

# **Learning-by-doing in wind electricity production – Who learns and why does it matter to differentiate?**

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Eighth Global Conference on Environmental Taxation  
18-20 October 2007, Munich, Germany

# Introduction

- Technological progress crucial for climate policy
- Alternative approaches to modeling technological change
  - autonomous
  - R+D induced learning
  - Learning-by-doing: reduction of production costs with growing “experience” (cumulative production or capital stock)
- Political relevance:
  - timing of emissions reduction
    - autonomous or R+D-induced progress: (research now), act later
    - learning-by-doing: early action
  - optimal reduction targets
  - strategic behavior of individual countries (first-mover vs. leap-frogging)

## Focus of our paper:

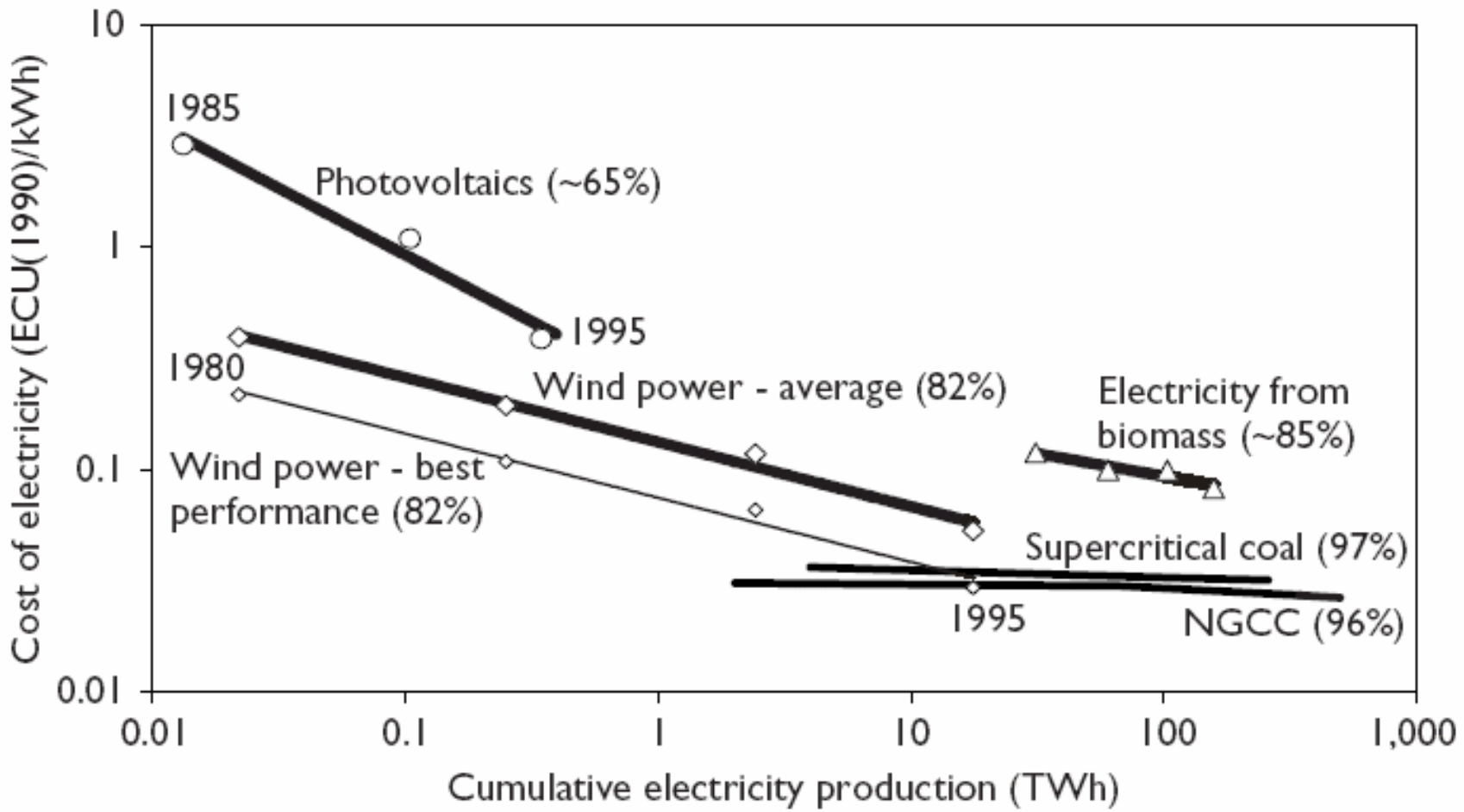
- learning-by-doing
- wind energy
- where does learning take place and why is it important to distinguish?
- Distinguish between learning in renewable energy **equipment production** and learning in renewable electricity **generation**
- ‘Explorative exercise’ in modeling
  - introduce learning-by-doing in energy economy CGE model
  - introduce renewable energy equipment production
  - analyze economic and international trade effects of mitigating CO2 emissions with alternative assumptions about learning

- Costs of output ( $C$ ) decrease with cumulative experience ( $X$ ) of producing this output

$$C = \alpha X^{-\beta}$$

- $\alpha$  normalization parameter,  $\beta$  learning elasticity
  - Doubling of  $X$  leads to specific cost reduction of  $2^{-\beta}$  (PR); learning rate =  $1 - 2^{-\beta}$
- Proxy for experience: cumulative output or investment

# Learning-by-doing



# Learning-by-doing...

- ...in renewable energy equipment & machinery

- improvement in machinery and equipment components
- such as for wind turbines: hub height, rotor blades, foundation and site preparation etc.
- learning curve relates unit cost of energy equipment (€/kW) to output produced in industry (kW)



- ...in renewable electricity generation

- improvement in identifying and making use of most favorable locations, better information technology, improved operation and maintenance, energy management, plant lifetime
- learning curve relates levelized cost (=average unit costs) of electricity generation (€/kWh) to electricity output (kWh)



