Introduction	NordPool	The spot-forward relation	The information approach	The equilibrium approach	Conclusions
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Pricing of electricity forwards - The risk premium -

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Conclusions

Introduction

- Problem: what is the connection between spot and forward prices in electricity?
- Electricity is a non-storable commodity
- How to explain the risk premium?
 - Empirical and economical evidence: Sign varies with time to delivery
- Propose two approaches:
 - 1. Information approach
 - 2. Equilibrium approach
- Purpose: try to explain the risk premium for electricity



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Outline of talk

- 1. Example of an electricity market: NordPool
- 2. The "classical" spot-forward relation
- 3. The information approach
- 4. The equilibrium approach
- 5. Conclusions



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Example of an electricity market: NordPool



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Introduction				Conclusion

- The NordPool market organizes trade in
 - Hourly spot electricity, next-day delivery
 - Financial forward contracts
 - In reality mostly futures, but we make no distinction here

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- European options on forwards
- Difference from "classical" forwards:
 - Delivery over a period rather than at a fixed point in time



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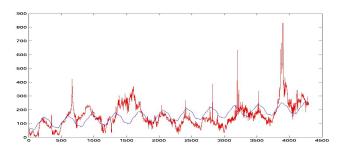
Elspot: the spot market

- A (non-mandatory) hourly market with physical delivery of electricity
- Participants hand in bids before noon the day ahead
 - Volume and price for each of the 24 hours next day
 - Maximum of 64 bids within technical volume and price limits
- NordPool creates demand and production curves for the next day before 1.30 pm



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- The system price is the equilibrium
 - Reference price for the forward market
- Historical system price from the beginning in 1992



• note the spikes....





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Conclusions

The forward market

- Forward with delivery over a period
- Financial market
- Settlement with respect to system price in the delivery period
- Delivery periods
 - Next day, week or month
 - Quarterly (earlier seasons)
 - Yearly
- Overlapping settlement periods (!)
- Contracts also called swaps: Fixed for floating price



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The option market

- European call and put options on electricity forwards
 - Quarterly and yearly electricity forwards
- Low activity on the exchange
- OTC market for electricity derivatives huge
 - Average-type (Asian) options, swing options



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The spot-forward relation: some "classical" theory

• The no-arbitrage forward price (based on the buy-and-hold strategy)

 $F(t,T) = S(t)e^{r(T-t)}$

• A risk-neutral expression of the price as

 $F(t, T) = \mathbb{E}_Q[S(T) | \mathcal{F}_t]$

• The risk premium is defined as

 $R(t, T) = F(t, T) - \mathbb{E}\left[S(T) \,|\, \mathcal{F}_t\right]$





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- In the case of electricity:
 - Storage of spot is *not* possible (only indirectly in water reservoirs)
 - Buy-and-hold strategy fails
 - No foundation for the "classical" spot-forward relation

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- ...and hence no rule for what Q should be!
- Thus: What is the link between F(t, T) and S(t)?



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Conclusions

Economical "intuition" for electricity

• Short-term positive risk premium

- Retailers (consumers) hedge "spike risk"
- Spikes lead to expensive electricity
- Accept to pay a premium for locking in prices in the short-term
- Long-term negative risk premium
 - Producers hedge their future production
 - Long-term contracts (quarters/years)
- The market may have a change in the sign of the risk premium



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Conclusions

Empirical evidence for electricity

- Longstaff & Wang (2004), Geman & Vasicek : PJM market
 - Positive premium in the short-term market
- Diko, Lawford & Limpens (2006)
 - Study of EEX, PWN, APX, based on multi-factor models
 - Changing sign of the risk premium
- Kolos & Ronn (2008)
 - Market price of risk: expected risk-adjusted return
 - Multi-factor models
 - Negative on the short-term, positive on the long term



