

# An Electricity Market Model to Estimate the Marginal Value of Wind in an Adapting System

Derk J. Swider<sup>1</sup>    Christoph Weber<sup>2</sup>

<sup>1</sup>Institute of Energy Economics and the Rational Use of Energy  
University of Stuttgart, Germany

<sup>2</sup>Chair of Energy Management  
University of Duisburg-Essen, Germany

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# Overview

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- 2 Managing Intermittency
- 3 Model Description
- 4 Case Study Results
- 5 Conclusions



# Introduction

## Debates on integrating large-scale RES-E in existing systems

- Large amounts of intermittent renewable energy sources for electricity production (RES-E) are expected to be integrated in electricity systems.
- Debates focus on (i) how to estimate the costs of RES-E's intermittency and (ii) how to apportion the costs between RES-E's generators and system operators.

## Broad diversity of methodologies to assess integration costs

- Integration costs are due to the influence of intermittent RES-E on the performance of the overall system operation.
- In the literature often static simulation models are applied to assess the additional costs of intermittent RES-E integration.

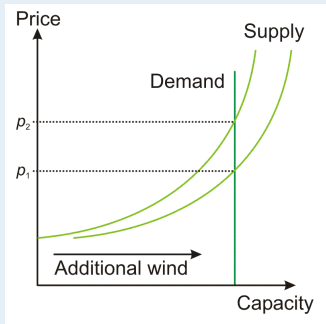
**Question:** *What are the integration costs of wind assessed with a dynamic stochastic fundamental electricity market model?*

## Changes in System Operation

- The characteristics of intermittent RES-E substantially differ from conventional generation mainly due to:
  - i. lower controllability,
  - ii. higher variability and
  - iii. lower predictability.
- Consequently, the system operation becomes more complicated, with a need of a higher flexibility in the overall system to follow load.
- Most important are more start-ups of conventional power plants, a higher fraction of part-load operation and an increased need for reserves.
- These aspects lead to changes in system operation and hence to additional costs due to intermittent RES-E integration.

# Induced Additional Costs

## What about fuel savings?



- RES-E integration (mainly wind) leads the merit order to shift to the right due to relatively low variable costs.
- Hence, the electricity prices will eventually decrease and high priced plants may have less full-load hours resulting in fuel savings.
- On the other hand the high variability induces additional costs on plant operation and on balancing the system.
- Principally, additional costs of intermittent RES-E integration depend on the considered electricity system and its development.

# Fundamental Modelling Approach

The basic idea of a fundamental model is to analyse the power market based on the technical and economical aspects of generation and demand.

**In order to analyse intermittency some major challenges arise:**

**Existing capacities;** Thermal and hydro power plant classes.

**Unit-commitment;** Start-up costs and part-load efficiencies.

**Time resolution;** Intermittent sources require a fairly high time resolution.

**Regional resolution;** Interregional transmission may effect market prices.

**Investments;** System may adapt and change dynamically in the long run.

**Stochastic modelling;** Fluctuations should be considered most accurately.

## Essential Characteristics of the Model

- Linear stochastic fundamental electricity market model.
- Capture of seasonal effects by considering a full year.
- Capture of unit-commitment by dividing the year in typical hours.
- Myopic model with recursive application over longer time horizons.
- Consideration of reduced part-load efficiencies and start-up costs.

### **In order to analyse intermittency most important are:**

- Endogenous investments in new thermal power plants.
- Constant reliability margin to estimate power systems reserve.
- Recombining tree to consider stochastic RES-E fluctuations.

## Introduction of Endogenous Investments

- For calculating fix costs  $FC_{r,u,t}$  the choice among different investment alternatives with specific irreversible fix costs  $fc_u^{\text{irr}}$  and the decision variable of newly build capacity  $L_{r,u,t}^{\text{new}}$  is endogenously modelled:

### Calculation of fix costs:

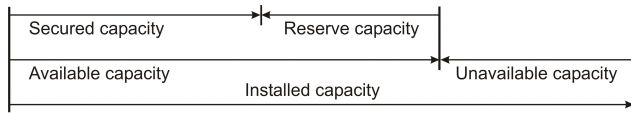
$$FC_{r,u,t} = a(i, lt_u) fc_u^{\text{irr}} L_{r,u,t}^{\text{new}} + fc_u^{\text{rev}} L_{r,u,t}$$

- Thereby the investments are discounted by the annuity factor  $a(i, lt_u)$  defined by the interest rate  $i$  and the lifetime  $lt_u$ .
- Finally, also reversible specific fix costs  $fc_u^{\text{rev}}$  for the total installed power plant capacity  $L_{r,u,t}$  are taken into account.
- The decision of investing in new capacity is not binary but continuous.



