



The Effect of Variable Renewable Energy Sources on Wholesale Electricity Prices – Implementation of a Stochastic Wind Feed-in

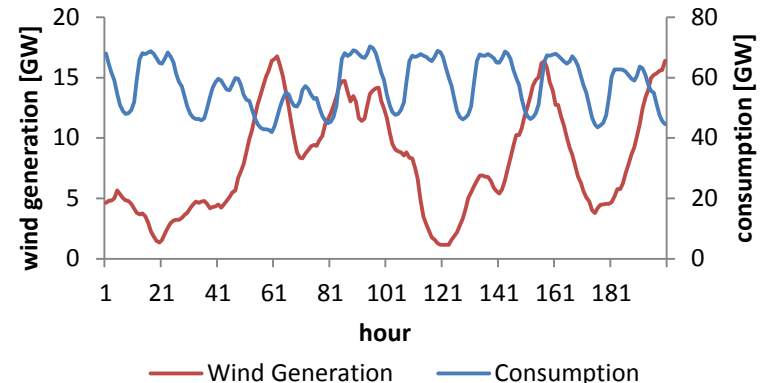
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Strommarkttreffen, Cottbus 18.09.2015

Agenda

1. Motivation
2. Methodology
3. Basic Model
4. Results – Perfect Foresight
5. Results – Uncertain Wind Feed-in
6. Conclusion

Motivation

- ◆ Structural changes to many electricity systems as intermittent RES as wind and PV enter the market
 - Highly fluctuating availability
 - Low correlation between intermittent RES generation and demand
- The system adjusts
- Over capacities will leave the market
- Prices will reflect the structural changes in the system



Motivation

- ◆ ... implications for wholesale electricity prices, power plant revenues, flexibility requirements and market design are among the most fundamental issues currently discussed in electricity markets
 - How will prices behave in a market with high shares of intermittent RES in the long run?
 - Increasing price variances due to intermittent RES generation?
 - How is the price variance driven considering a long term equilibrium?

Methodology

- ◆ Analyzing the price variance on a fundamental basis by applying a linear electricity market model

- ◆ Long term (partial) market equilibria
 - System optimal decision about capacity investments
 - System optimal generation dispatch depending on the available capacities

- ◆ Full cost approach
 - Variable costs and investment costs are represented in the resulting market price
 - Scarcities and scarcity prices will occur as investments have to be covered

- ◆ Green field approach
 - No existing power plants – avoiding sunk investment costs

Methodology

- ◆ Stylized system with two thermal technologies and one intermittent RES technology
 - Base-Load Technology: High fix and low variable costs
 - Peak-Load Technology : Low fix and high variable costs

Technology	Annual fixed costs [€/MW*a] ic_i	Variable production costs [€/MWh] vc_i	Start-up costs [€/ΔMW] sc_i	Minimal load [%] g_i^{min}	Efficiency loss at minimum load [%-pt]
Base Load	132,000	34	105	40	6
Peak Load	56,000	70	40	20	22
Wind	-	0	0	0	0

- ◆ Variable wind generation as the only intermittent RES
 - Wind capacities exogenously implemented

Basic Model

◆ Objective Function

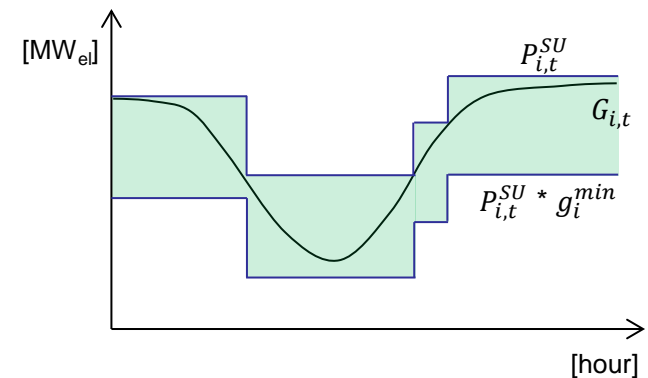
$$\begin{aligned} \min TC &= \sum_{i,t} vc_i * G_{i,t} \\ &+ \sum_i ic_i * D_i \\ &+ \sum_{i,t} sc_i * SU_{i,t} \\ &+ \sum_{i,t} (P_{i,t}^{SU} - G_{i,t}) * z_i \end{aligned}$$

