum_{k=1}^{i-1} C_t^k \leq D_t \leq \sum_{k=1}^i C_t^k \right\}} \right)$$

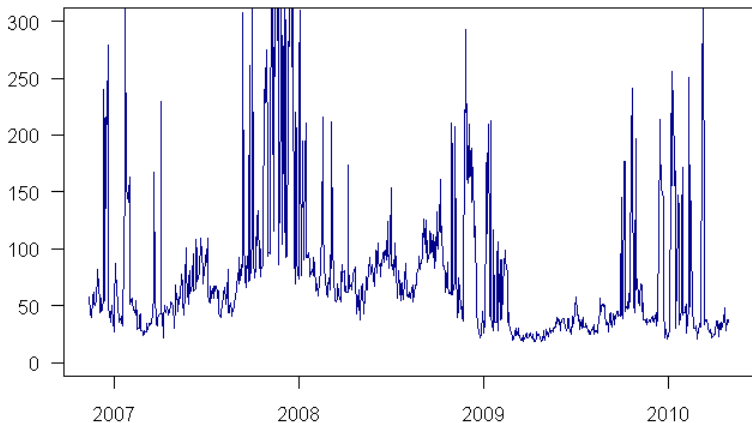
with **scarcity** function

$$g(x) := \min \left( \frac{\gamma}{x^\nu}, M \right) \mathbf{1}_{\{x > 0\}} + M \mathbf{1}_{\{x \leq 0\}}$$



# Improved SRN model - Back-testing

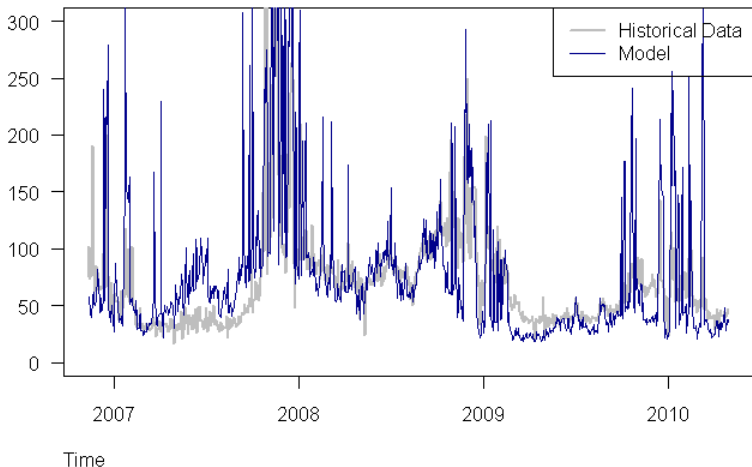
Spot price (in €/MWh)



Time

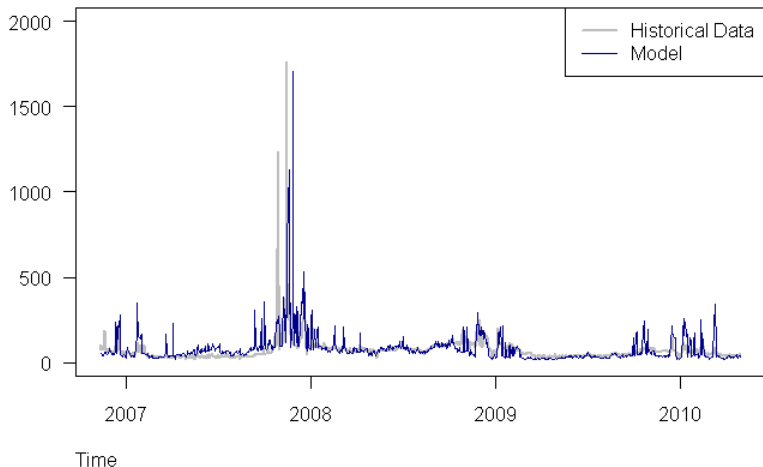
# Improved SRN model - Back-testing

Spot price (in €/MWh)



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# Pricing & hedging

## Pricing

- incomplete market
- need for a **hedging criterion**
- super-replication, utility indifference or mean-variance
- our choice : **Local Risk Minimization**

## Local Risk Minimization (Pham (00), Schweizer (01))

- valuation : expected discounted payoff under  $\hat{\mathbb{Q}}$
- allows to decompose contingent claim into hedgeable part (fuels) and non-hedgeable part (demand, capacities)
- allows explicit formulas

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## Dynamics of fuels

Assume  $r$  constant, convenience yields and storage costs zero for simplicity.

