



POTSDAM INSTITUTE FOR  
CLIMATE IMPACT RESEARCH

# The economics of variability and implications for IAMs

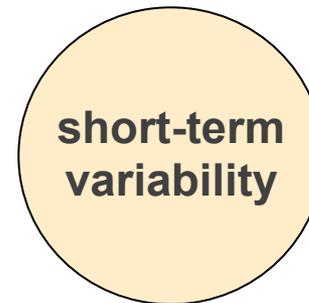
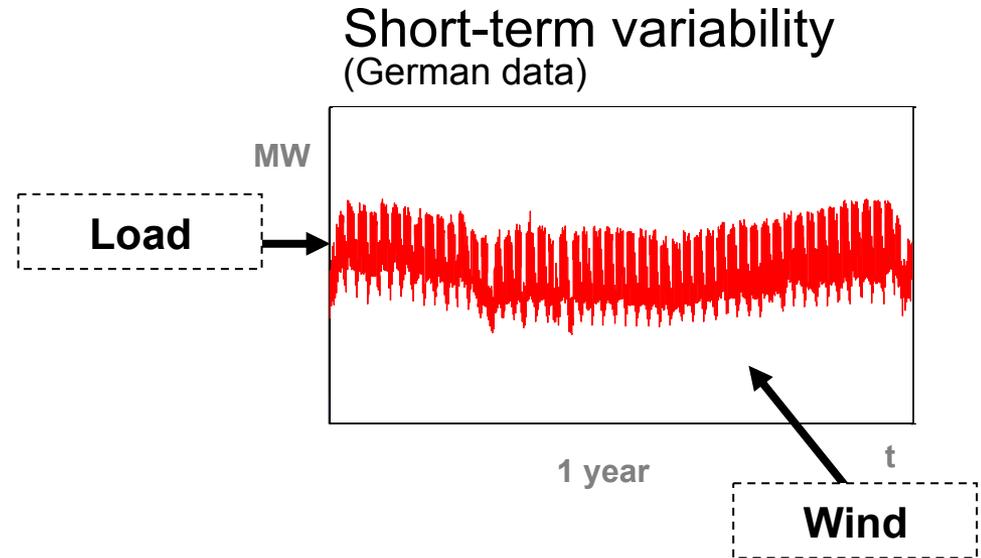
Falko Ueckerdt

CCI/IA Snowmass Workshop, July 22nd, 2013

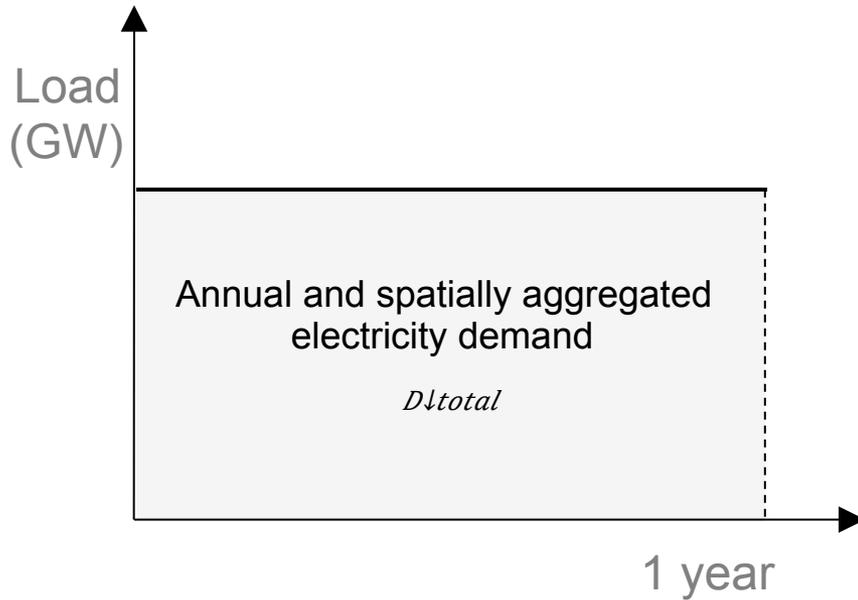
# The challenge ahead: bridging the scales

Integrated  
assessment models:

Hybrid model of energy-  
economy-climate  
optimizing long-term  
investments decisions  
until 2100 in a **~5 years**  
**temporal resolution**



# Coarse resolution of IAMs potentially induces a bias



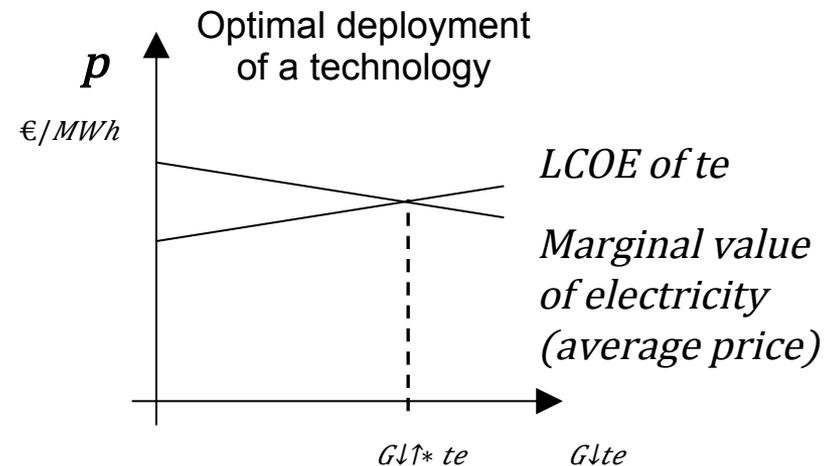
Balance equation:  $D_{total} = \sum_{te} G_{te}$

$G_{te}$ : Annual generation from technology  $te$

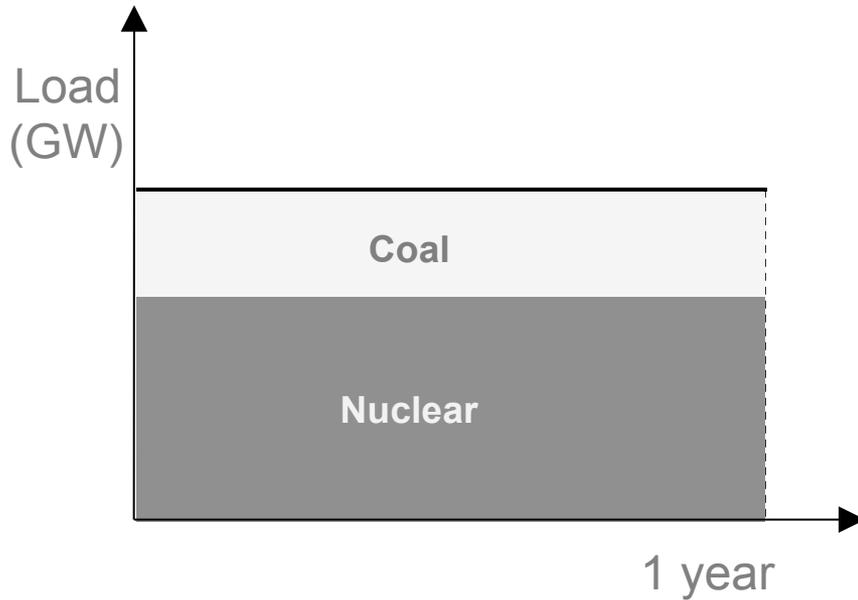
## Strong implicit assumption:

Electricity is a homogenous economic good

→ Only levelized costs of electricity (LCOE) of a technology determine its economic efficiency and optimal deployment