Variable generation costs

Annualized investment costs

Start-up Costs

Costs at partial load



◆ Upper bound constraint

$$0 \leq G_{i,t} \leq P_{i,t}^{SU} \quad \forall i, t$$

◆ Lower bound constraint

$$P_{i,t}^{SU} * g_i^{min} \leq G_{i,t} \quad \forall i, t$$

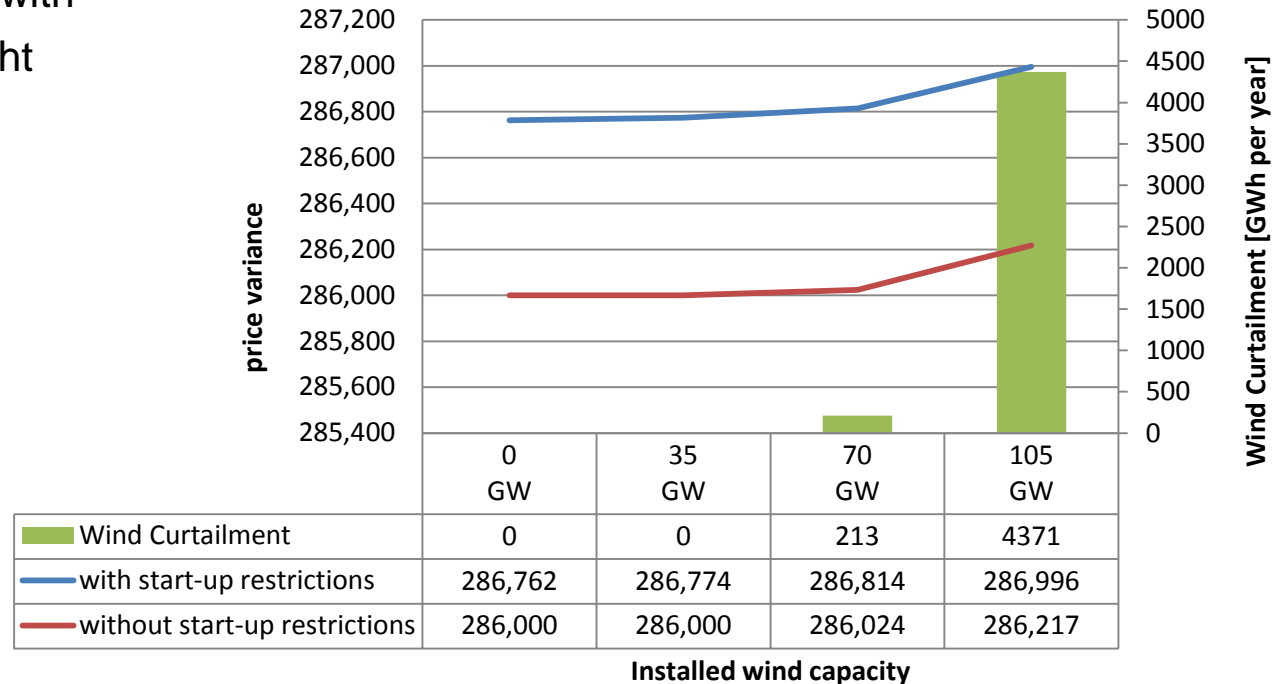
Basic Model

- ◆ Activating start-up costs $P_{i,t}^{SU} - P_{i,t-1}^{SU} \leq SU_{i,t} \quad \forall i, t$
- ◆ Upper limit for started capacity $P_{i,t}^{SU} \leq D_i * af_i \quad \forall i, t$
- ◆ Wind feed-in $0 \leq G^{wind},t \leq pf_t * cap^{wind} \quad \forall t$
- ◆ Energy Balance - Clearing the market in every time period

$$\sum_i G_{i,t} = dem_t \quad \forall t$$

Results

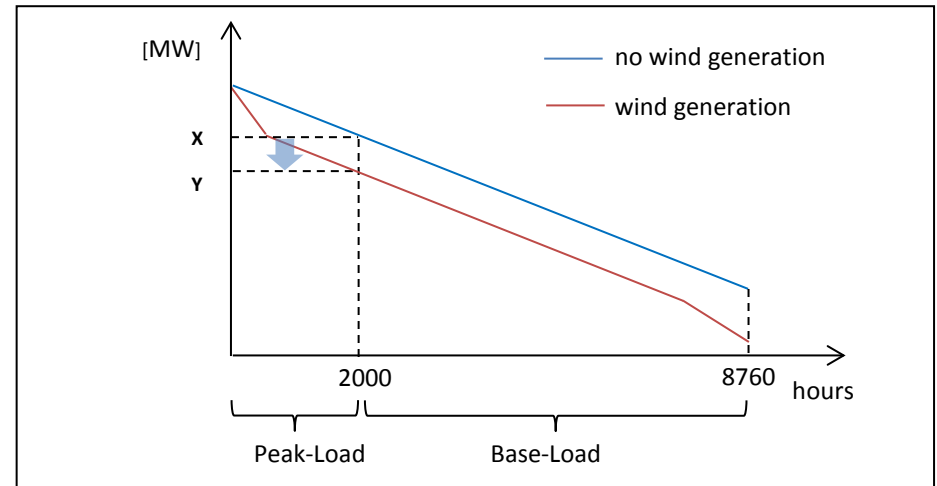
- ◆ Price volatility with perfect foresight