### Fuels

$n \geq 1$  fuels (as coal, gas, oil ...) whose cost  $h_i S^i$  to produce 1 MWh of electricity follows

$$dS_t^i = S_t^i(\mu_t^i dt + \sigma_t^i dW_t^{S,i})$$

where  $W^{S,i}$  are correlated BMs and coeff's are chosen so that  $h_1 S^1 < \dots < h_n S^n$  (model spreads  $Y^i = h_{i+1} S^{i+1} - h_i S^i$  as independent geometric BMs).

### NA and completeness assumption

There exists a unique risk-neutral probability  $\mathbb{Q} \sim \mathbb{P}$  for  $S$ .

# Local risk minimization I

Roughly speaking, let  $X$  be a multidimensional (discounted) price process

- Introduced by Föllmer-Schweizer (1991)
- Under regularity condition, any payoff  $H$  with maturity  $T$

$$H = H_0 + \int_0^T \xi_t^H dX_t + L_T^H$$

where  $H_0 \in \mathbb{R}$  and  $L^H$  martingale orthogonal to  $X$ .

- $\int_0^T \xi dX$  is the hedgeable part,  $L_T^H$  the residual risk,  $H_0 + L_T^H$  the cost of the strategy
- How to compute  $H_0, \xi^H, L^H$ ? Easy when  $X$  is a martingale : use Kunita-Watanabe decomposition !

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- When  $X$  is not a martingale but not far from being so ...
- Föllmer-Schweizer (1991) : there exists a risk-neutral  $\hat{\mathbb{Q}}$  for  $X$  s.t.

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# Dynamics of demand and capacities

## Demand & capacities

$$dD_t = a(t, D_t) dt + b(t, D_t) dW_t^D$$

$$dC_t^i = \alpha_i(t, C_t^i) dt + \beta_i(t, C_t^i) dW_t^{C,i}$$

where  $W^D$ ,  $W^C$  and  $W^S$  are independent BMs.

## Minimal martingale measure

The minimal martingale measure  $\hat{\mathbb{Q}}$  is given by

$$\hat{\mathbb{Q}}|_{\mathcal{F}_t} = \mathbb{Q}|_{\mathcal{F}_t^S} \otimes \mathbb{P}|_{\mathcal{F}_t^{C,D}}$$

where  $\mathcal{F}_t$  is the filtration generated by  $W^S$ ,  $W^D$ ,  $W^C$ .



# Futures

Under our assumptions, we can prove the following

Futures prices  $F_t^e(T) = \widehat{\mathbb{E}}_t[P_T]$

$$F_t^e(T) = \sum_{i=1}^n h_i G_i^T(t, C_t, D_t) F_t^i(T)$$

with :

$$G_i^T(t, C_t, D_t) = \mathbb{E}_t \left[ g \left( \sum_{k=1}^n C_T^k - D_T \right) \mathbf{1}_{\left\{ \sum_{k=1}^{i-1} C_T^k \leq D_T \leq \sum_{k=1}^i C_T^k \right\}} \right]$$

## Futures prices - hedging

### Futures price dynamics

$$dF_t^e(T) = \sum_{i=1}^n h_i \left[ G_i^T(t, C_t, D_t) dF_t^i(T) + F_t^i(T) dG_i^T(t, C_t, D_t) \right]$$

$$dG_i^T(t, C_t, D_t) = \sum_{k=1}^n \frac{\partial G_i^T}{\partial c_k}(t, C_t, D_t) \beta_k(t, C_t^k) dW_t^{C,k} + \frac{\partial G_i^T}{\partial z}(t, C_t, D_t) b(t, D_t) dW_t^D$$

so that

$$dF_t^e(T) = \theta_t^S dW_t + \theta_t^C dW_t^C + \theta_t^D dW_t^D$$

for adapted suitable processes  $\theta^S, \theta^C, \theta^D$ , which are explicitly computable.