# Coarse resolution of IAMs potentially induces a bias



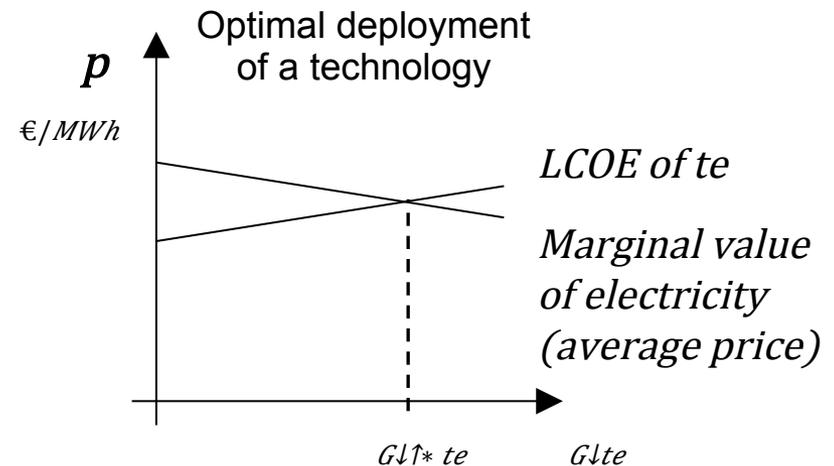
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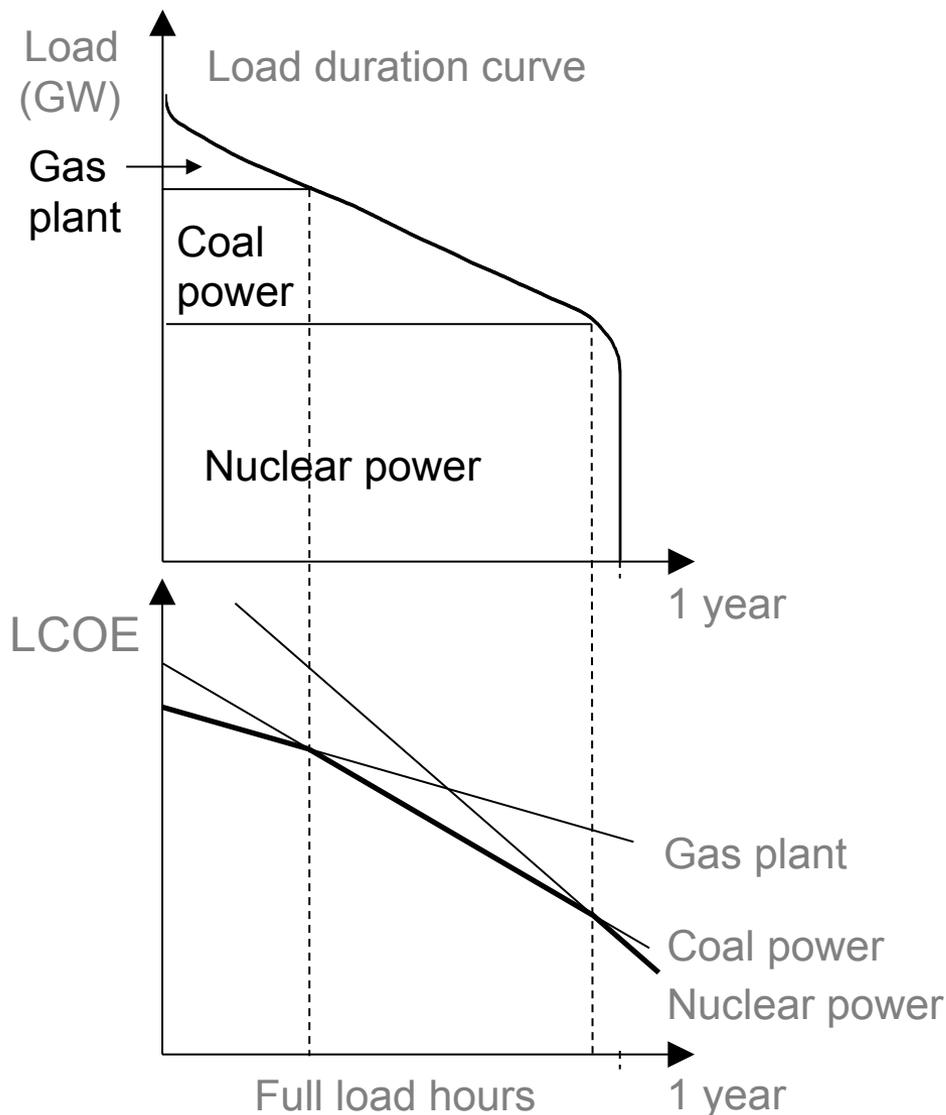
## Strong implicit assumption:

Electricity is a homogenous economic good

- Only levelized costs of electricity (LCOE) of a technology determine its economic efficiency and optimal deployment
- Results biased towards baseload technologies



# Actually, electricity is a heterogenous good



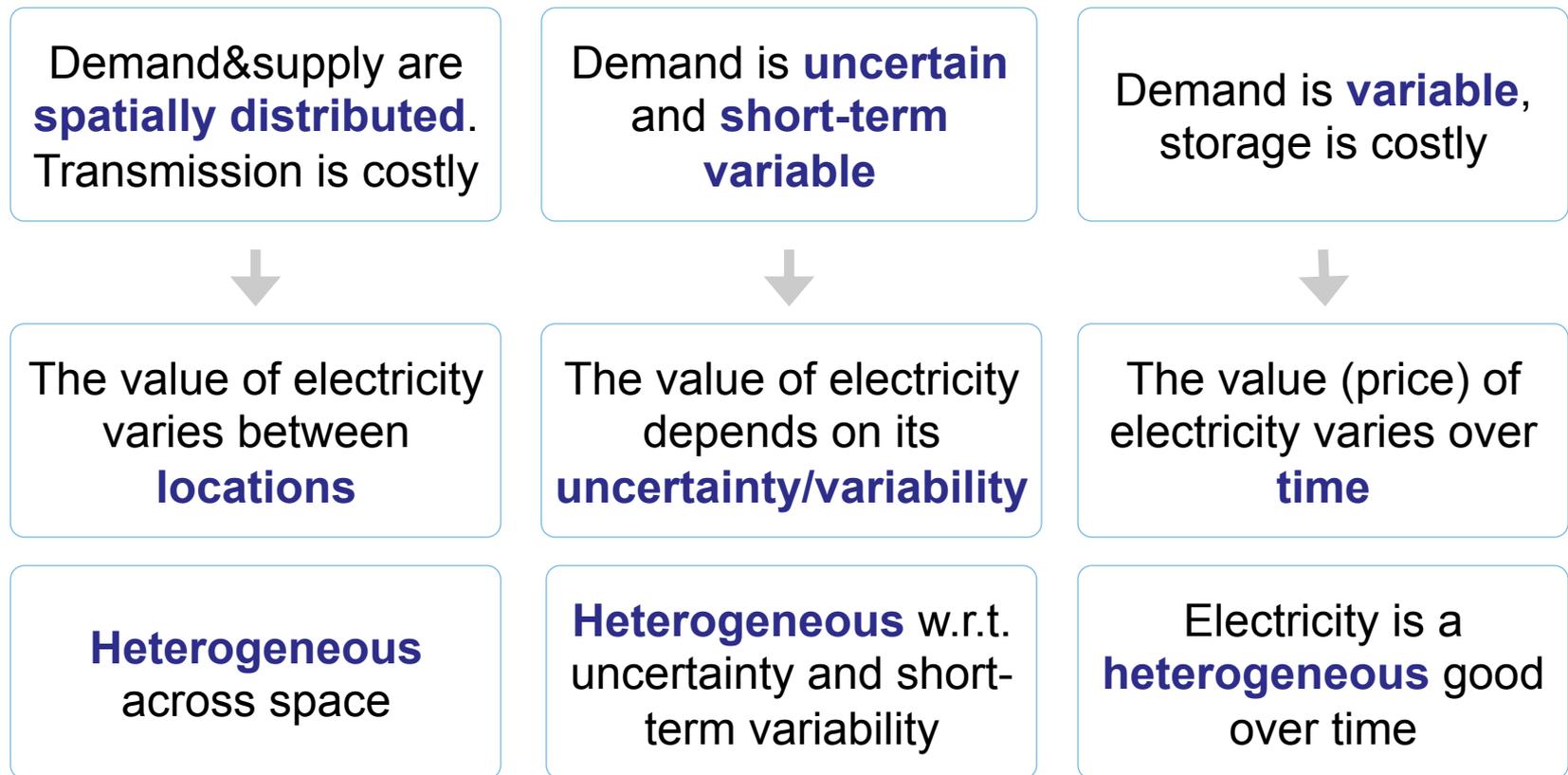
Demand is **variable**,  
storage is costly



