



Experience Curves for Environmental Impact Assessment of PV systems

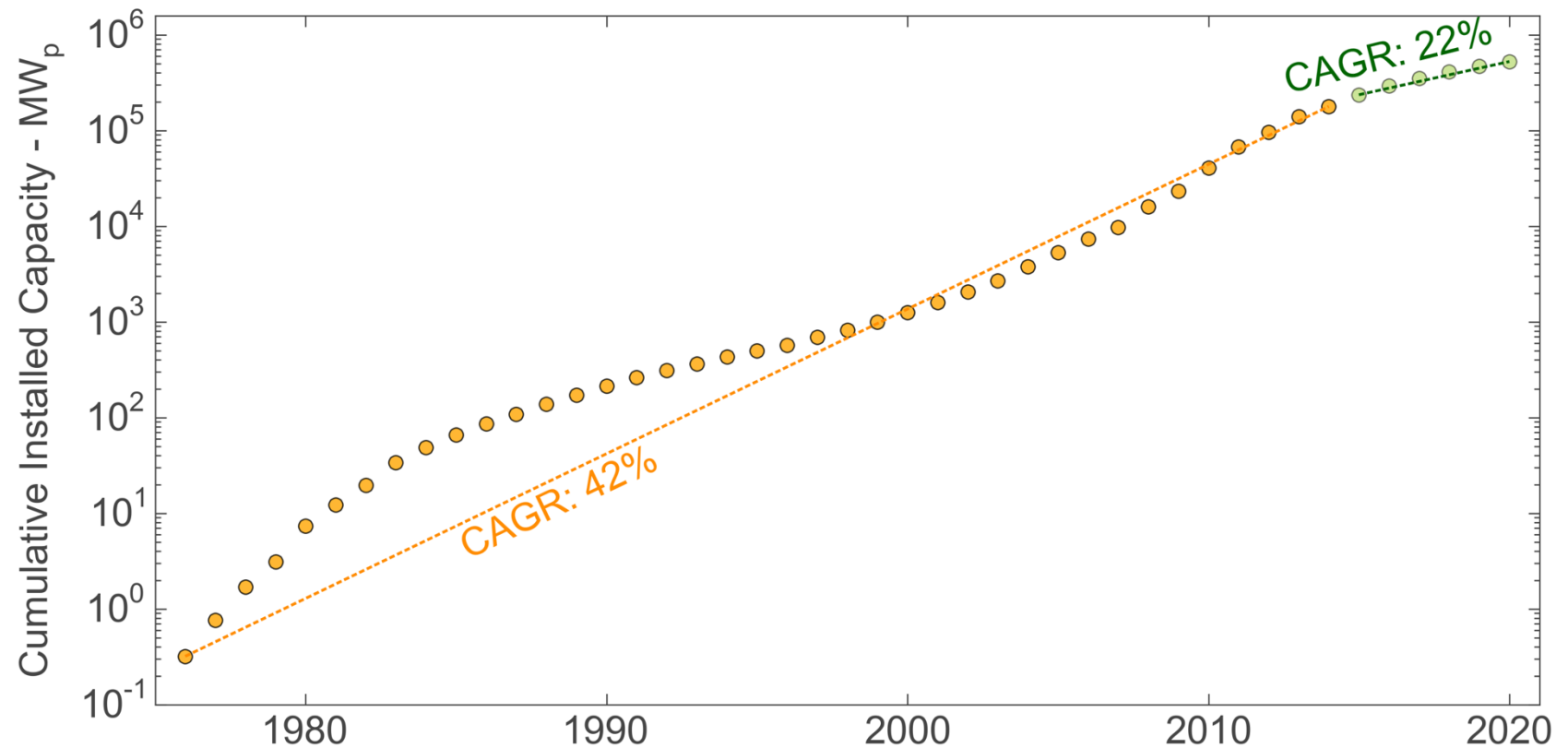
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Context: strong growth of PV





Context: concerns from fast growth

- As of 2013: for every W_p of PV
 - 8-32 MJ of energy used*
 - 0.6-3 kgCO₂-eq released*
 - In the past this was (much) higher
- These external costs are **paid back** by producing electricity
- When **growth** > **1/PBT** PV industry is net
 - Energy user
 - GHG emitter