## Futures prices - hedging

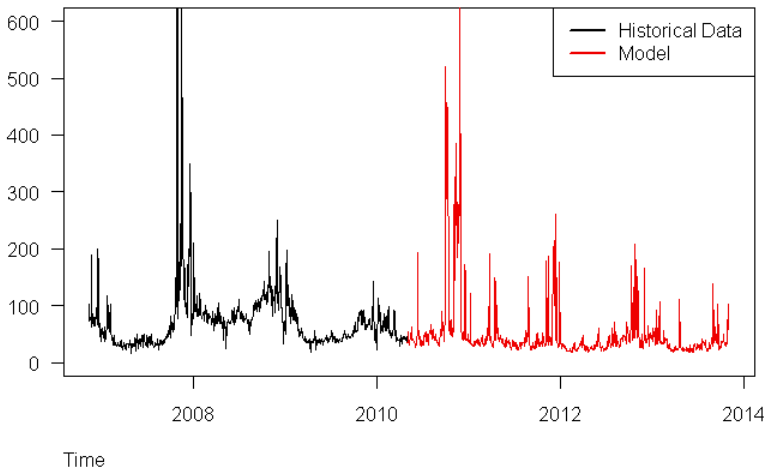
- To go further, need to choose more specific dynamics for demand and capacities
- deterministic part for seasonality + Ornstein-Uhlenbeck
- $G_i^T$  explicite as function of *extended incomplete Goodwin-Staton integral* :

$$\tilde{G}(x, y; \nu) = \int_x^\infty \frac{1}{(y+z)^\nu} e^{-z^2} dz$$

- ... for which efficient numerical algorithms are provided in Aïd, C. & Langrené (10).

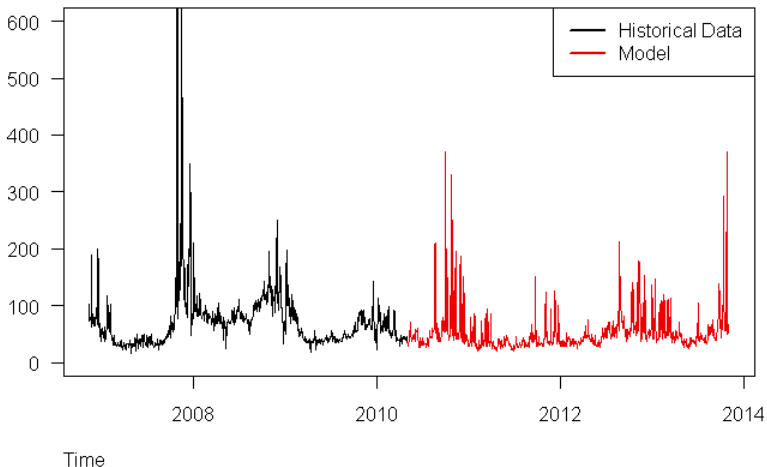
# Futures prices - hedging : spot simulations