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- Explore two possible approaches to price electricity futures
 - 1. The information approach based on market forecasts
 - 2. An equilibrium approach based on market power of the consumers and producers
- For simplicity we first restrict our attention to F(t, T)
 - Electricity forwards deliver over a time period
 - Creates technical difficulties for most spot models
 - Ignore this here
 - In the equilibrium approach we consider delivery periods

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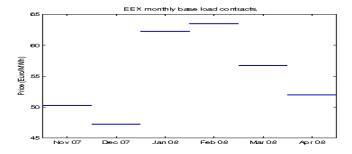
Conclusions

The information approach: idea

- Idea is the following:
 - Electricity is non-storable
 - Future predicitions about market will not affect current spot
 - However, it will affect forward prices
- Stylized example:
 - Planned outage of a power plant in one month
 - Will affect forwards delivering in one month
 - But *not* spot today
- Market example
 - In 2007 market knew that in 2008 CO2 emission costs will be introduced
 - No effect on spot prices in the EEX market in 2007
 - However, clear effect on the forward prices around New Year



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The information approach: definition

• Define the forward price as

 $F_{\mathcal{G}}(t, T) = \mathbb{E}\left[S(T) \,|\, \mathcal{G}_t\right]$

- \mathcal{G}_t includes spot information up to current time (\mathcal{F}_t) and forward-looking information
- The information premium

$$I_{\mathcal{G}}(t, T) = F_{\mathcal{G}}(t, T) - \mathbb{E}\left[S(T) \,|\, \mathcal{F}_t\right]$$



Introduction	NordPool 000000	The information approach	The equilibrium approach	Conclusions

- Rewrite the information premium using double conditioning and $\mathcal{F}_t \subset \mathcal{G}_t$

 $I_{\mathcal{G}}(t,T) = \mathbb{E}\left[S(T) \mid \mathcal{G}_{t}\right] - \mathbb{E}\left[\mathbb{E}\left[S(T) \mid \mathcal{G}_{t}\right] \mid \mathcal{F}_{t}\right]$

- The information premium is the residual random variable after projecting $F_{\mathcal{G}}(t, T)$ onto $L^2(\mathcal{F}_t, P)$
 - $\mathit{I_{\mathcal{G}}}$ measures how much more information is contained in \mathcal{G}_t compared to \mathcal{F}_t



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• Note that

$\mathbb{E}\left[I_{\mathcal{G}}(t,T)\,|\,\mathcal{F}_t\right]=0$

- $I_{\mathcal{G}}(t,T)$ is orthogonal to R(t,T)
 - The risk premium R(t, T) is \mathcal{F}_t -adapted
- Thus, impossible to obtain a given $I_{\mathcal{G}}(t, T)$ from an appropriate choice of Q in R(t, T)
 - Including future information creates new ways of explaining risk premia



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Example: temperature predictions

• Temperature dynamics

$$dY(t) = \gamma(\mu(t) - Y(t)) dt + \eta dB(t)$$

• Spot price dynamics

 $dS(t) = \alpha(\lambda(t) - S(t)) dt + \sigma \rho dB(t) + \sigma \sqrt{1 - \rho^2} dW(t)$

- ρ is the correlation between temperature and spot price
 - NordPool: $\rho <$ 0, since high temperature implies low prices, and vice versa





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- Suppose we have some temperature forecast at time T_1
 - Full, or at least some, knowledge of $Y(T_1)$

 $\mathcal{F}_t \subset \mathcal{G}_t \subset \mathcal{H}_t \triangleq \mathcal{F}_t \lor \sigma(Y(T_1))$

• We want to compute (for $T \leq T_1$)

 $F_{\mathcal{G}}(t, T) = \mathbb{E}\left[S(T) \,|\, \mathcal{G}_t\right]$

- Program:
 - 1. Find a Brownian motion wrt \mathcal{G}_t
 - 2. Compute the conditional expectation





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- From the theory of "enlargement of filtrations":
 - There exists a \mathcal{G}_t -adapted drift θ_1 such that \widetilde{B} is a \mathcal{G}_t -Brownian motion,