*M.J. de Wild-Scholten - [doi:10.1016/j.solmat.2013.08.037](https://doi.org/10.1016/j.solmat.2013.08.037)



Aim

- Show historical development of environmental impact of PV production
- Analyse **learning rates**
- Determine **net contribution of PV** in terms of
 - Energy
 - GHG emission reduction

E.g. when will all installed PV capacity have

- Produced more energy than was consumed
 - Avoided more GHG emissions than were released
- from all cumulated production?**

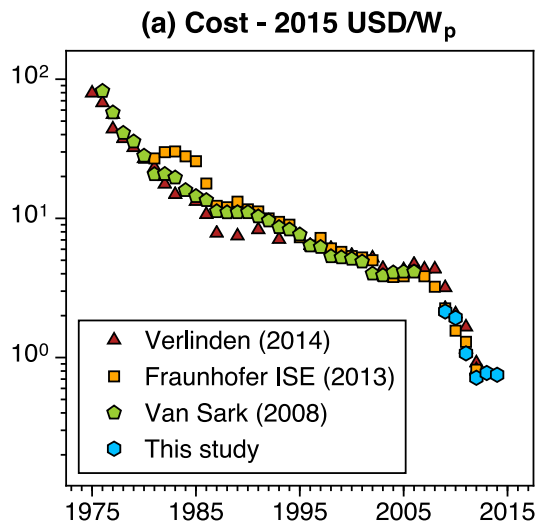


Approach

- Combine historical development of PV for
 - Installed capacity (e.g. IEA PVPS, EPIA)
 - Energy demand and GHG from production (LCA studies)
- Establish experience curve
 - $C_{cap} = C_0 \times cap^{\log_2(1-l)}$
 - Every doubling of *cap*, cost *C* drops with *l*
 - Normally applied for cost but here for energy and GHG
 - Least-squares fit to data