# Modeling tool

- LEAN\_2000 (developed by Prof. H. Welsch, Oldenburg)
- Top down CGE energy economy model
- Dynamic recursive model with 1 year time steps and myopic expectations
- Time horizon up to 2030
- Two regions: Germany, Rest of Europe
- 15 sectors, thereof 7 energy sectors
  
- **3 tasks:**
  - introduce learning-by-doing
  - introduce renewable energy equipment production
  - develop 3 scenarios

# Technological Change in LEAN - previously

- Exogenous productivity change
- Factor saving technological change
- $X_t$  (RNBL) =  $f(gK_t * K_t, gL_t * L_t)$ 
  - $f(x,y)$  = output function of inputs measured in efficiency units
  - $gK$  efficiency of capital stock/investment
  - $gL$  labor efficiency
- Efficiency of capital stock is weighted average of efficiency of last year's capital stock and efficiency of new investment (latest vintage)

$$gK_t = \frac{(1 - \delta)K_{t-1}}{K_t} gK_{t-1} + \frac{I_{t-1}}{K_t} gI_{t-1}$$



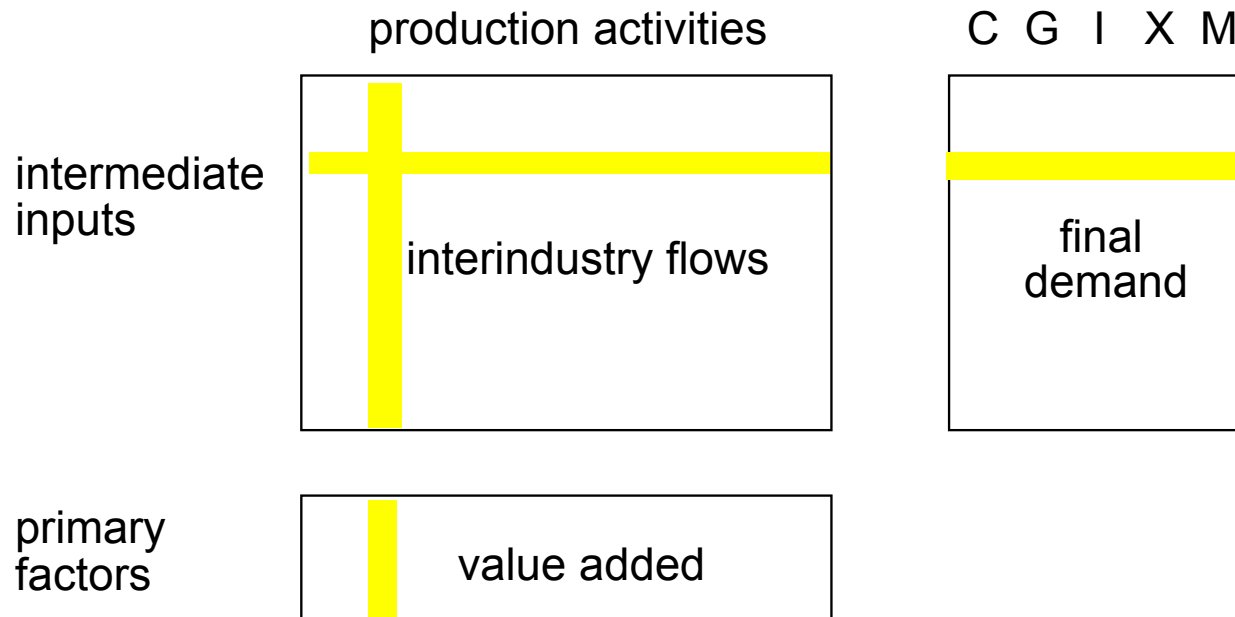
# Implementation of LbD in LEAN

- Efficiency of factor input ( $gL$ ,  $gI$ ) as function of cumulated output ( $X_{cum}$ )
- LbD can be applied to both capital and labor efficiency, i.e.  $gL$  and  $gI$
- LbD induces efficiency increase of new investment not total capital stock (embodied tech change)

$$gI = \left( \frac{X_{cum,t}}{X_{cum,0}} \right)^{\beta}$$

# Renewable energy equipment in LEAN

- Introduce new sector called renewable energy equipment
- Add line and row to input/output table EQRN as fraction (0.5%) of machinery and equipment sector



- **Base case**: No learning takes place in either sector
- Scenario **lbd\_elec**: Learning-by-doing takes place in renewable electricity generation
- Scenario **lbd equip**: Learning-by-doing takes place in renewable energy equipment. It applies to the efficiency of both capital and labor.

- Renewable energy law:
  - goal of 12.5% of electricity produced by renewable energy by 2010, 20% by 2020
  - fixed compensation for power fed into the grid and priority purchase requirement by renewable energy law
- Installed capacity:
  - quadrupled between 1994 and 2004 to 24 GW, mainly wind power
- Export of wind turbines:
  - about 50% of domestic produced capacity in 2004
- Costs of wind power:
  - investment costs (80%), installation costs (foundation, installation work, site preparation, roads, grid)