The value (price) of  
electricity varies over  
**time**

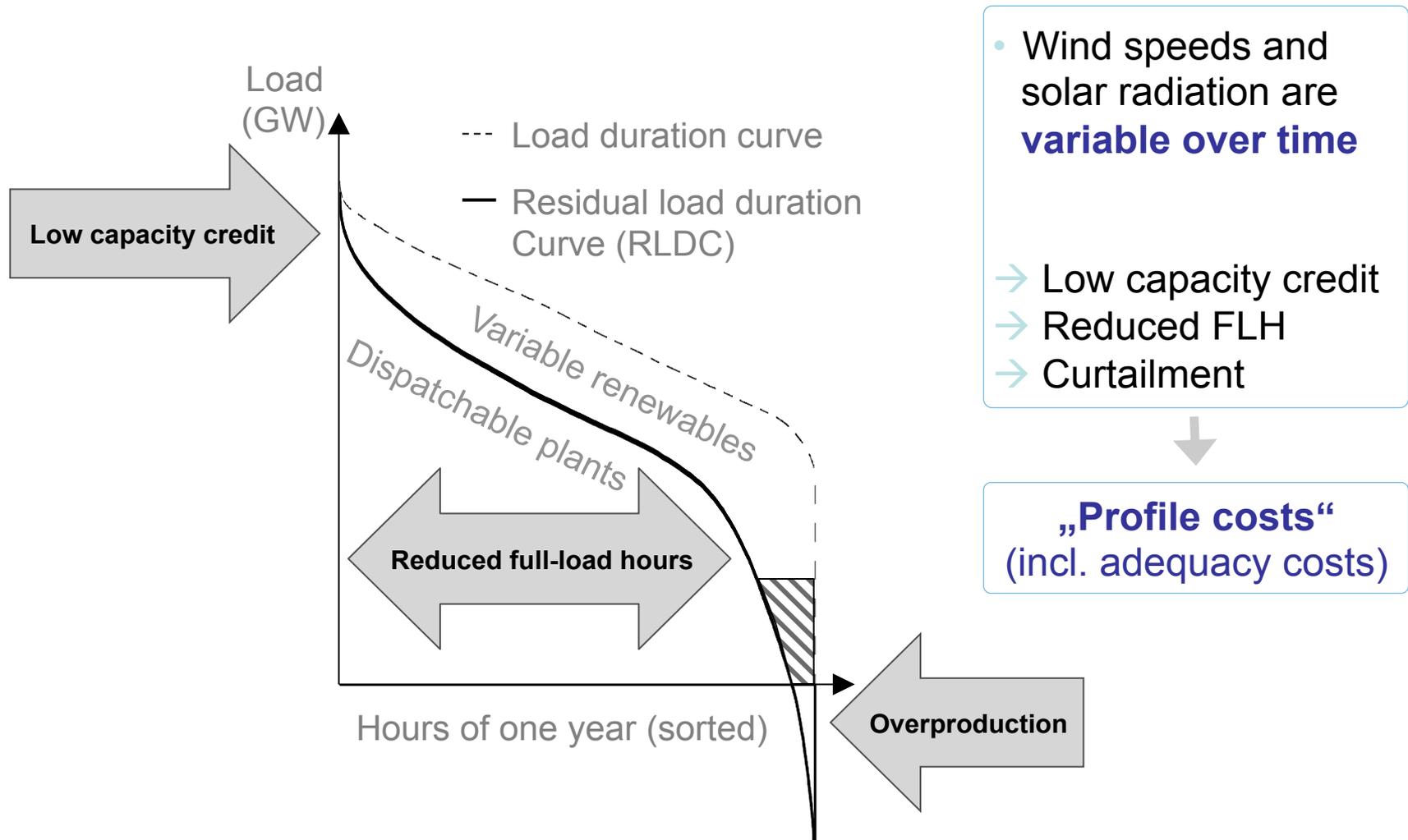
Electricity is a  
**heterogeneous** good  
over time

# Actually, electricity is a heterogenous good



- Technologies are no perfect substitutes. LCOE comparison is not sufficient
  - IAMs should account for variable demand  
(capacity constraint, flexibility constraint, load duration curves)

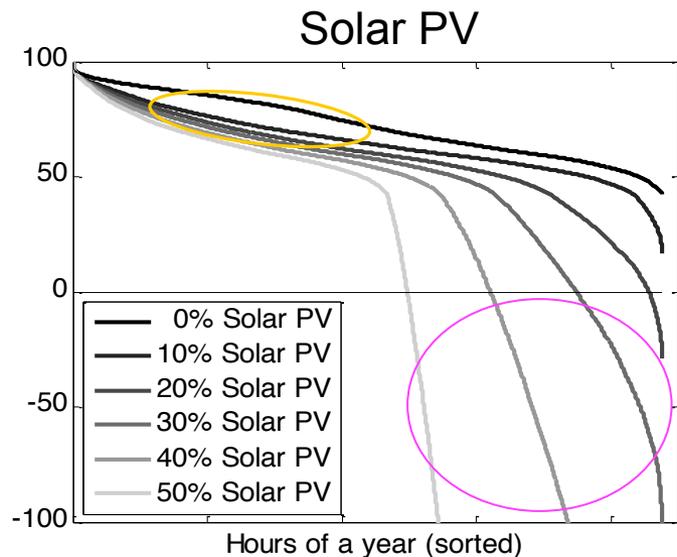
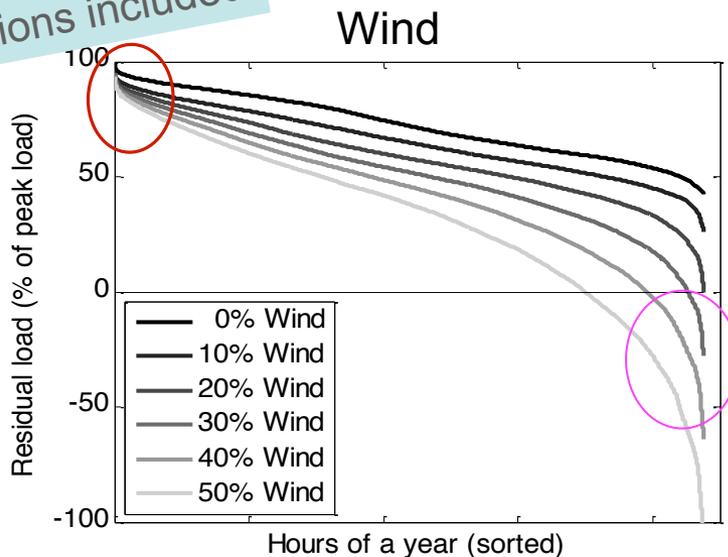
# Variable renewables increase the modeling challenge



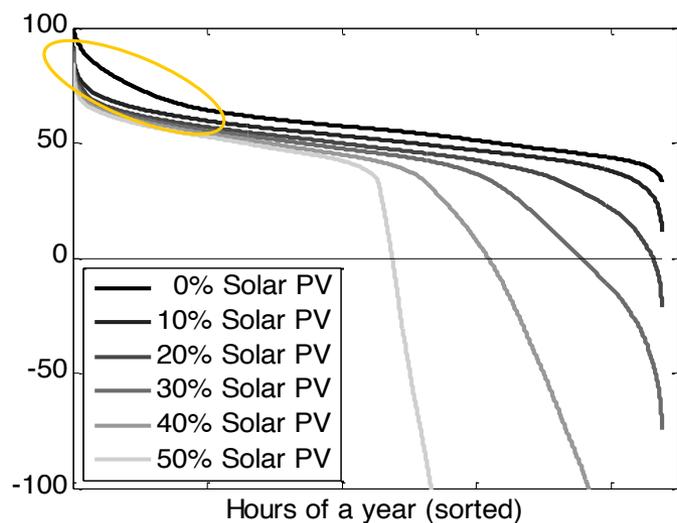
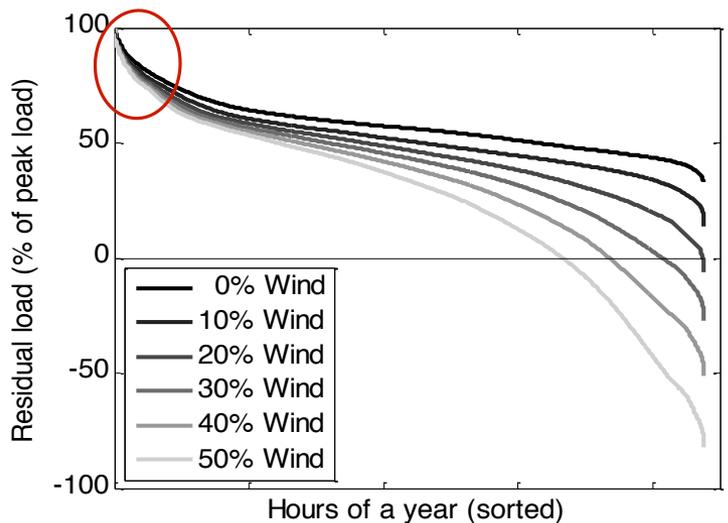
# Profile costs depend on region and technology

No flexibility options included

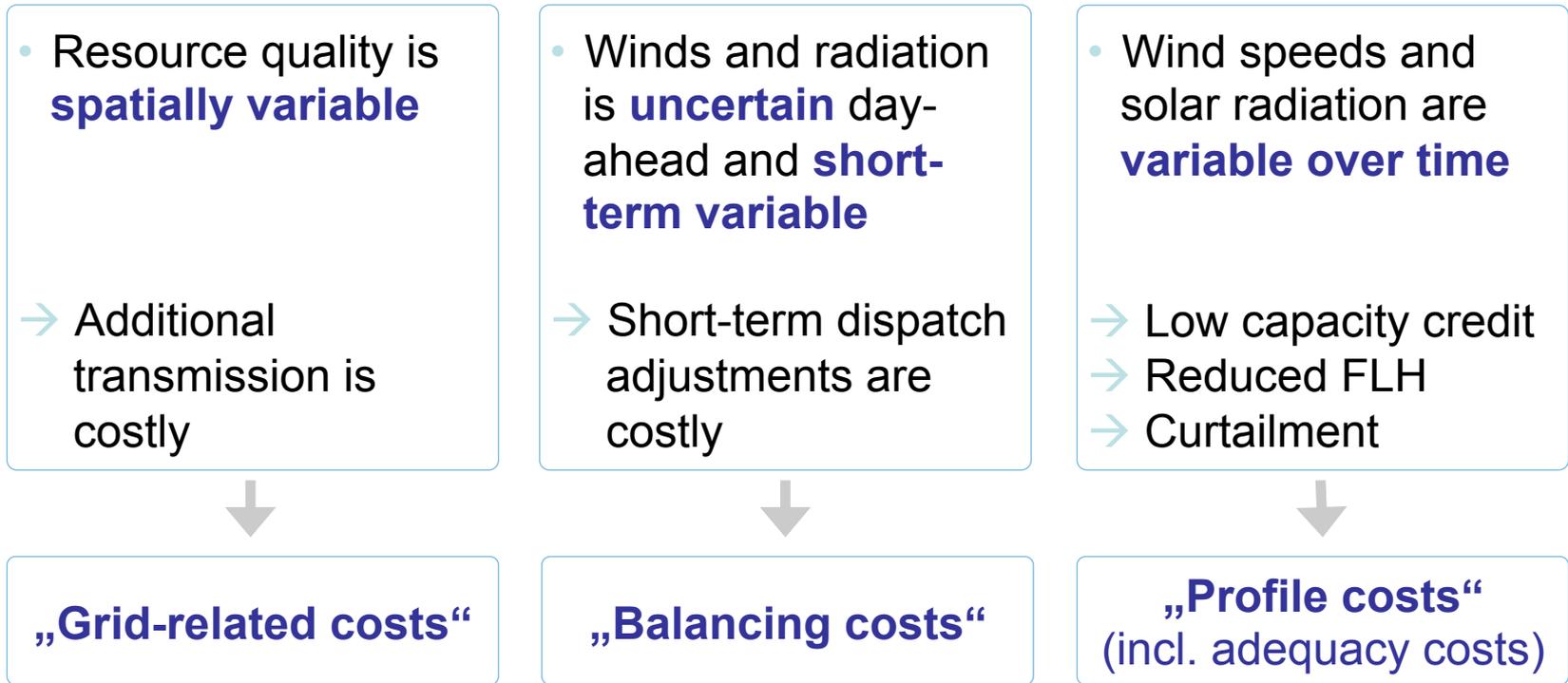
German data (2011)