Trends: cost and environmental impact

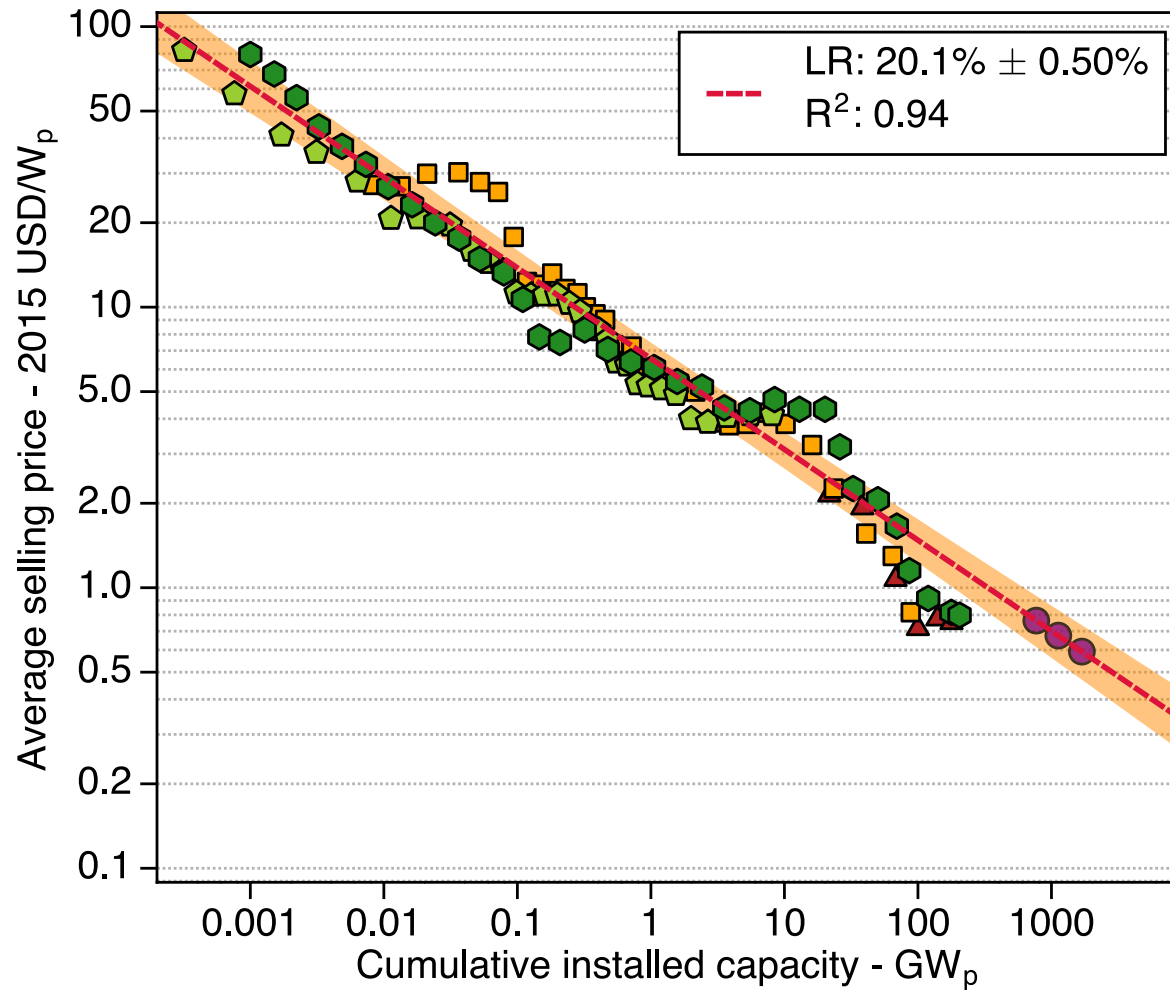


+ cost

+ cost

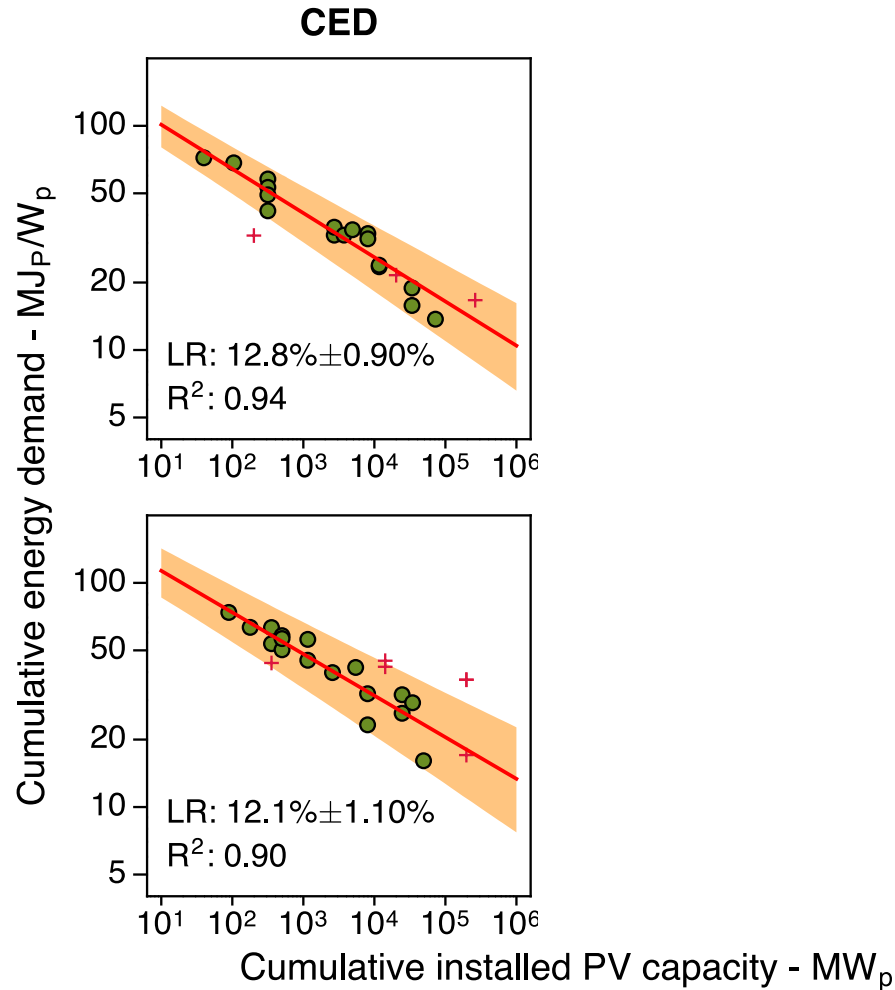


Experience curve - cost





Experience curves – Environmental Impact



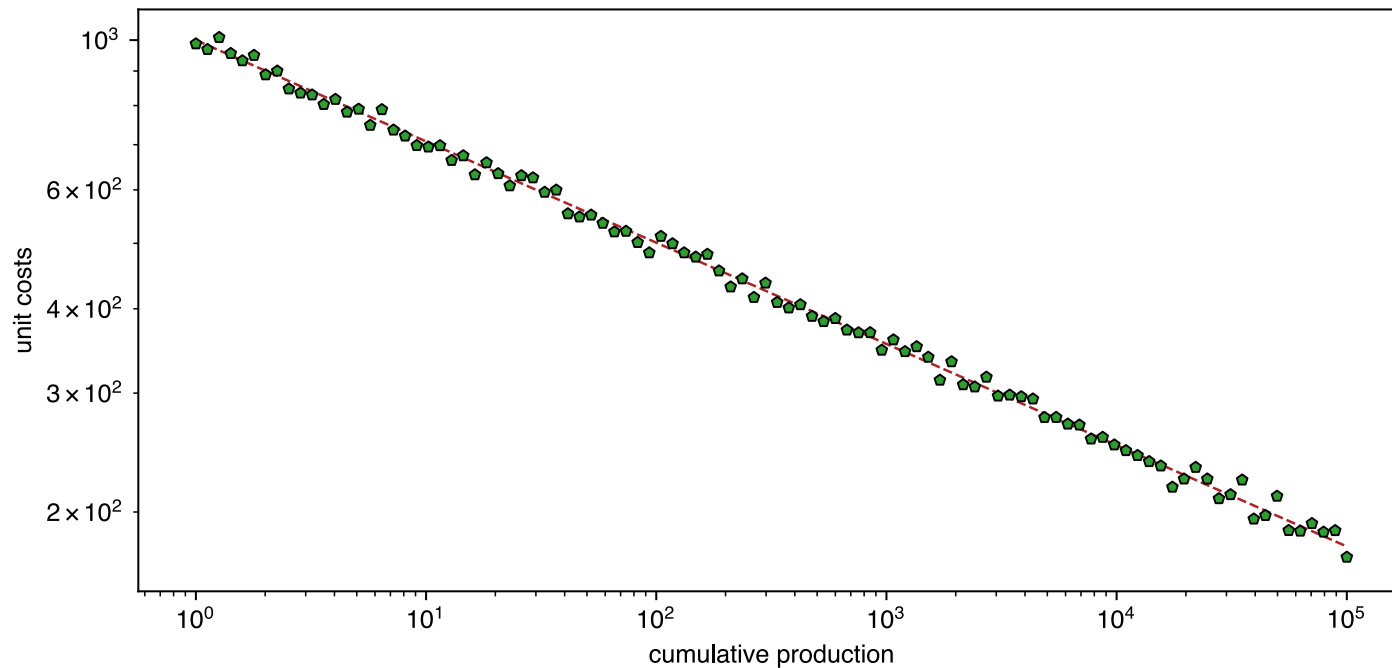


Application of this “Environmental Experience Curve”

- Normally, experience curve can be applied to describe costs developments over time, and project these in to the future
- Another application is to establish e.g. the total required subsidies for a technology to reach a competitive level
 - Integral of the curves gives these total (cumulated) costs