 $d\widetilde{B}(t) = dB(t) - \theta_1(t) dt$

• The drift is expressed as

$$\theta_1(t) = a_1(t) \left(e^{\gamma T_1} \mathbb{E}[Y(T_1) | \mathcal{G}_t] - e^{\gamma t} Y(t) - \gamma \int_t^{T_1} \mu(u) e^{\gamma u} \, du \right)$$

$$a_1(t) = rac{2\gamma \mathrm{e}^{\gamma t}}{\eta(\mathrm{e}^{2\gamma T_1} - \mathrm{e}^{2\gamma t})}$$

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• Dynamics of S in terms of \widetilde{B} :

$$dS(t) = \alpha \left(\rho \frac{\sigma}{\alpha} \theta_1(t) + \lambda(t) - S(t) \right) dt + \sigma \rho d\widetilde{B}(t) + \sigma \sqrt{1 - \rho^2} dW(t)$$

- Note that we have a mean-reversion level being *stochastic*
 - Explicitly dependent on the temperature prediction and todays temperature

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• $\theta_1(t)$ is the market price of information, or information yield



- - Calculate the forward price

$$F_{\mathcal{G}}(t, u) = \mathbb{E}\left[S(u) \mid \mathcal{F}_{t}\right] + I_{\mathcal{G}}(t, T)$$

= $S(t)^{\exp(-\alpha(T-t))} + \alpha \int_{t}^{T} \lambda(s) e^{-\alpha(T-s)} ds + I_{\mathcal{G}}(t, T)$

• The information premium is, by applying the definition

$$I_{\mathcal{G}}(t, T) = \rho \sigma \mathbb{E}\left[\int_{t}^{T} e^{-\alpha(T-s)} dB(s) | \mathcal{G}_{t}\right]$$

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• Use that
$$\widetilde{B}$$
 is a \mathcal{G}_t -Brownian motion



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• Expression for the information premium

$$\rho_{\mathcal{G}}(t,T) = \rho_{\mathcal{A}}(t,T) \left(e^{\gamma T_1} \mathbb{E}\left[Y(T_1) \,|\, \mathcal{G}_t \right] - e^{\gamma t} Y(t) - \gamma \int_t^{T_1} \mu(s) e^{\gamma s} \, ds \right)$$

where

$$A(t,T) = \frac{2\gamma\sigma e^{\gamma T} (1 - e^{-(\alpha + \gamma)(T-t)})}{\eta(\alpha + \gamma)(e^{2\gamma T_1} - e^{2\gamma t})}$$

- Observe that A(t, T) is positive
- The sign of the information premium is determined by
 - The correlation ρ
 - The temperature prediction





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Conclusions

Example with complete information

- Suppose we know the temperature at T_1
 - The information set is \mathcal{H}_t
 - Unlikely situation of perfect future knowledge....
- Assume we we expect a temperature drop

$$Y(T_1) < \mathrm{e}^{-\gamma(T_1-t)}Y(t) + \gamma \int_t^{T_1} \mu(s) \mathrm{e}^{-\gamma(T_1-s)} \, ds$$

- At NordPool, where ho < 0:
 - The information premium is positive
- Drop in temperature will lead to increasing demand, and thus higher prices



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The equilibrium approach: idea

- Producers and consumers can trade in both spot and forward markets
 - No speculators in our set-up
- We suppose that the forwards deliver electricity over an agreed period
 - No fixed delivery time as in other commodity markets
 - Natural for electricity due to its nature
- Choice of an electricity producer
 - Sell production on spot market, or on the forward market



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Conclusions

• Producer is indifferent when $(U_{pr}$ is the utility function)

$$\mathbb{E}\left[U_{\mathsf{pr}}\left(\int_{\tau_1}^{\tau_2} S(u) \, du\right)\right] = \mathbb{E}\left[U_{\mathsf{pr}}\left((\tau_2 - \tau_1) \mathcal{F}_{\mathsf{pr}}(t, \tau_1, \tau_2)\right)\right]$$