## Introduction of a Constant Reliability Margin

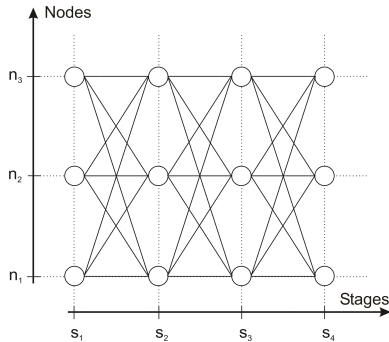
- Power systems reserve (on the supply side) can be defined to be the difference between the available and the secured capacity.



- The secured capacity can be calculated by estimating the probability distribution of the reliability of the given power plant portfolio.
- This distribution can be estimated by sequentially calculating the convolutions of the probability distributions of all power plants.
- Setting the cumulative sum of the probability of the power plant portfolio equal to the reliability margin leads to the secured capacity.

# Introduction of a Stochastic Recombining Tree

- Instead of considering one operation mode of the system at each moment in time different stochastic states are considered.
- Any state or node  $n$  at a given moment in time or stage  $s$  is characterized by a probability  $\psi_{s,n}$  and transition probabilities  $\tau_{s \rightarrow s+1, n \rightarrow n'}$  between the states.
- For the static equations this leads to add the index for the different nodes and for the dynamic ones also the transition probabilities need to be accounted for.



## Stochastic Objective Function

- The model minimizes the total costs  $TC$  for system operation in the considered electricity markets (the model can cover interregional transmission but this is not considered in the case study).
- Thereby operating costs  $OC$ , start-up costs  $SC$  and fix costs  $FC$  (subject to region  $r$ , unit type  $u$ , time segment  $t$  and node  $n$ ) are considered.
- Of special importance in the stochastic model version is that all decision variables are simultaneously indexed over time  $t$  and node  $n$ ; the nodes are considered with their probability  $\psi_{r,t,n}$  in the objective function.

### Stochastic objective function:

$$TC = \sum_r \sum_u \sum_t \sum_n d_t f_t \psi_{r,t,n} (OC_{r,u,t,n} + SC_{r,u,t,n} + FC_{r,u,t,n})$$

# Calculating Integration Costs

- In order to determine integration costs, differences between systems with and without wind generation have to be looked at.
- Integration costs are defined as the difference in cost savings by wind generation compared to those of some alternative generation.
- Hence, the computation of integration costs always remains dependent on the definition of this alternative generation technology.
- Here the alternative is assumed to have the expected wind energy production with conventional properties (firm and predictable).
- Then integration costs comprise costs for variability and unpredictability due to changed system operation and investment decisions.

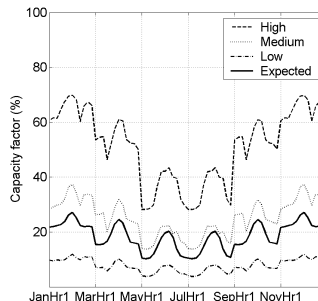
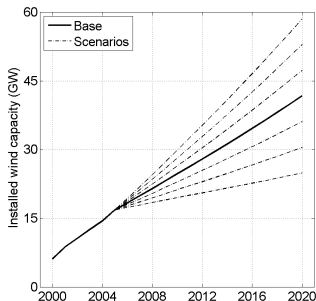
## Assumptions I

- The case study focusses on large-scale wind integration in Germany.
- Diverse thermal and hydro power plant classes are taken into account.
- Fuel prices and demand are assumed to increase by a constant rate.
- CO<sub>2</sub> allowance prices are assumed to remain low at about 10 €/tCO<sub>2</sub>.
- For market-driven investments a discount rate of 8 % is assumed.

### Investment opportunities in thermal power plants

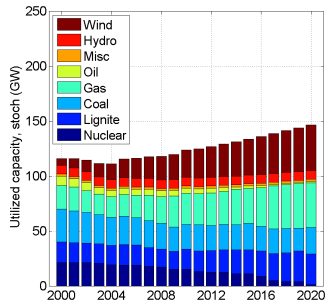
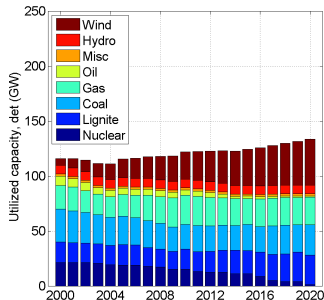
| Type                   | Unit   | Coal | Lignite | Gas GT | Gas CC |
|------------------------|--------|------|---------|--------|--------|
| Net capacity           | (MW)   | 750  | 850     | 100    | 800    |
| Efficiency (full load) | (%)    | 46   | 42      | 39     | 58     |
| Availability (winter)  | (%)    | 96   | 96      | 98     | 99     |
| Reliability            | (%)    | 97   | 98      | 94     | 97     |
| Investment costs       | (€/kW) | 1100 | 1350    | 230    | 450    |