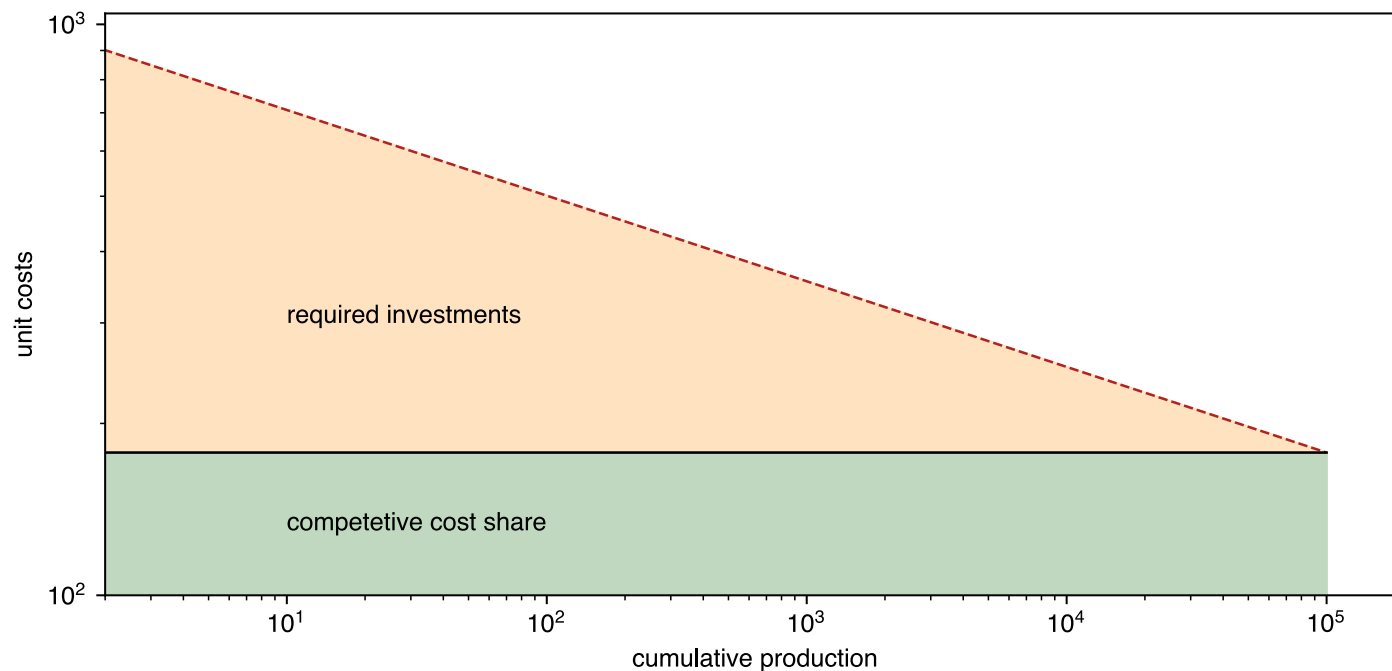
Integral of experience curves gives the cumulated costs





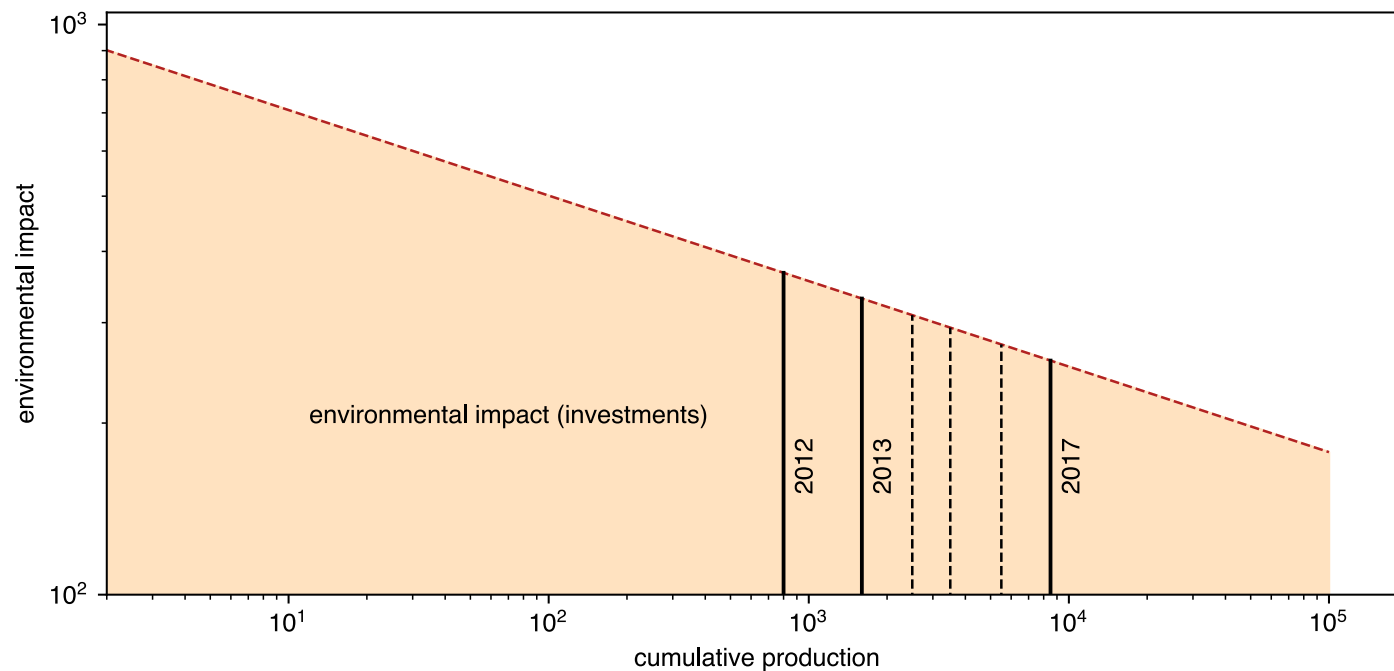
Integral of experience curves gives the cumulated costs