**Spot price (in €/MWh)**



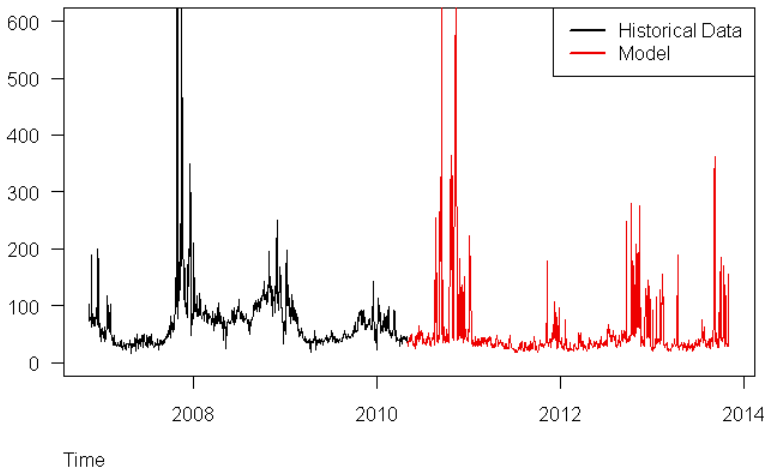
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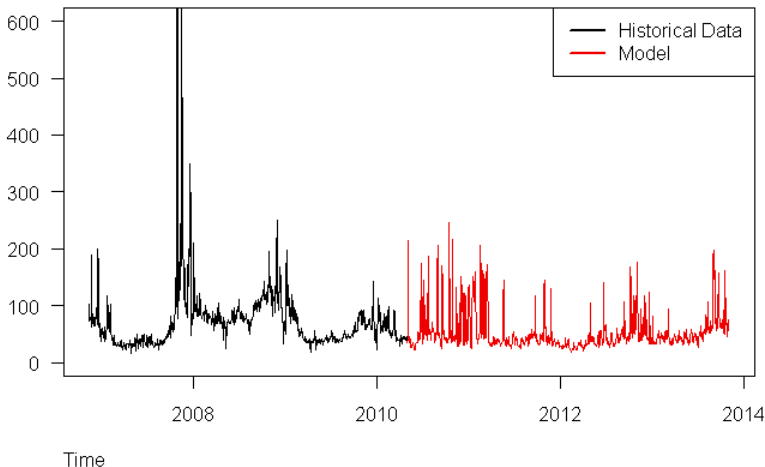
# Futures prices - hedging : spot simulations

**Spot price (in €/MWh)**



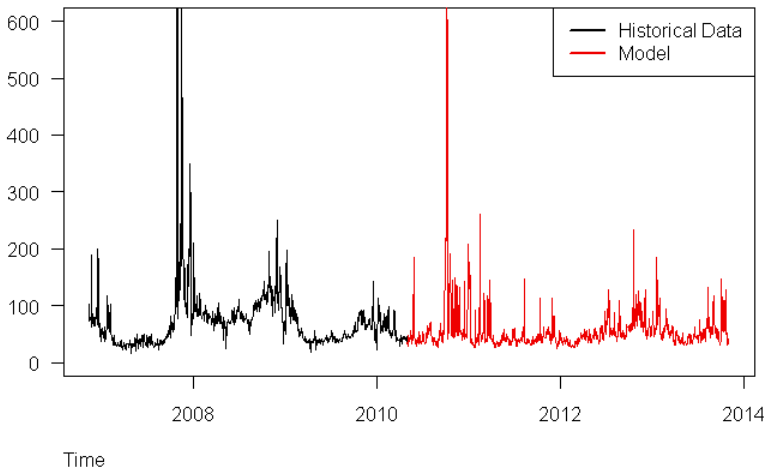
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Spot price (in €/MWh)



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# Futures prices - hedging

## Numerical test

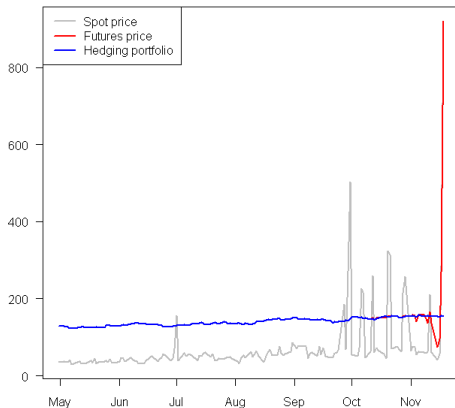
- Hedging a 3-months electricity futures with a delivery period of 1 hour
- with a daily rebalanced basket of futures contracts on fuels