US midwest data (2011)



# Variable renewables induce different costs on a system level



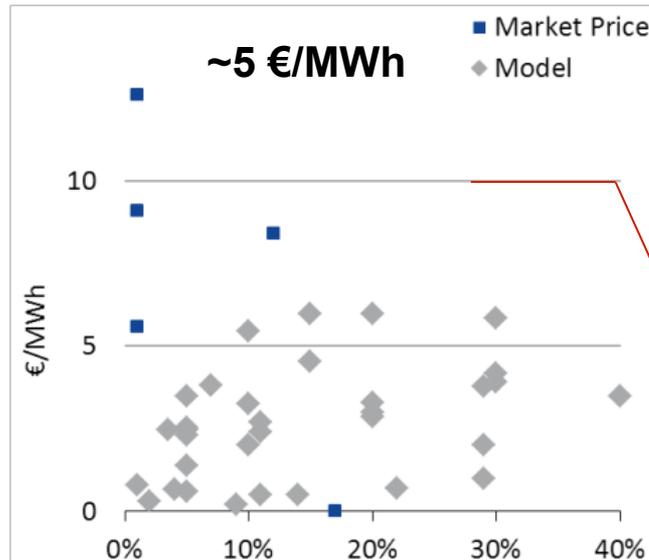
**Integration costs**  
(are neglected in LCOE comparison)

# Quantification for wind: profile costs are most important

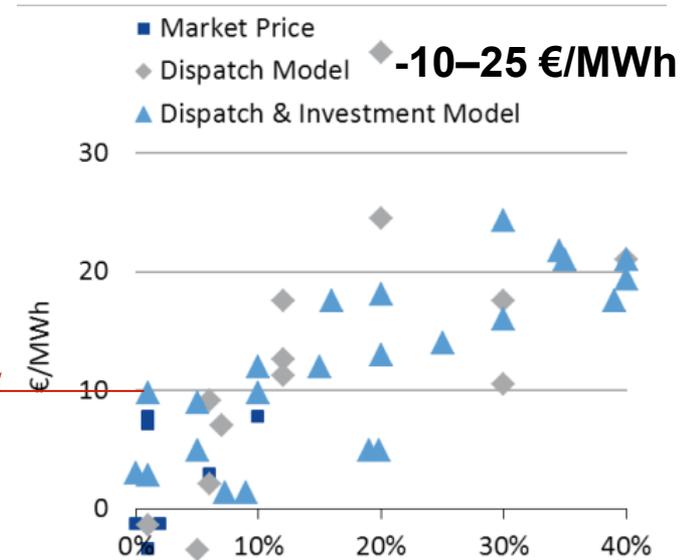
## Grid-related costs

- **2-13 €/MWh**  
(shares of 15-40%, dena 2010, NREL 2012, Holttinen et al. 2011, Schaber et al. 2012)
- Scarce and inconclusive data

## Balancing costs



## Profile costs



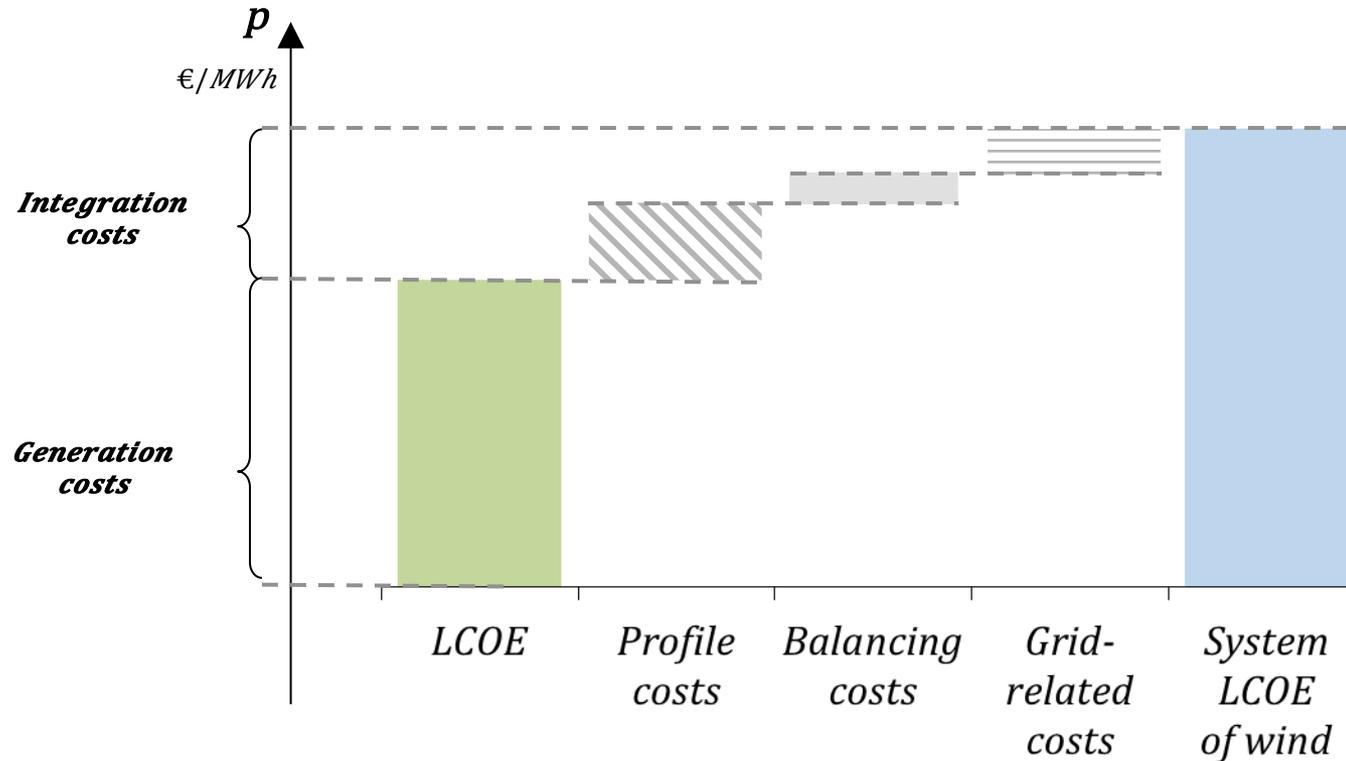
1. Integration costs of wind power can be in the same range as generation costs at high shares
2. A significant driver of integration costs are profile costs, especially the reduced utilization of capital-intensive thermal plants.

Koreneff, 2012; Mills and Wiser, 2012). To improve comparability, the system base price has been normalized to 70 €/MWh wherever possible.