- **Increasing start-up activities do not have a significant impact on the price variance as wind curtailment activities**

Results – Analytical Explanation

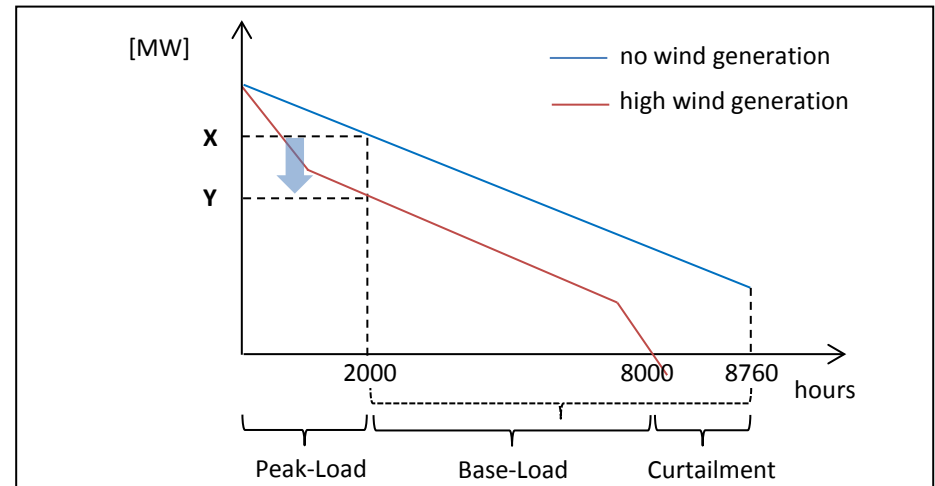
- ◆ “Textbook” example
 - No start-up restrictions
 - Price only influenced by fuel and investment costs
 - Only three possible prices to occur within the considered year
 - Base-Load Price
 - Peak-Load Price
 - Scarcity Price



$$Var = \frac{1}{n} * \left(\sum_1^B (p^{Base} - \bar{p})^2 + \sum_1^P (p^{Peak} - \bar{p})^2 + (p^{Scarce} - \bar{p})^2 \right)$$

Results – Analytical Explanation

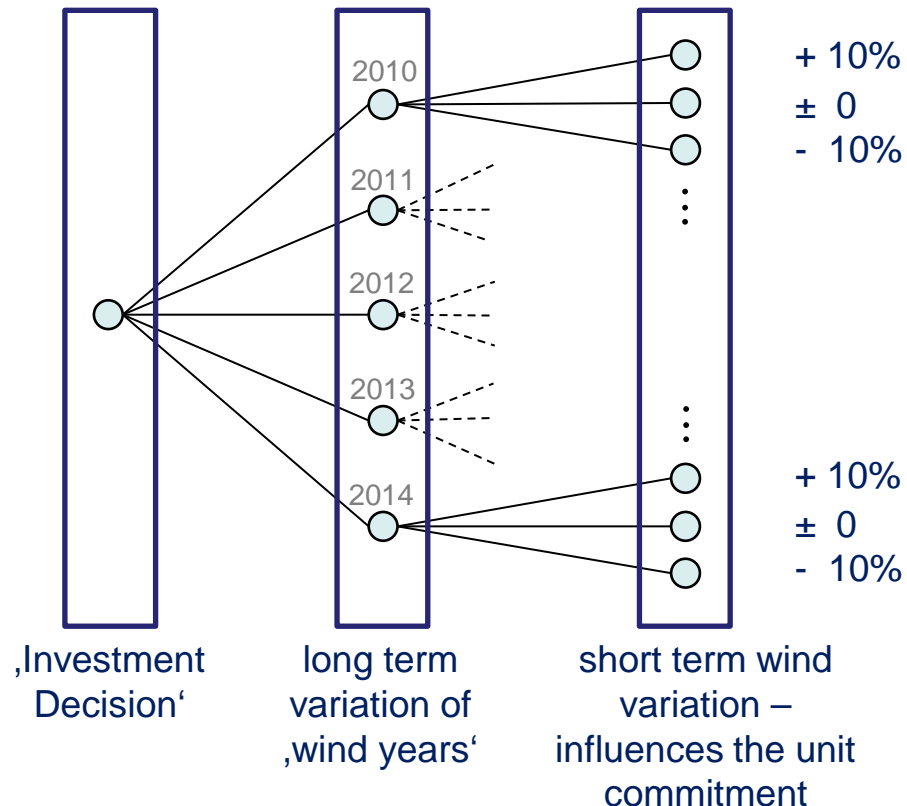
- ◆ “Textbook” example - part II
 - With an increasing shares of RES wind curtailment becomes an option
 - During times of wind **curtailment prices** at 0 €/MWh appear