- The certainty equivalence principle
- *F*_{pr} is the lowest acceptable price for the producer can accept to be interested in entering a forward
 - Similarly, $F_{\rm c}$ is the highest acceptable price for the consumer, for a given utility function $U_{\rm c}$
- We assume exponential utility $U(x) = 1 \exp(-\gamma x)$, with respective risk aversion for producer and consumer γ_{pr} and γ_{c}



- - By Jensen's inequality, the predicted average spot price is within the price bounds

$$F_{\mathsf{pr}}(t,\tau_1,\tau_2) \leq \mathbb{E}\left[\frac{1}{\tau_2-\tau_1}\int_{\tau_1}^{\tau_2} S(u)\,du\,|\,\mathcal{F}_t\right] \leq F_{\mathsf{c}}(t,\tau_1,\tau_2)$$

• Hypothesis: The settlement price of the forward will depend on the market power $p \in [0, 1]$ of the producer

$$F^{p}(t, \tau_{1}, \tau_{2}) = pF_{c}(t, \tau_{1}, \tau_{2}) + (1 - p)F_{pr}(t, \tau_{1}, \tau_{2})$$

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• Assume a simple two-factor spot model with jump component

 $S(t) = \Lambda(t) + X(t) + Y(t)$

• $\Lambda(t)$ seasonal function

 $dY(t) = -\lambda Y(t) \, dt + Z \, dN(t)$

- Jumps (accounting for spikes)
 - Z jump size
 - N Poisson process
- Slowly varying base component

 $dX(t) = -\alpha X(t) \, dt + \sigma \, dB(t)$





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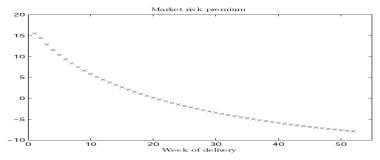
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Conclusions

- Calculate prices for weekly contracts and compute the risk premium
 - The market power set to p = 0.25
 - Constant positive jumps at rate 2/year



- Note the positive risk premium in the short end
 - Caused by the jump risk



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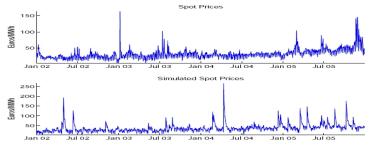
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Conclusions

Empirical example: EEX (Metka, Ulm)

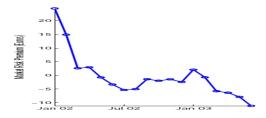
Fit two-factor model to daily EEX spot prices (Jan 02 – Dec 05)





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- Using observed prices for 18 monthly forward contracts and fitted spot model
 - Calculate the risk premium,
 - Difference between forward price and predicted spot
 - Observe a positive premium in the short end, and negative in the long end



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• Based on all available forward prices in the study, risk aversion parameters were determined

•
$$\gamma_{pr} \ge 0.421$$
 and $\gamma_c \ge 0.701$ are such that
 $F_{pr}(t, \tau_1, \tau_2) \le F(t, \tau_1, \tau_2) \le F_c(t, \tau_1, \tau)$

• Calculate the empirical market power

$$p(t,\tau_1,\tau_2) = \frac{F(t,\tau_1,\tau_2) - F_{\rm pr}(t,\tau_1,\tau_2)}{F_{\rm c}(t,\tau_1,\tau_2) - F_{\rm pr}(t,\tau_1,\tau_2)}$$

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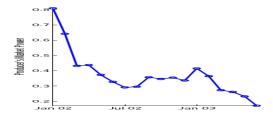
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• Observe that producer's power is strong in the short end, while decreasing to be rather weak in the long end



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Conclusions

Conclusions

- Discussed two potential ways to understand the link between spot and forward prices in electricity markets
- Information approach:
 - Include future information in pricing
- Equilbrium approach:
 - Certainty equivalence principle for upper and lower bounds of prices
 - Use market power as an explanantory variable for price formation



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Coordinates

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