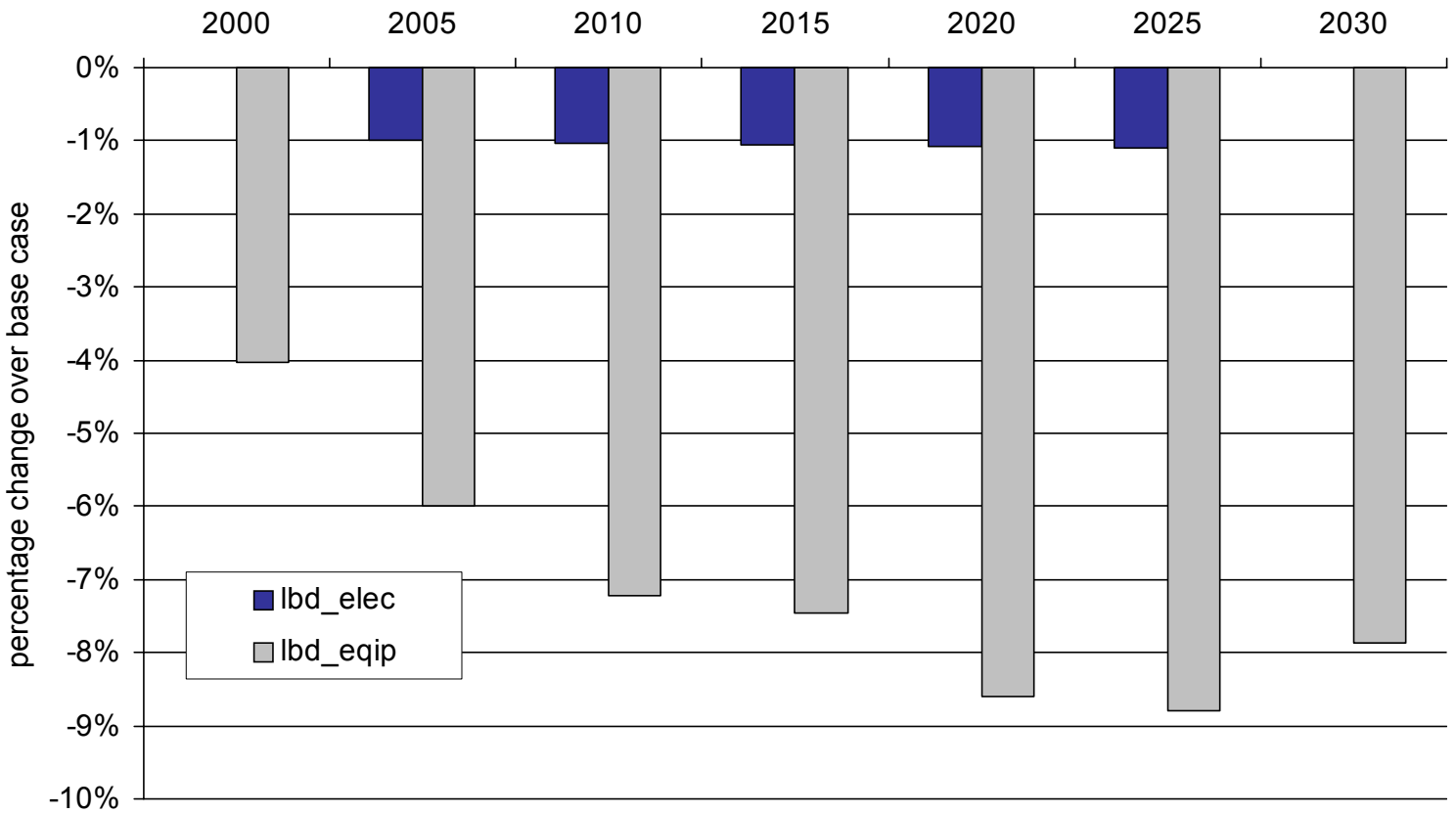
# Scenario assumptions

- CO<sub>2</sub> price 20€/t CO<sub>2</sub> in 2005, linear increase to 40€/t CO<sub>2</sub> in 2010
- Energy:
  - Renewable energy 1.3GW in 1995, 31GW in 2030, high initial increase that tapers off over time
  - nuclear power phase out
  - exogenous assumptions for hard coal
- Learning rates:
  - 10% in renewable electricity generation
  - 10% in renewable energy equipment