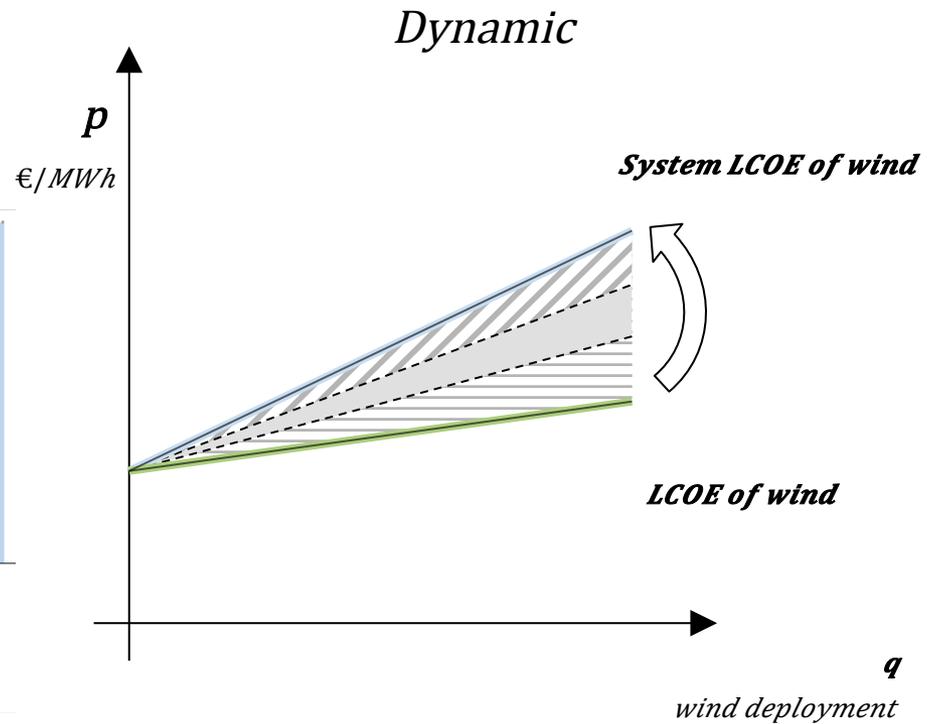
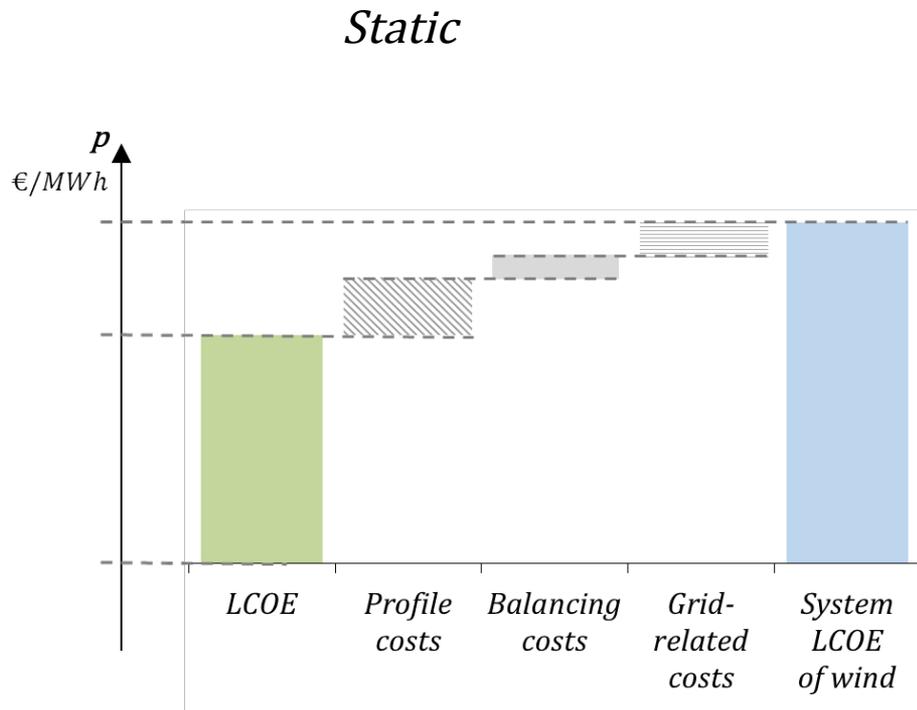
dispatch and investment modeling (triangles). To improve comparability, the system base price has been normalized to 70 €/MWh in all the studies.

**all numbers  
in marginal terms  
per MWh of VRE**

# We define System LCOE as the sum of generation and integration costs

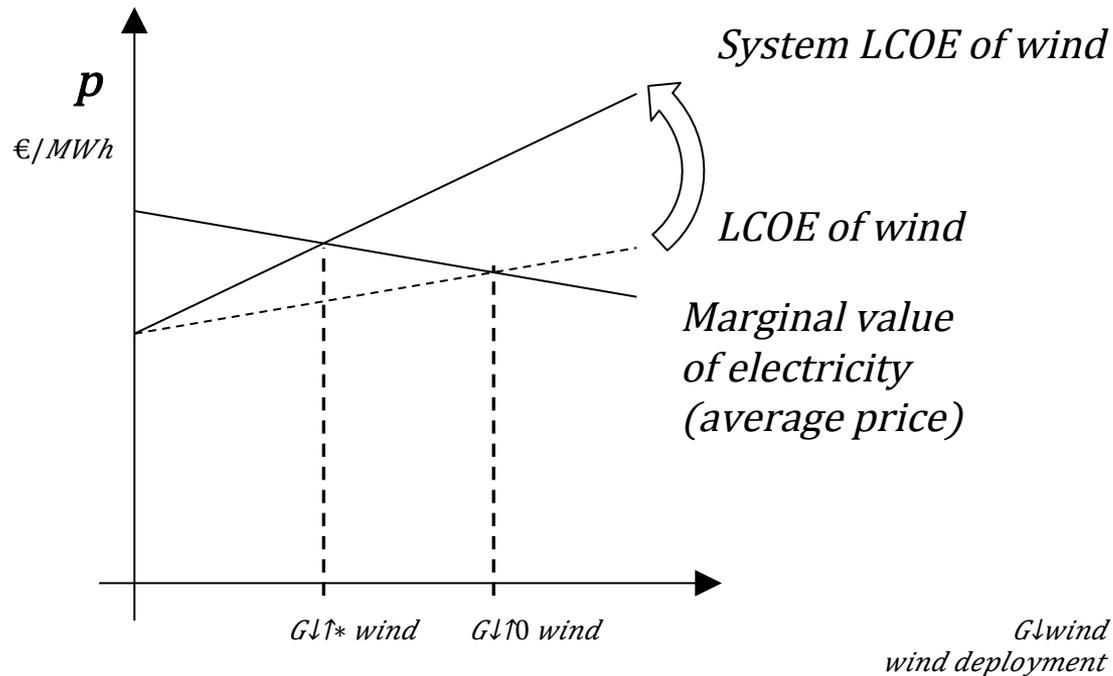


# System LCOE are defined as the sum of generation and integration costs



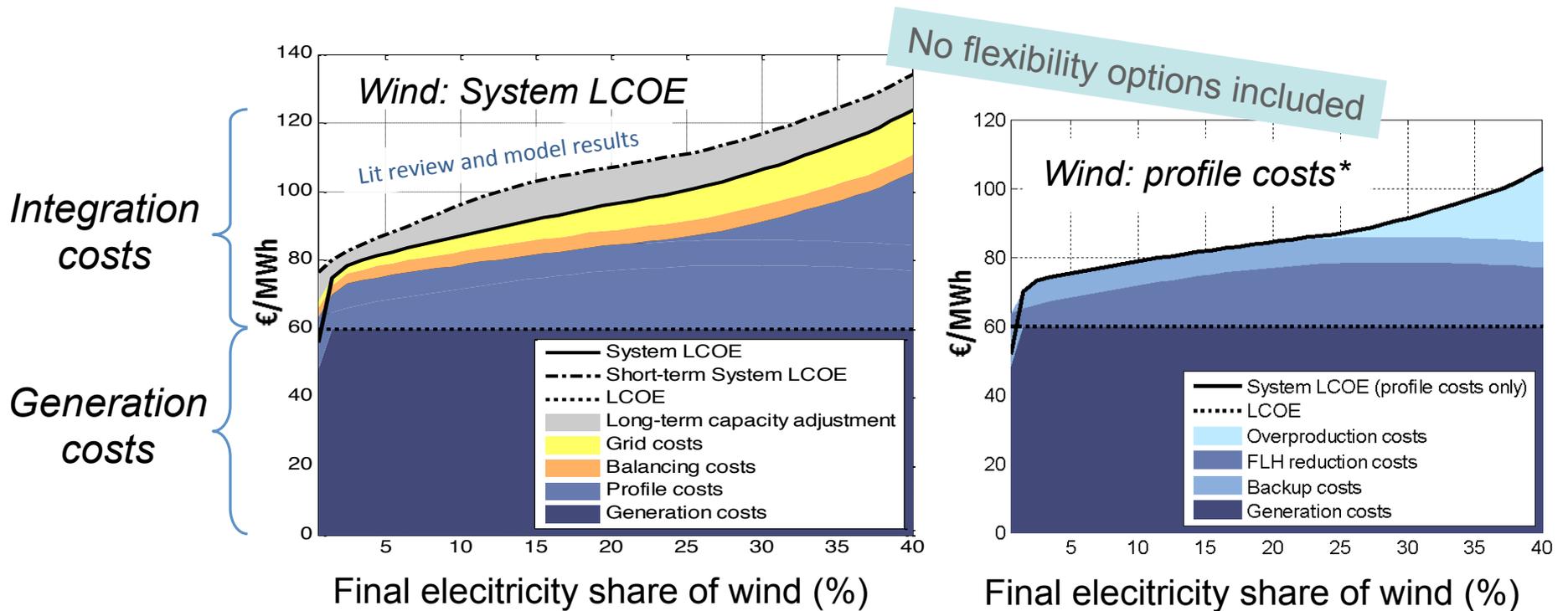
# Variability changes economic evaluation of VRE

## What is the optimal amount of wind?



Note, high integration costs of VRE do not imply that optimal shares are low.