$$Var = \frac{1}{n} * \left(\sum_1^B (p^{Base} - \bar{p})^2 + \sum_1^C (p^{Curt} - \bar{p})^2 + \sum_1^P (p^{Peak} - \bar{p})^2 + (p^{Scarce} - \bar{p})^2 \right)$$

Results – Volatility under Uncertainty

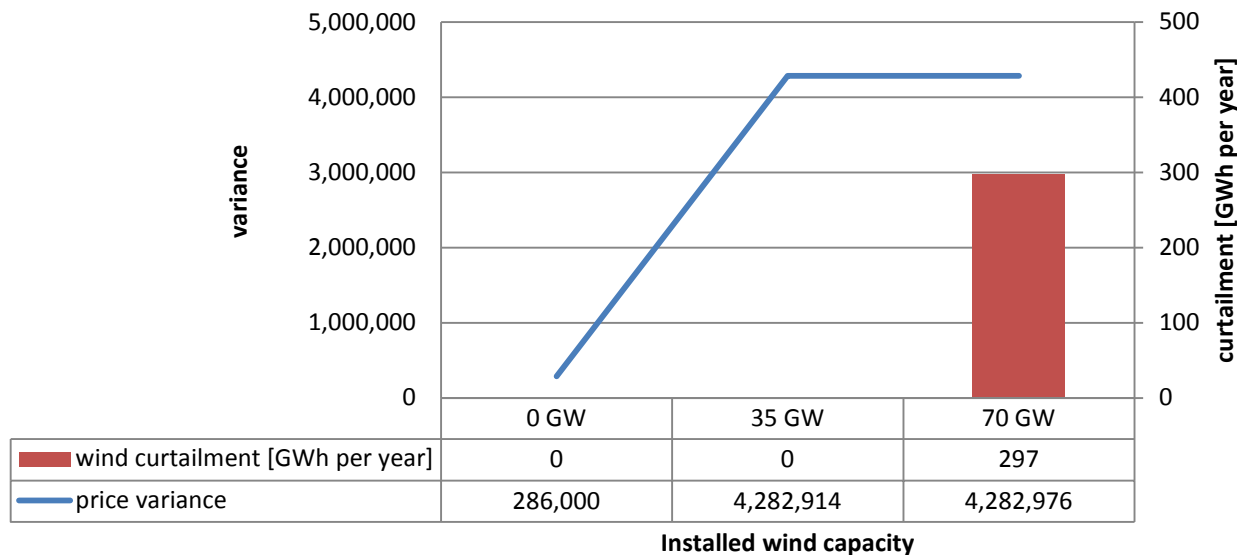
◆ Implementing uncertain wind realization



- global investment decision considering an uncertain wind realization
 - Long term uncertainty due to a set of different 'wind years'
 - Short term uncertainty with a strong impact at the start-up decision
 - Started capacity is fixed at the second stage of the scenario tree, but has to hold for all variations at the third stage
- 'one stage' electricity market model

Results – Volatility under Uncertainty

- ◆ Generally higher values due to lower likelihood for the occurrence of the scarcity hour and thus, a significant higher value for the scarcity price
- ◆ Increasing price volatility with the implementation of wind capacities



Conclusion

- ◆ The volatility of electricity wholesale prices is an important indicator to future electricity markets
 - Regarding the need of flexibility options

- ◆ Price volatility in the first place is mainly driven by upcoming wind curtailment activities

- ◆ We find a (partial) market equilibrium with regard of an uncertain wind realization
 - The problem is solved within one stage