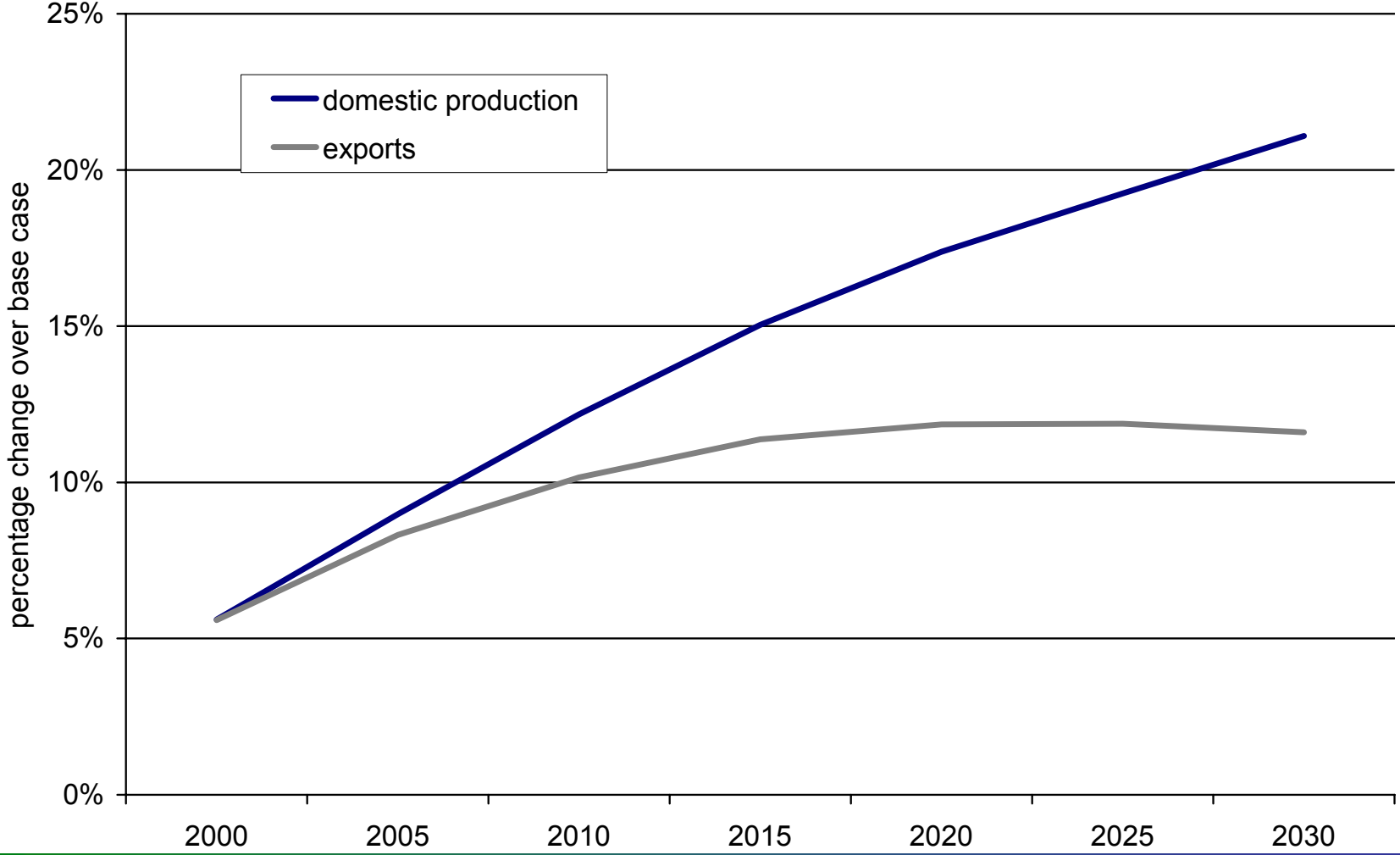
# Some qualitative results

- Both policy scenarios
  - Quantity of renewable electricity output determined by policy objectives and measures
  - LbD reduces the costs of renewable electricity
- Differences between the policy scenarios
  - LbD\_equip spurs exports and output of equipment sector substantially
  - With renewable electricity quantities fixed, LbD\_elec actually reduces demand for equipment

Price of output, change over base case



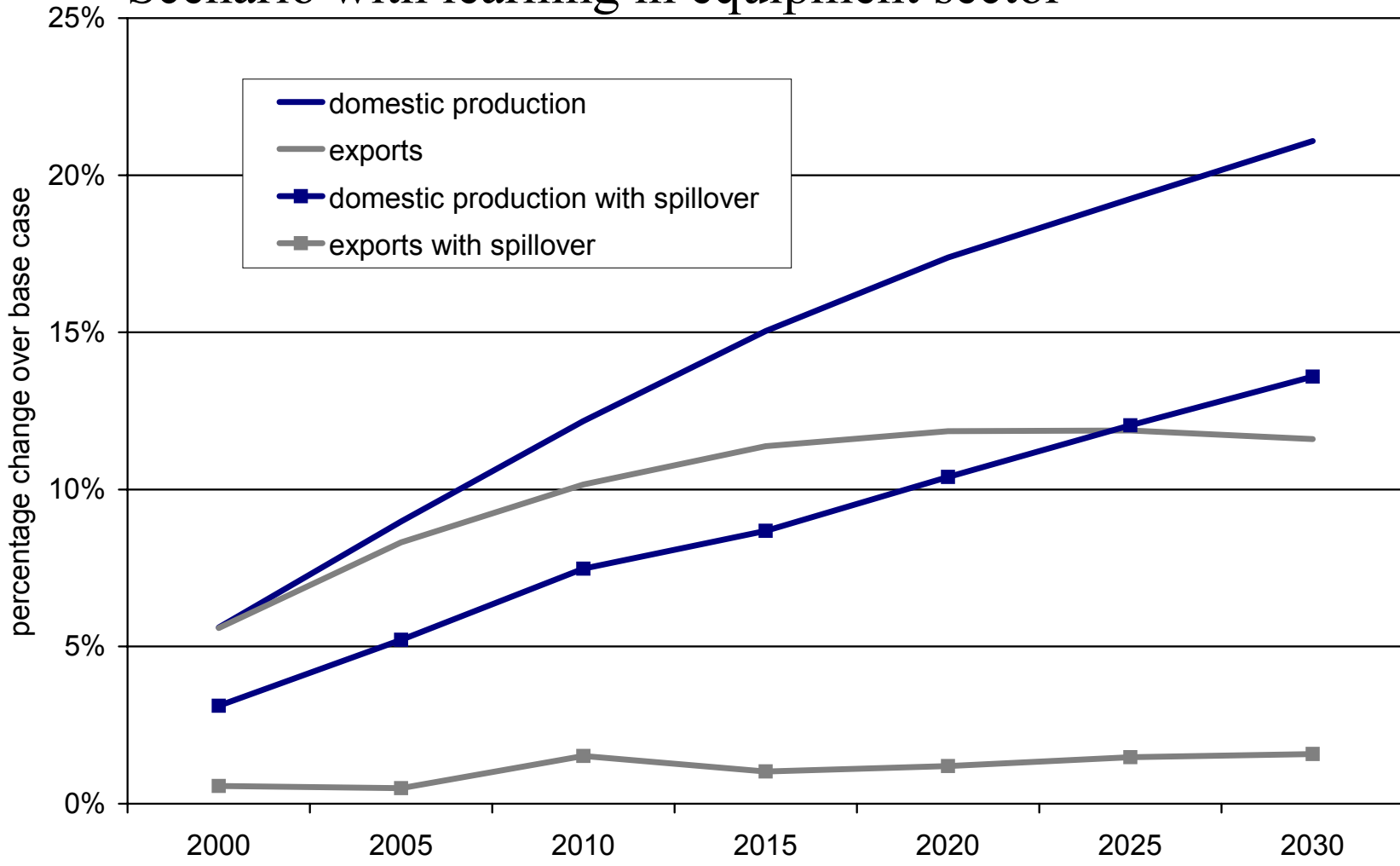
## Scenario with learning in equipment sector