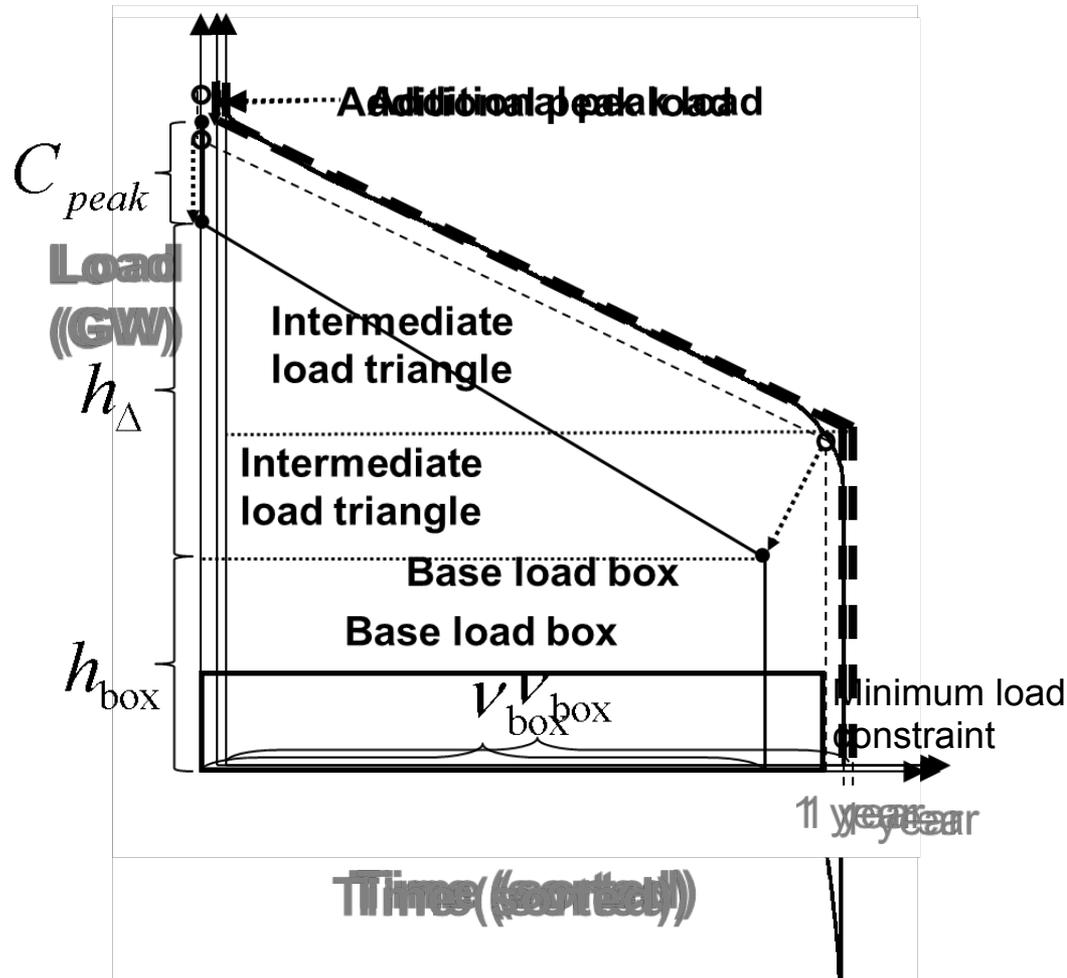
# System LCOE can be implemented in IAMs



- System LCOE can be implemented as a function of VRE penetration
- It needs bottom-up studies for parameterization (depending on flex.options)
- Cost adders are a good solution for balancing and grid costs
- Conventional plants also imply integration costs
- Profile costs can also be accounted for endogenously

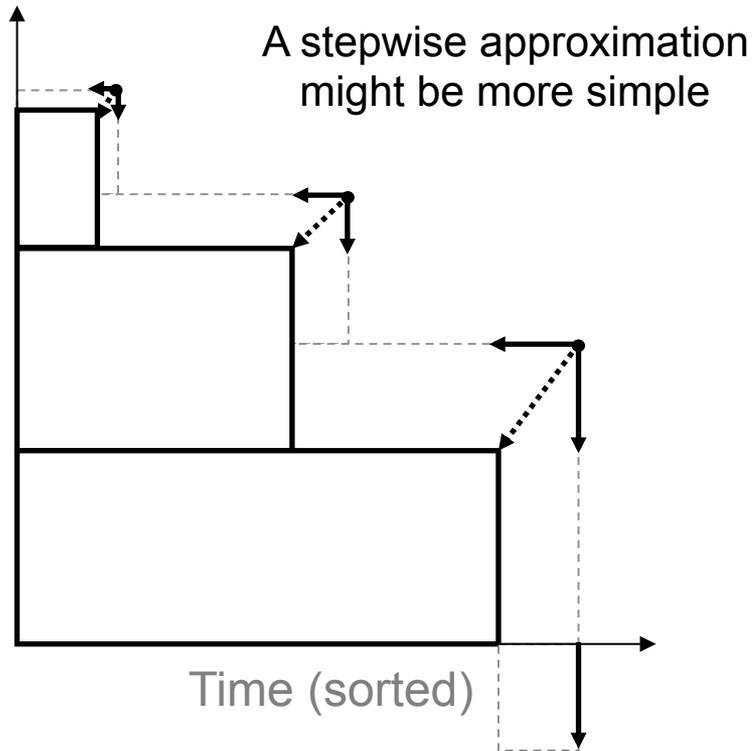
*\*no minimum load constraint*

# Accounting for profile costs endogenously: RLDC approach



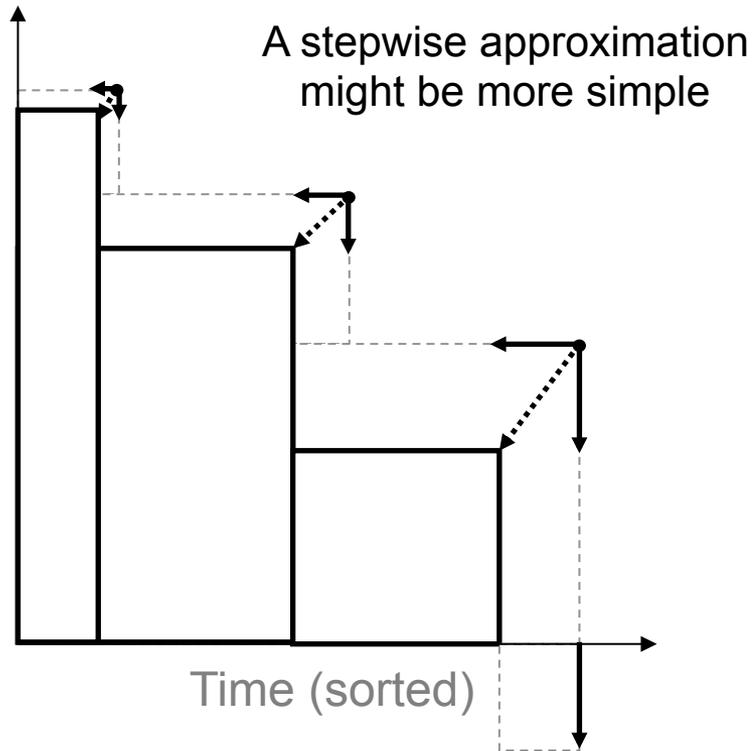
- A stepwise linear function approximates the (R)LDC data
  - The RLDC endogenously changes within the optimization
  - 4 Parameters depend on penetration and mix of variable renewables
  - Dispatchable power plants cover residual load
- Low capacity credit is considered
- Full-load hours of dispatchable power plants are endogenously reduced
- Curtailment is considered
- Important flexibility option: Adaptation of the residual capacity mix is modeled

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# Accounting for profile costs endogenously: RLDC approach



Could be implemented similar  
as representative time slices

- A stepwise linear function approximates the (R)LDC data
  - The RLDC endogenously changes within the optimization
  - 4 Parameters depend on penetration and mix of variable renewables
  - Dispatchable power plants cover residual load
- Low capacity credit is considered
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- Important flexibility option: Adaptation of the residual capacity mix is modeled

# Flexibility options can be structured along the challenges

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Grid-related Costs	Balancing Costs	Profile Costs
<ul style="list-style-type: none"><li>• Grid investments (no regret)</li><li>• <i>Shift generation/load geographically</i></li><li>• <i>Locational price signals on spot markets</i></li></ul>		

Bottom-up research required on long-term role of flexibility options and integration costs at high VRE shares