## Assumptions II



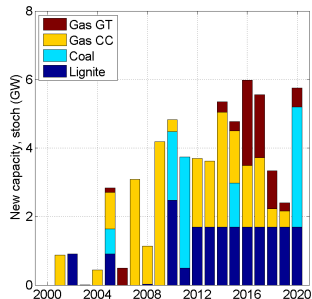
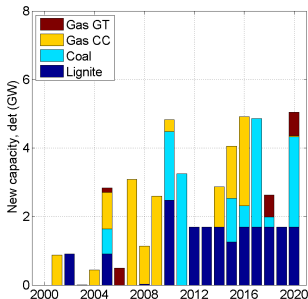
- Several scenarios on installed wind capacities are exogenously given and assumed to be driven by governmental aid.
- Fluctuations of wind are derived for the considered typical hours using historical data of selected weather stations.

# Utilized Capacity



- Investment decisions are highly dominated by the considered CO<sub>2</sub> allowance price paths and hence by energy policies.
- Consideration of wind's intermittency leads to more investments and thereby especially in flexible gas-fired plants.

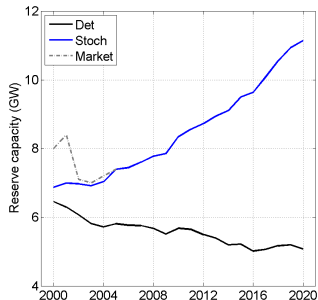
# New Capacity



- Due to the nuclear phase-out high investments in base-load plants are necessary; here dominated by lignite-fired plants.
- Considering wind's intermittency higher overall investments and especially in peak-load plants can be seen; notably in gas-turbines.

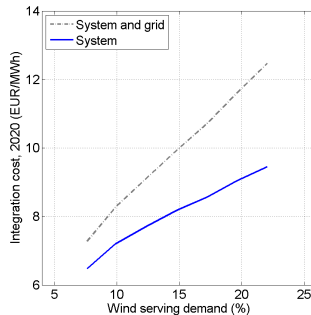
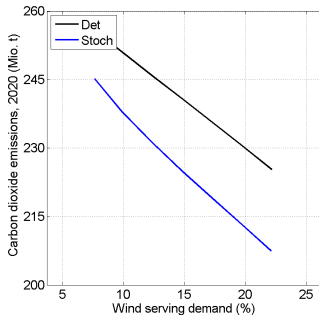


# Electricity Price and Reserve Capacity



- The development of electricity prices does not significantly change between stochastic and deterministic modelling.
- The reserve capacity is greatly influenced if wind's intermittency is taken into account, mainly due to the reduced capacity credit.

# CO<sub>2</sub>-Emissions and Integration Costs



- The CO<sub>2</sub>-emissions decrease with the fraction of wind serving demand and strongly depend on the adapting conventional system.
- The integration costs due to changed system operation and investments are highly influenced by the wind serving demand.

# Disaggregated Integration Costs

## Disaggregated integration costs, base case (€/MWh)

| Year | Wind serving demand (%) | Operation | Start-up | Sum <sup>1</sup> | Investment | Sum <sup>2</sup> |
|------|-------------------------|-----------|----------|------------------|------------|------------------|
| 2005 | 5                       | 1.9       | 0.1      | 2.0              | 0.0        | 2.0              |
| 2010 | 8                       | 1.1       | 0.2      | 1.3              | 2.1        | 3.4              |
| 2015 | 12                      | -1.1      | 0.2      | -0.9             | 8.1        | 7.2              |
| 2020 | 15                      | 2.1       | 0.2      | 2.3              | 5.9        | 8.2              |

<sup>1</sup> Integration costs due to changed system operation.

<sup>2</sup> Integration costs due to changed system operation and investment decisions.

- Integration costs are highly dominated by costs due to higher part-load operation and changed investment decisions.
- Disaggregated costs are hard to determine as e.g. investments influence operation and hence depend on the system.

## Final Remarks

- A stochastic electricity market model to assess the additional costs of intermittent RES-E integration has been presented.
- The integration costs estimated consider the induced additional costs by wind due to changed system operation and investments.
- Thereby the fluctuations and forecasting uncertainty of intermittent wind are incorporated in the model using a recombining tree.
- The application highlights the need to consider intermittency in a stochastic approach with the system being able to change.
- Estimating integration costs heavily depends on the system and modelling assumptions, hence an unreflected use is misleading.