# Renewable energy equipment

## Scenario with learning in equipment sector



# Conclusions

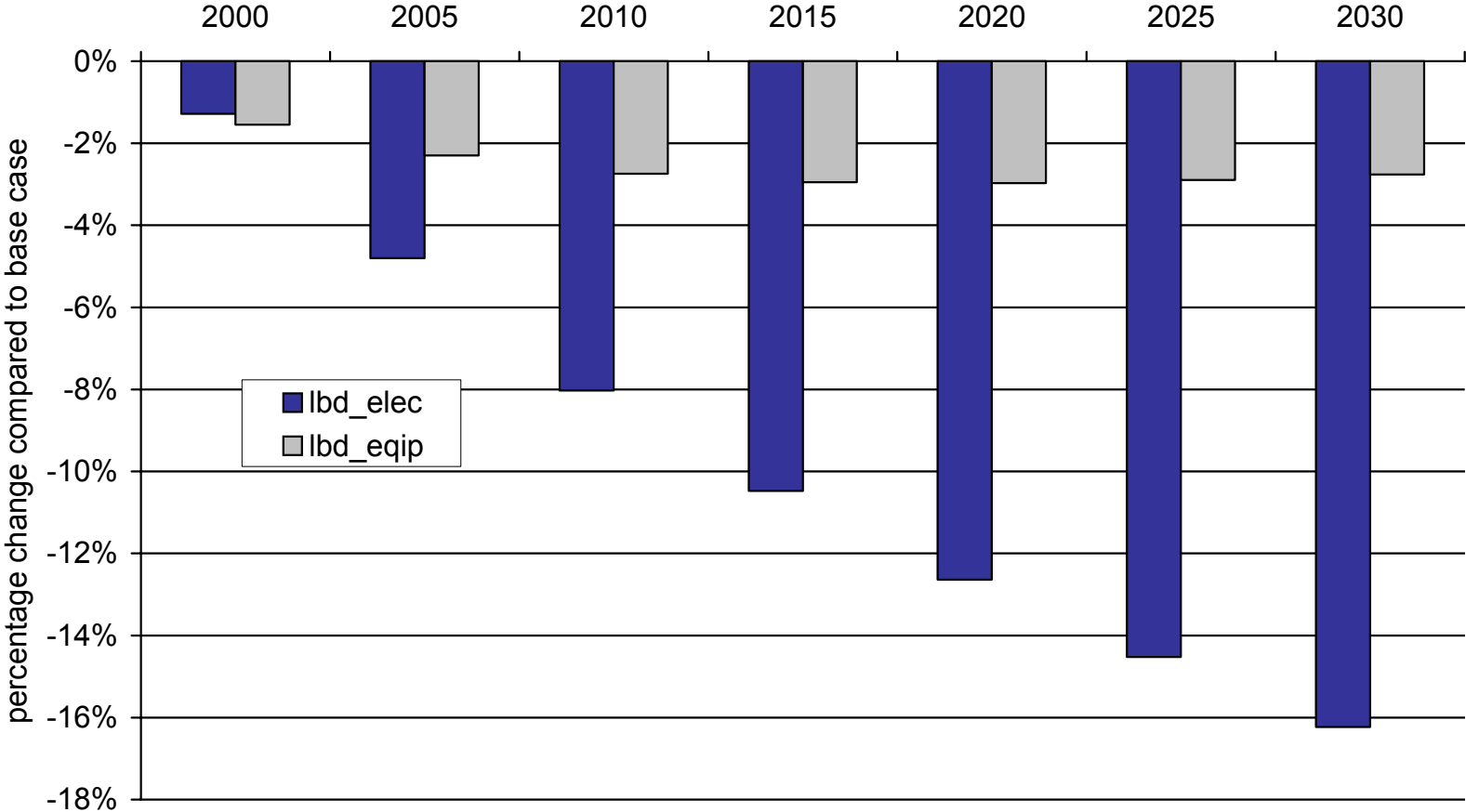
- It does matter to differentiate between learning-by-doing in the renewable energy equipment and in renewable electricity generation.
  - Substantial international trade effects associated with learning-by-doing in the machinery & equipment sector.
- If learning-by-doing affects export sectors and improves international competitiveness this has consequences for the costs and the optimal timing of climate policy.
- Further analyses may profit from literature on international trade and its dynamics in the context of learning-by-doing (see for example Young 1991).
- Different types of learning should be distinguished for parameter estimation as well

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Thank you for your attention!