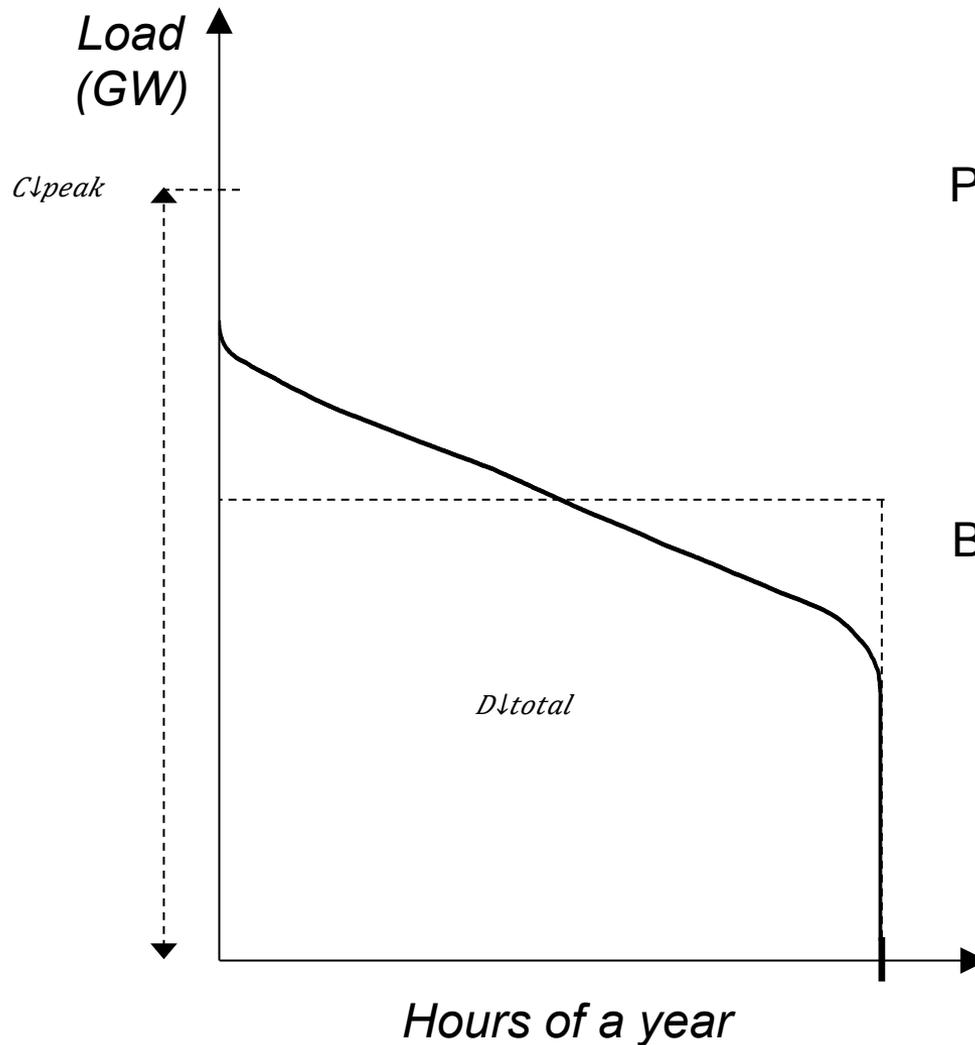
# Summary

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1. IAMs tend to model electricity as a homogenous good, though it is not
2. IAMs should account for demand variability e.g. by representing a LDC
3. VRE induce integration costs (grid, balancing and profile costs)
4. Integration costs of wind power can be in the same range as generation costs at high shares
5. A major driver of integration costs are profile costs
6. We suggest a metric 'System LCOE' that can be implemented in IAMs (it needs bottom-up models for parameterization)
7. Profile costs can directly be represented in IAMs via RLDC
8. Bottom-up research on long-term role of flexibility options and integration costs at high VRE shares needed



# Accounting for profile costs endogenously



Peak capacity constraint

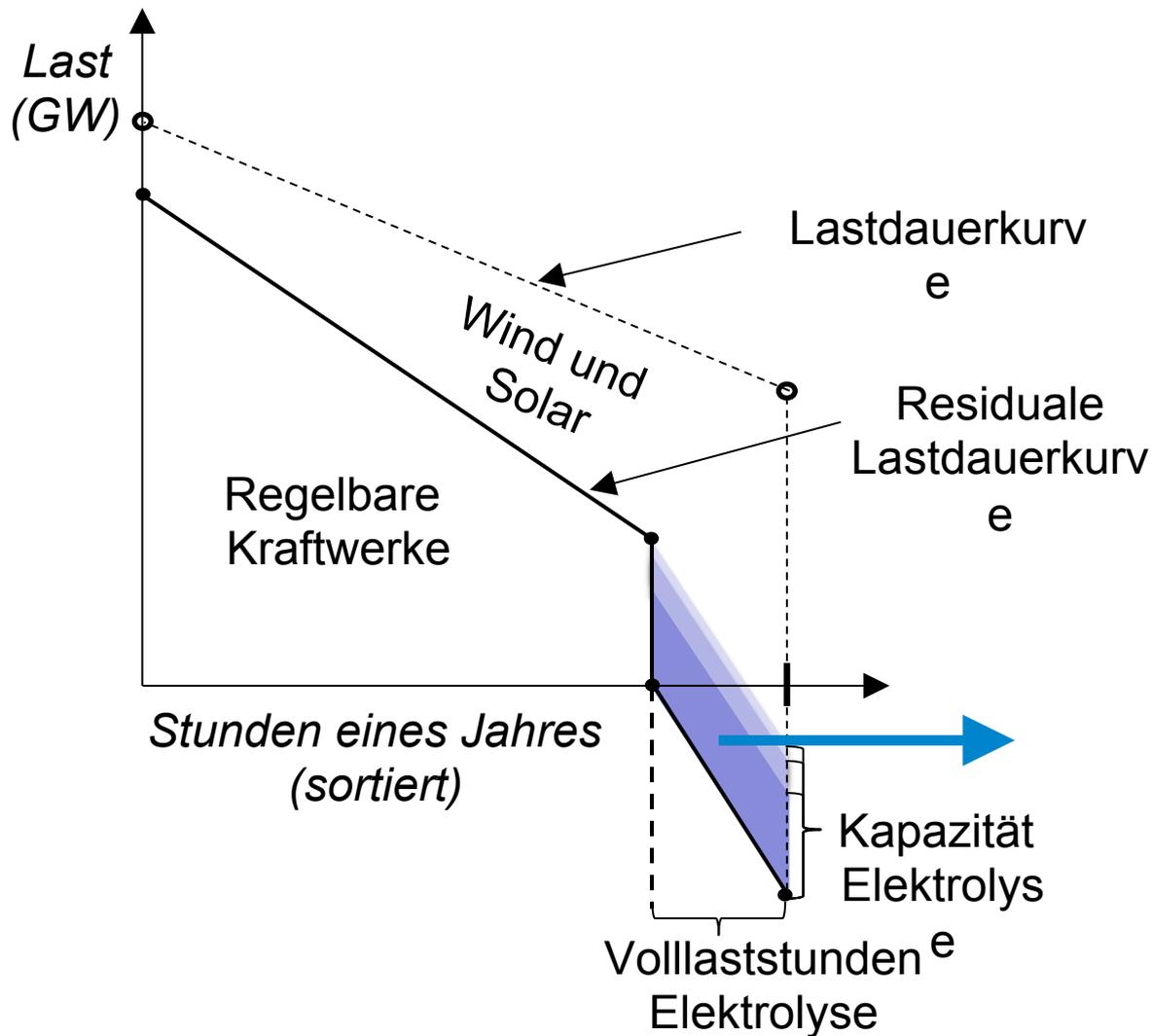
$$C_{peak} = \sum_{te} \gamma_{te} C_{te}$$

Balance equation:

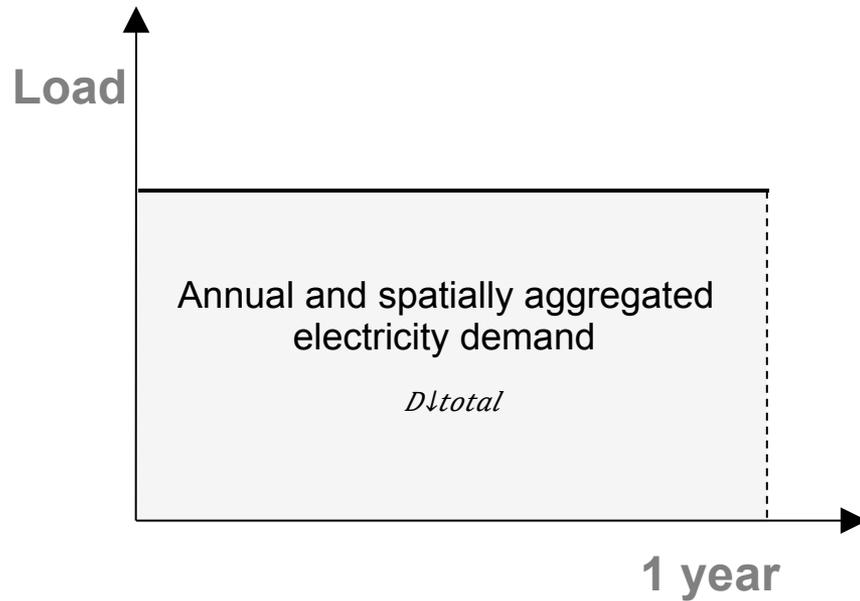
$$D_{total} = \sum_{te} G_{te}$$

$G_{te}; C_{te}; \gamma_{te}$   
 Generation; capacity;  
 capacity credit from  
 technology  $te$

