



# IMPLEMENTATION OF EXPERIENCE CURVES IN **ENERGY MODELS**

Workshop on Learning Curves, 08.11.2017, Karlsruhe

Implementing experience curves in an optimisation model – example of ELTRAMOD

- Step wise approach for non-linear function
- Max. cumulative capacity defining indirectly floor cost
- Worldwide learning how to consider in regional models
- What is the starting point for capacity technical learning



#### FORECAST

- Bottom-up final energy demand model (Focus)
- Investment decision on total cost of ownership

Problems

- Learning takes place outside the model boundaries
- Problem to find cost data in different countries
- Complexity of model
- Looking at incremental costs
- Global learning: impact of large shares of capacity addition in Europe on global scale capacity and learning rate

Solution

- Exogenous approach (is it justified)
- How to use a general approach for simplifying learning rates for a bundle of technologies



### •Solutions?



### TE3

- Global market dynamics for electric vehicles are important to understand European development
- Historic cumulative battery production (exogenous)
- EU-sales from ASTRA (endogenous), initial battery cost for first unit
- Large impact of small variance in initial set-up on total outcome



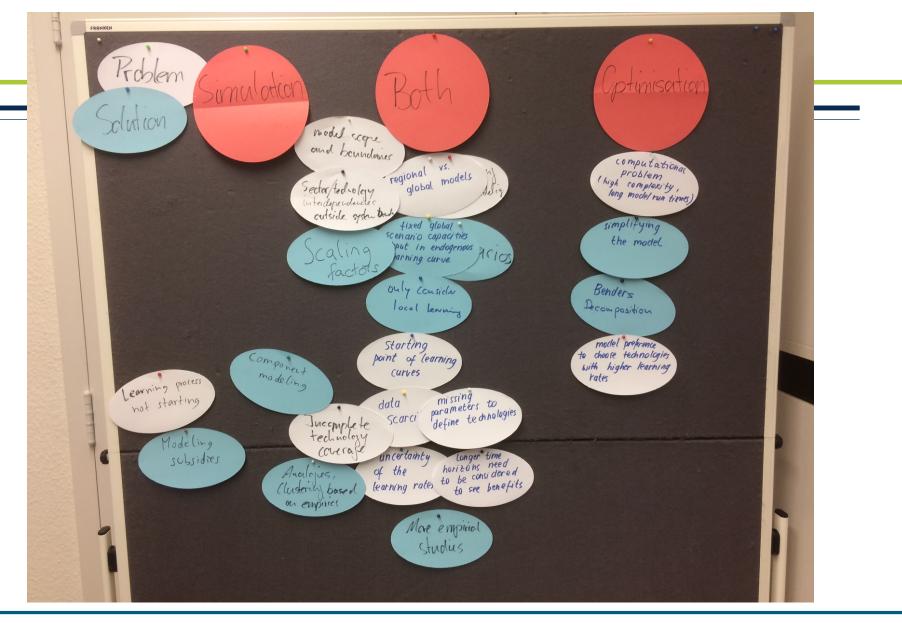
#### PowerAce

- Agent based model (hourly resolution)
- Initial investment for investment decision is dynamic in case of experience curves are applied



- REMIX-model German aerospace institute
- IEA optimisation model (times model)
- IER Times-PanEr (Pinar Korkmaz)
- Jülich (introduction strategies hydrogen infrastructure)
- Linz (Kepeler Uni) techno-economic assessment power to gas (learning curves for power to gas, component based)
- TU Munich (linear optimization power generation)
- DLR (agent based, market integration, investment decisions) maybe implementation of learning curves







## Summary of problems and solutions (independent of model concept)

Learning takes place outside the model boundaries

- How to integrate global learning in regional models
- how to consider regional growth in global learning rates
- Sector/technology interdependencies outside system definition
- ✓ Use scaling factors
- ✓ Use scenarios for global learning
- ✓ Only consider local learning and keep global learning fixed
- Data Scarcity, missing parameters to define technologies, incomplete technology coverage
  - Incomplete technology data
  - Uncertainties
  - Missing parameters
  - What is the starting point for the initial capacity/investment cost -> small variations can have a huge impact in the long run
  - Longer time horizons need to be considered to see benefits
- Data, data, data -> put more emphasis on collecting empirical data
- ✓ Component modelling
- Analogies, clustering based on empiric data



## Summary of problems and solutions (dependent of model concept)

Optimization model

- High computation time
- ✓ Simplify model (reduce technologies, time steps, etc.)
- ✓ Use Benders decomposition approach
- Model preference to choose technologies with higher learning rates

Simulation models

- Learning process not starting (even with high learning rates)
- ✓ Modelling subsidies/policies