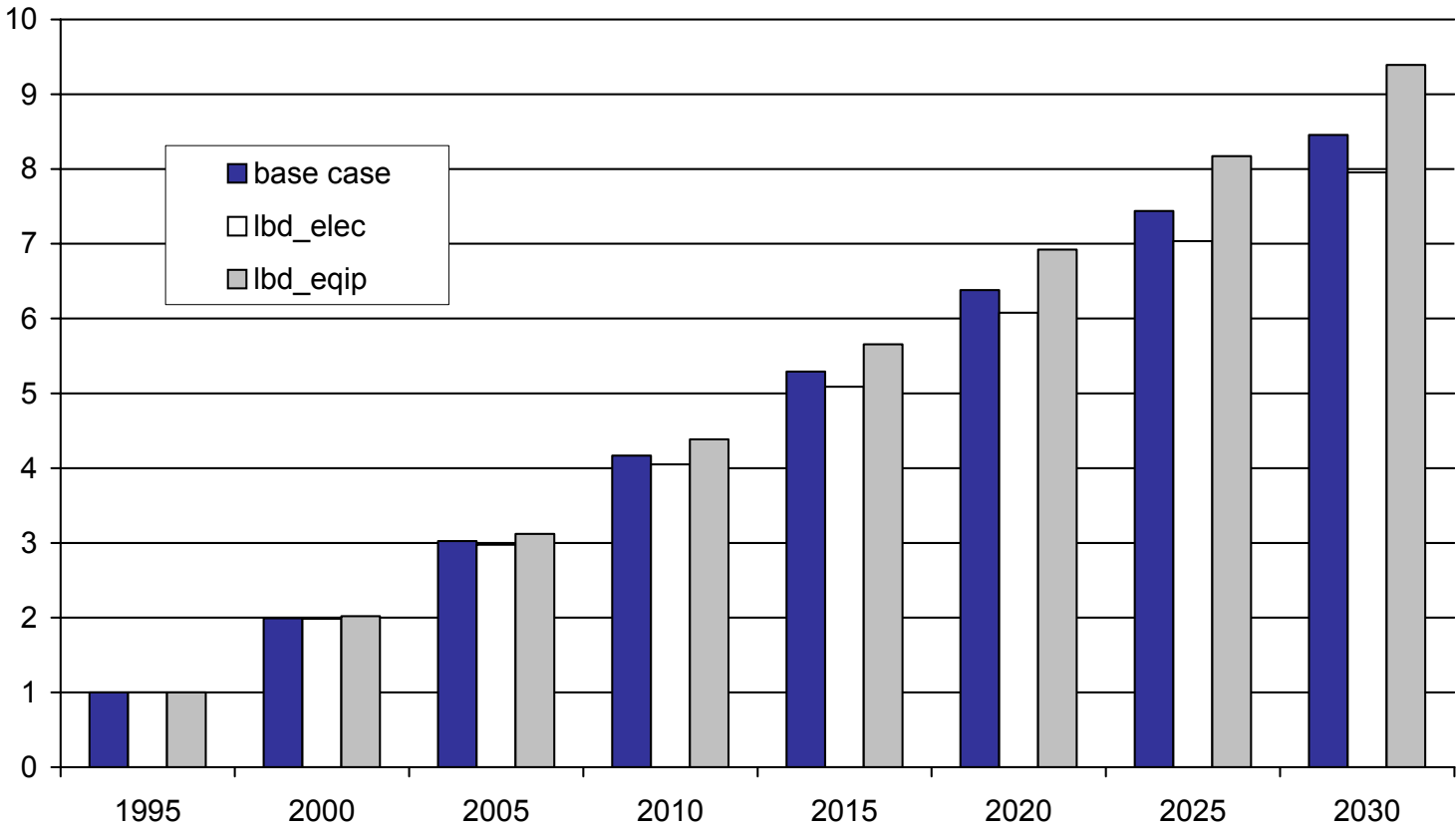
# Extra Slides

### Price of output, change over base case



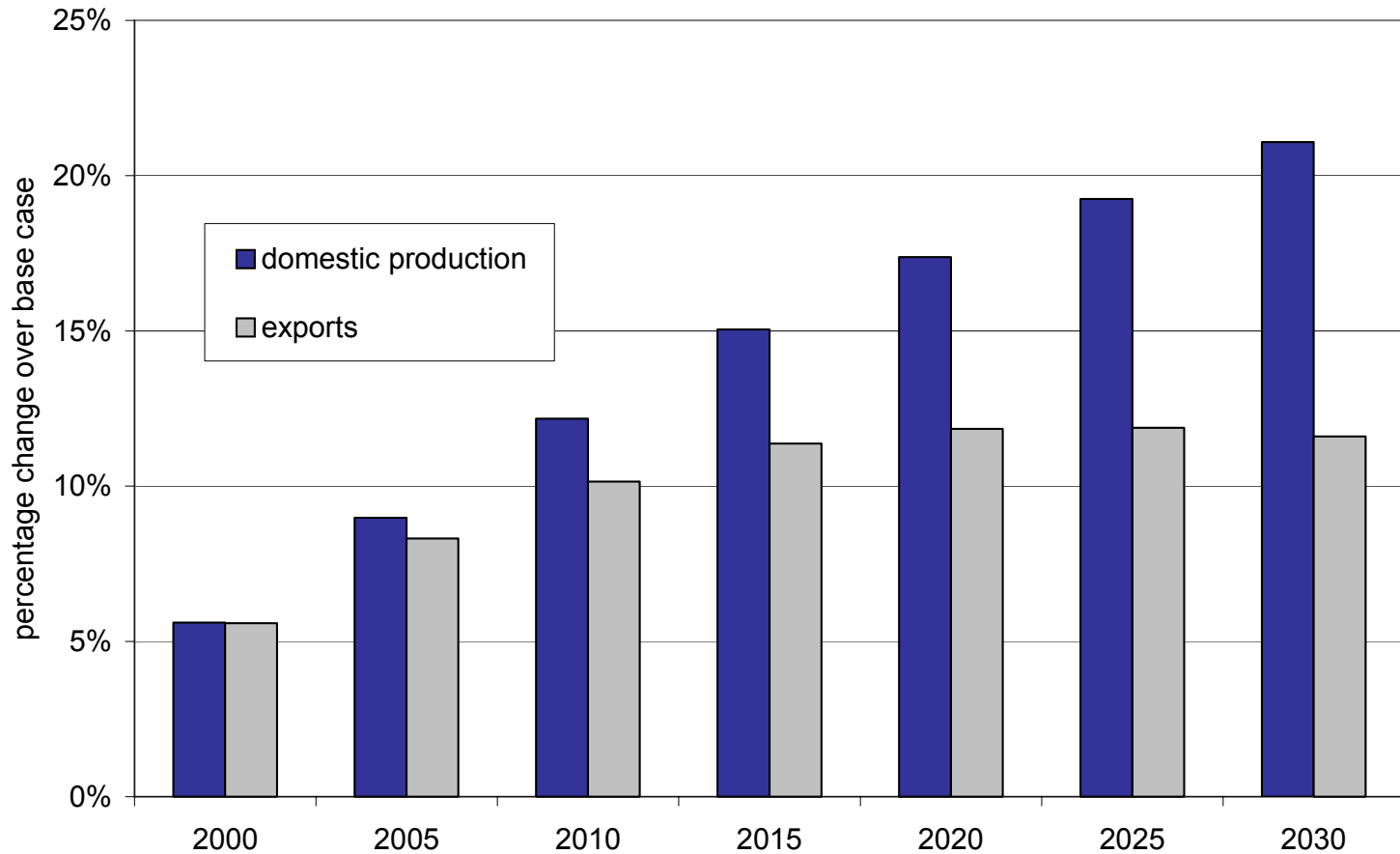