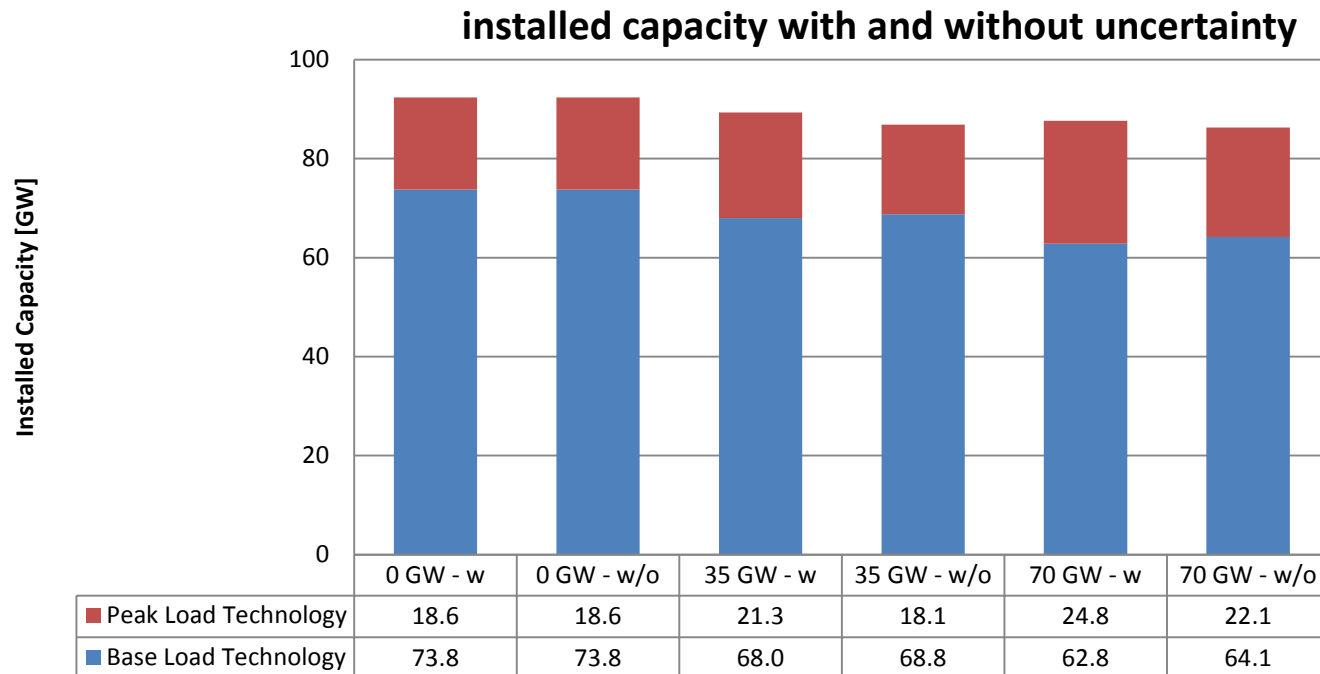
- ◆ The increase of the volatility is mainly driven by the ‘uncertain’ appearance of the scarcity hour and thus, the scarcity price is significantly higher



Thank you very much!
Questions?

Backup I

- ◆ Comparison of resulting investment decision with and without considering uncertainty
 - Uncertain wind realization encourages a higher share of peak load plants



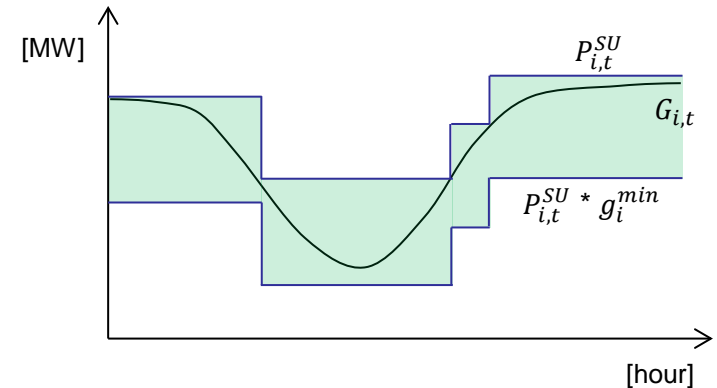
Backup II – Basic Model

- ◆ Objective Function

$$\min TC = \sum_{i,t} (vc_i * G_{i,t} + sc_i * SU_{i,t}) + \sum_{i,t} (P_{i,t}^{SU} - G_{i,t}) * z_i + \sum_i (ic_i * D_i)$$

$$z_i = \Delta vc_i * g_i^{min} / (1 - g_i^{min})$$

$$P_{i,t}^{SU} - P_{i,t-1}^{SU} \leq SU_{i,t} \quad \forall i, t$$



- Operating at partial load is causing lower efficiency rates and thus, higher variable costs