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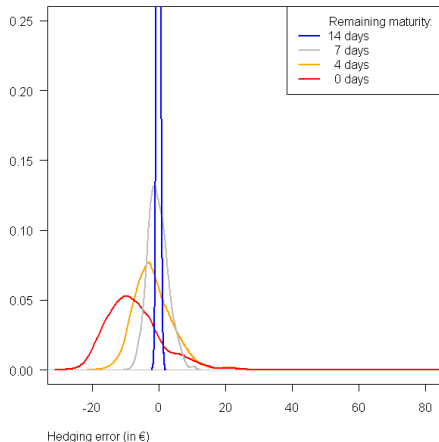
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Sample paths (in €)



# Futures prices - hedging

Distribution of hedging error: Time evolution



## Remarks

- Positive values are losses
- Far from maturity : perfect hedge ; electricity futures is equivalent to a basket of fuels
- Close to maturity : inefficient hedge

# Spread options

## Spread option with a 2 fuel model

The price  $\pi_0$  at time  $t = 0$  of a call spread option with pay-off  $H = (P_T - h_1 S_T^1 - K)^+$  is given by :

$$\pi_0 = \int_{\mathbb{R}^2} f_{C_T^1 - D_T}(z) f_{C_T^2}(c) \{ \phi_1(c, z) \mathbf{1}_{\{z > 0\}} + \phi_2(c, z) \mathbf{1}_{\{z \leq 0\}} \} dc dz,$$

$$\phi_1 = (g - 1) BS_0(\sigma_1, K) \mathbf{1}_{\{g > 1\}}$$

$$\phi_2 = g \int_0^\infty \hat{f}_{Y_T^1}(y) BS_0\left(\sigma_2, \frac{K + (1 - g)y}{g}\right) \left(\mathbf{1}_{\{g \leq 1\}} + \mathbf{1}_{\{g > 1\}} \mathbf{1}_{\{y < \frac{K}{g-1}\}}\right) dy$$

$$+ \left( g Y_0^2 \mathcal{N}\left(\frac{\left(r - \frac{\sigma_1^2}{2}\right) T - \ln\left(\frac{K}{(g-1)Y_0^1}\right)}{\sigma_1 \sqrt{T}}\right) + (g - 1) BS_0\left(\sigma_1, \frac{K}{g - 1}\right) \right) \mathbf{1}_{\{g > 1\}}$$

with  $g := g(c + z)$ .

## Spread options

- semi-explicit formula : numerical integration
- partial hedging with futures on fuels and electricity, semi-explicit formulae for partial hedging strategy (not only for spread options)
- applied on European dark spread (i.e. energy - gas) call option with a period of delivery of 1 hour

## Hedging with futures on electricity

Consider  $H = \varphi(F_T^e(T^*), F_T(T^*), C_T, D_T)$  with  $T^* > T$ .

- By Markov, its  $\widehat{\mathbb{Q}}$ -price in  $t$  is  $\phi(t, F_t, C_t, D_t)$  with  $\phi(t, x, c, z)$  regular
- $H$ 's decomposition into hedgeable part/residual risk is

$$H = \widehat{\mathbb{E}}[H] + \int_0^T \widehat{\xi}_t dF_t + \int_0^T \widehat{\xi}_t^e dF_t^e + \widehat{L}_T$$

where

$$\widehat{\xi}_t^e = \frac{1}{\|(\theta_t^C, \theta_t^D)\|^2} \left( \sum_i \theta_t^{C,i} \beta_i \partial_{c_i} \phi + \theta_t^D b \partial_z \phi \right)$$

$$\widehat{\xi}_t = \partial_{y_i} \phi + \frac{h_i G_i^{T^*}}{\|(\theta_t^C, \theta_t^D)\|^2} \left( \sum_i \theta_t^{C,i} \beta_i \partial_{c_i} \phi + \theta_t^D b \partial_z \phi \right)$$

$\widehat{L}_T$  can be computed explicitly as well

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- SRN electricity spot price model with a scarcity function
- allows futures and derivatives pricing and hedging
- nevertheless, only fuels dependent part can be hedged ...
- ... unless we use energy future for partially hedging demand and capacities risk (see the paper Aïd-C.-Langrené)

## Perspectives

- comparison with "real" quoted futures, calibration **dynamics**
- utility-based pricing of futures, options ...
- optimal investment/production problem, optimal switching



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## References

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