## Cumulative output

Index 1995=1



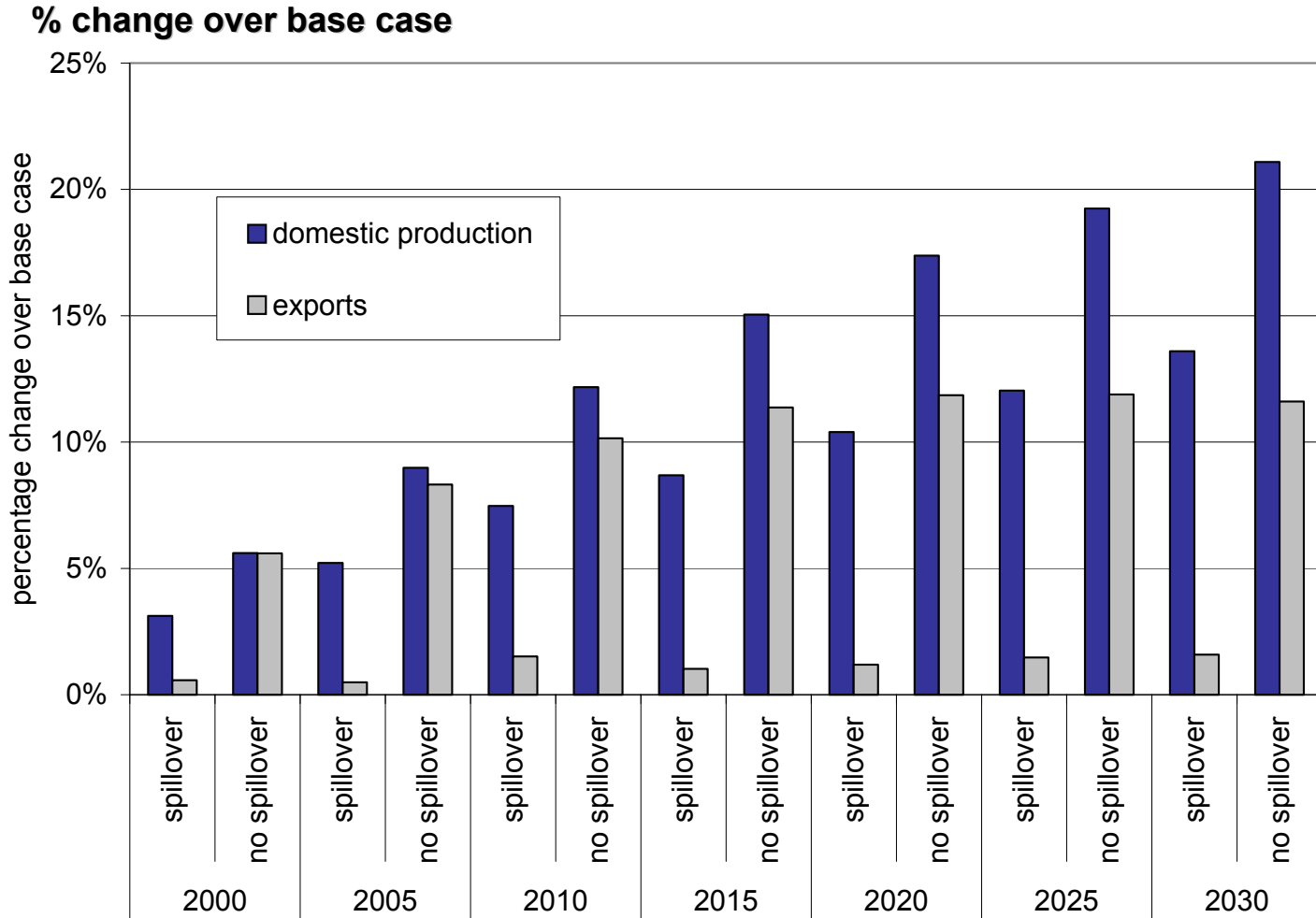
# Domestic production and exports of renewable energy equipment