# Modeling hydrogen storage in the RLDC approach



# Accounting for profile costs endogenously



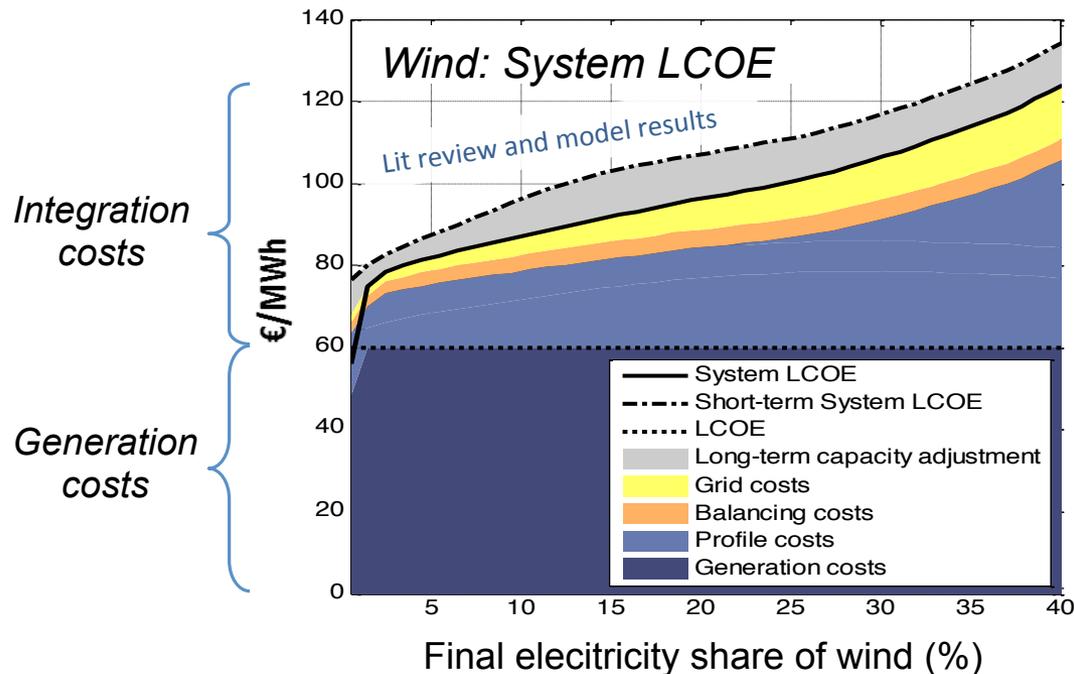
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$G_{te}$ : Annual generation  
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# Outlook

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# System LCOE – magnitude and shape



- From literature: Grid and balancing costs (Holttinen et al. 2011; Gross et al. 2006; Hirth 2012a, dena 2010)
- From a simple model: profile costs.
- Parameterized from German data, representative for thermal systems in Europe
- Caveats that increase integration costs
  - No import/export
  - No demand elasticity
  - No storage
  - Power sector only

- Integration costs of wind power can be in the same range as generation costs at high shares
  - A significant driver of integration costs are profile costs, especially the reduced utilization of capital-intensive thermal plants.
- Integration costs can become an economic barrier to deploying VRE at high shares.
- An economic evaluation of wind and solar power must not neglect integration costs.

# What are integration costs?

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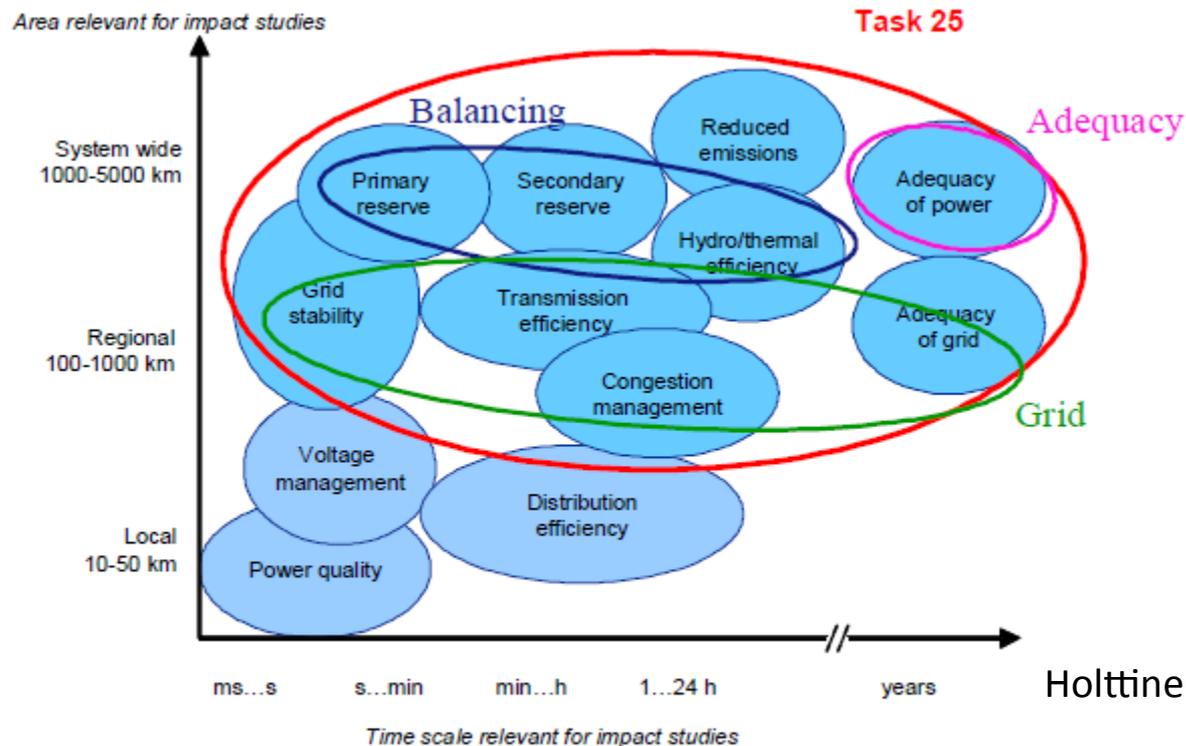
- Integration costs have been defined as
  - *“the additional costs of accommodating wind and solar” (Milligan et al., 2011, p.51)*
  - *“the extra investment and operational costs of the non-wind part of the power system when wind power is integrated“ (Holttinen et al., 2011, p. 180).*
  - *“comprising variability costs and uncertainty costs” (Katzenstein & Apt 2012, p XX)*
- However, there is no formalised definition
  - no agreement on how to calculate them (Milligan et al., 2011)
- Integration studies operationalize integration costs as the sum of integration cost components, assuming that this division is exhaustive

# A taxonomy of integration costs for variable renewables

„Adequacy costs“  
(„capacity costs“)

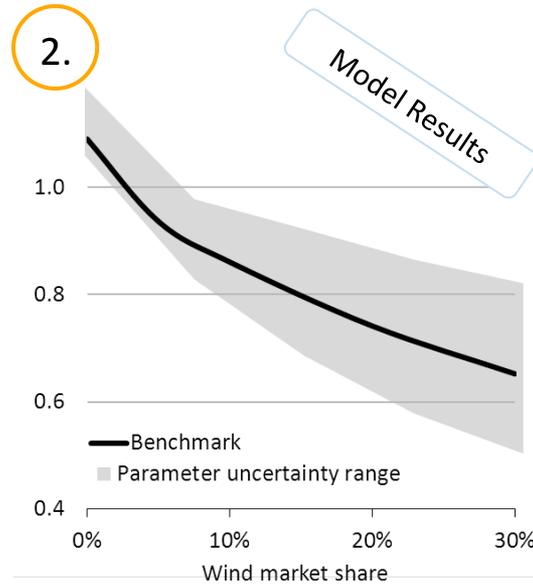
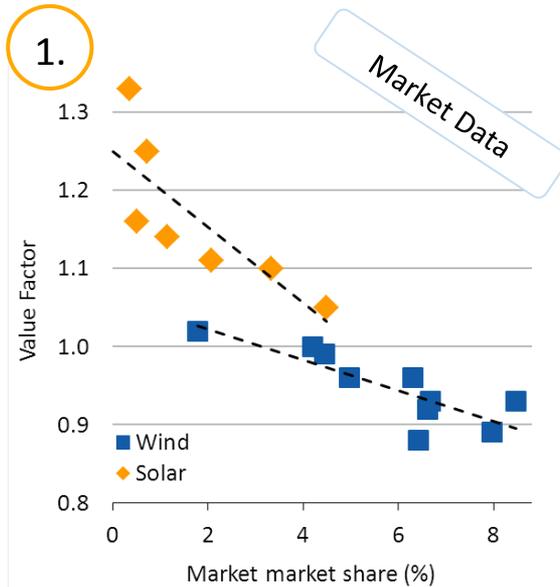
„Balancing costs“

„Grid costs“



## Integration costs

# The market value (here value factor) reduces: Market Data, Model Results, Literature Review



At 30% penetration, the value factor of wind falls to 0.5 – 0.8 of the base price. In Germany, it has already fallen from 1.02 to 0.89 as penetration increased from 2% to 8%.

Hirth, Lion (2013): "The Market Value of Variable Renewables", Energy Economics 38, 218-236.