% change over base case



# Germany renewable energy equipment: Domestic production and exports with and without knowledge spillover

## spillover

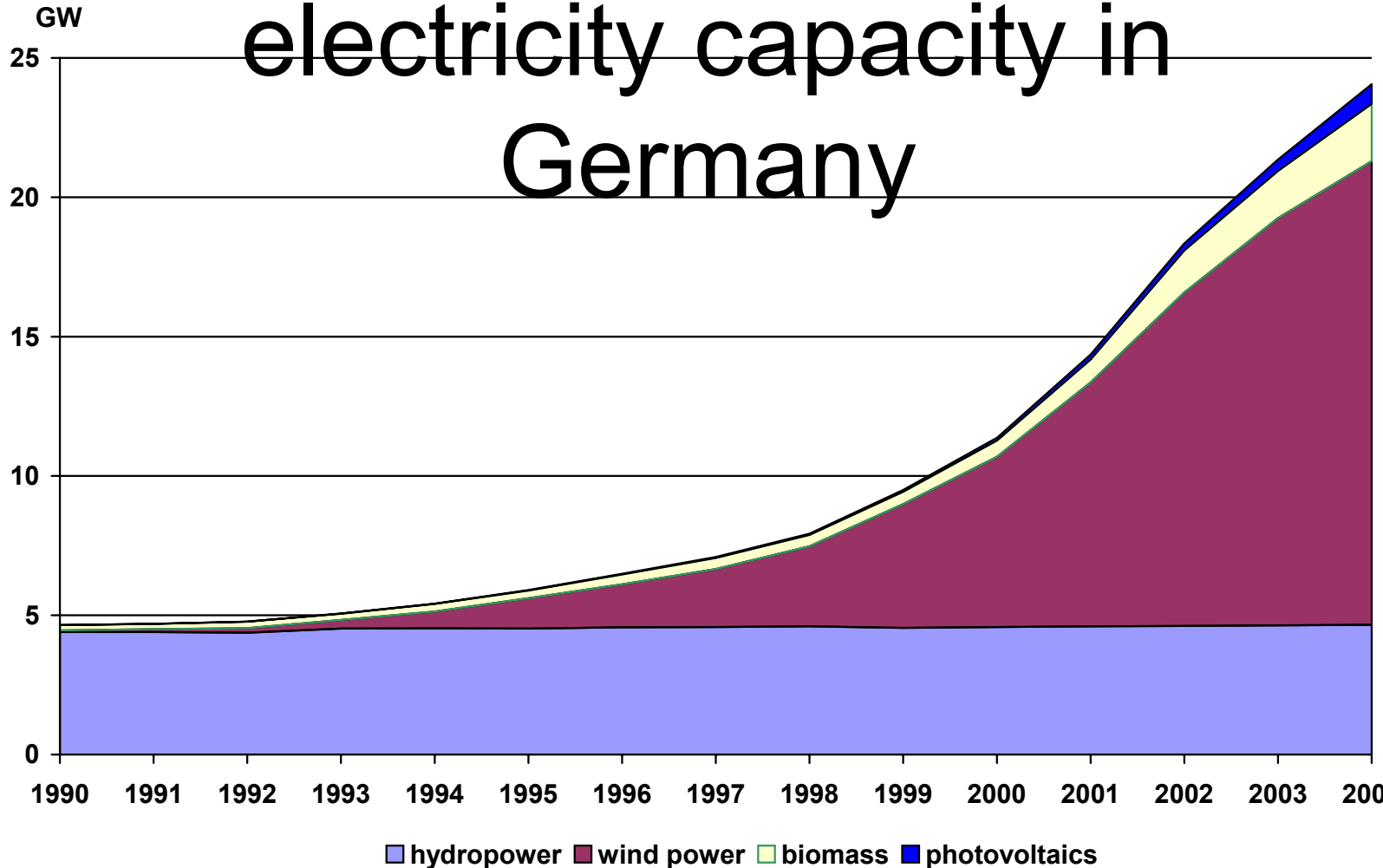




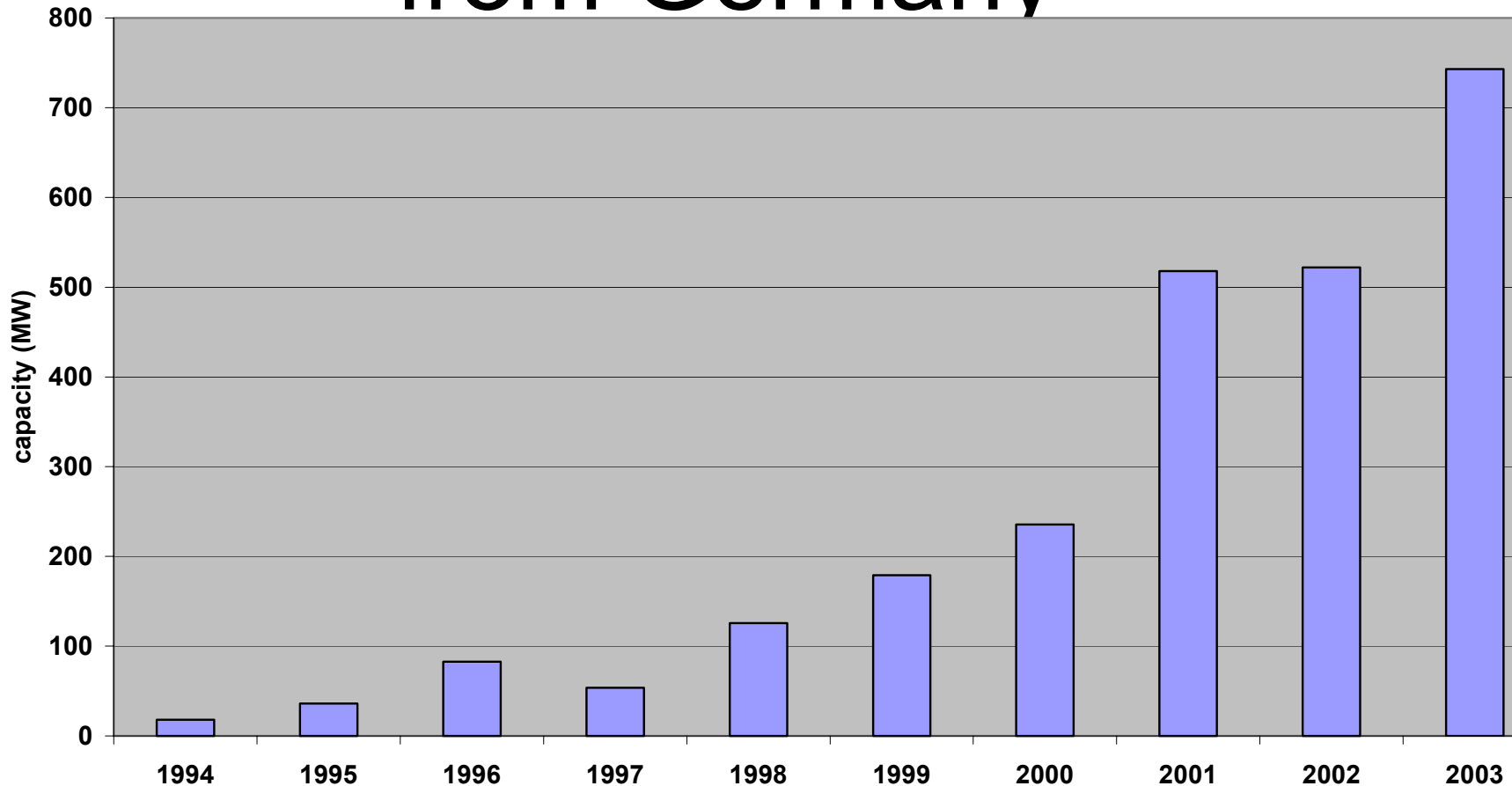
# Sensitivity analysis of spillover effects

- No knowledge spillover: Germany first-mover country that profits from learning within its own borders, no learning in EU
- No knowledge spillover: GER and EU learning depends on experience with own borders
- Knowledge spillover from Germany to other countries (learning in EU and GER based on cum output in Germany)
- Knowledge spillover: Germany and EU profit from experience gained in all of EU (learning in GER and EU based on cum overall output in EU)

# Total installed renewable electricity capacity in Germany



# Annual export of wind turbines from Germany



# Costs of wind power

Cost of wind turbines

Cost of components such as blades, towers etc