- E.g. compared to an incumbent technology





Here, we use the integral to calculate cumulative and net Energy + GHG emissions





Here, we use the integral to calculate cumulative and net Energy + GHG emissions

- Cumulated environmental impact calculated from integral of experience curve
- Environmental Benefits of PV electricity calculated from
 - Cumulative installations, per country
 - Country level solar irradiance
 - Global average PV system yield
- As we are interested in the time-dependent net impact, we calculate results annually



Net contributions - Energy

$$E_{\text{net}} = \sum_{y=1975}^n [E_{\text{produced}}(y) - E_{\text{consumed}}(y)]$$

$$E_{\text{produced}}(y) = \sum_l \text{cap}(y, l) \times PR(y) \times \text{insolation}(l)$$

$$E_{\text{consumed}}(y) = \left(\frac{CED}{\text{cap}} \right) (y) \times f_{CED}(l) \times \text{capgrowth}(y, l)$$

from experience curve



Net contributions - GHG emissions

$$GHG_{\text{net}} = \sum_{y=1975}^n [GHG_{\text{avoided}}(y) - GHG_{\text{emitted}}(y)]$$

$$GHG_{\text{avoided}}(y) = \sum_l cap(y, l) \times PR(y) \times insolation(y, l) \times GHG_{\text{grid}}(y)$$

$$GHG_{\text{emitted}}(y) = \sum_l \left(\frac{GHG}{cap} \right) (y) \times f_{GHGgrid}(l) \times capgrowth(y)$$

from experience curve



Locations and Performance

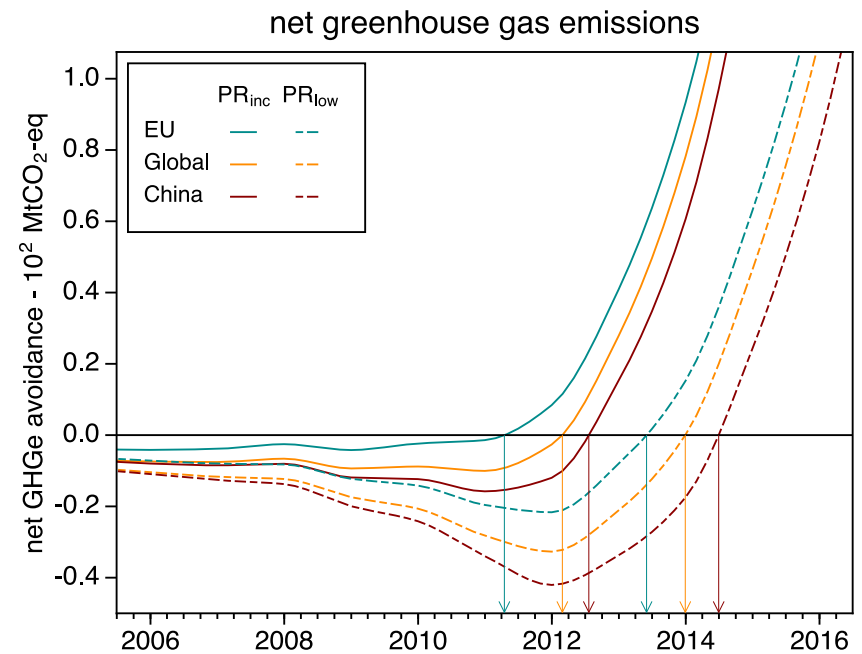
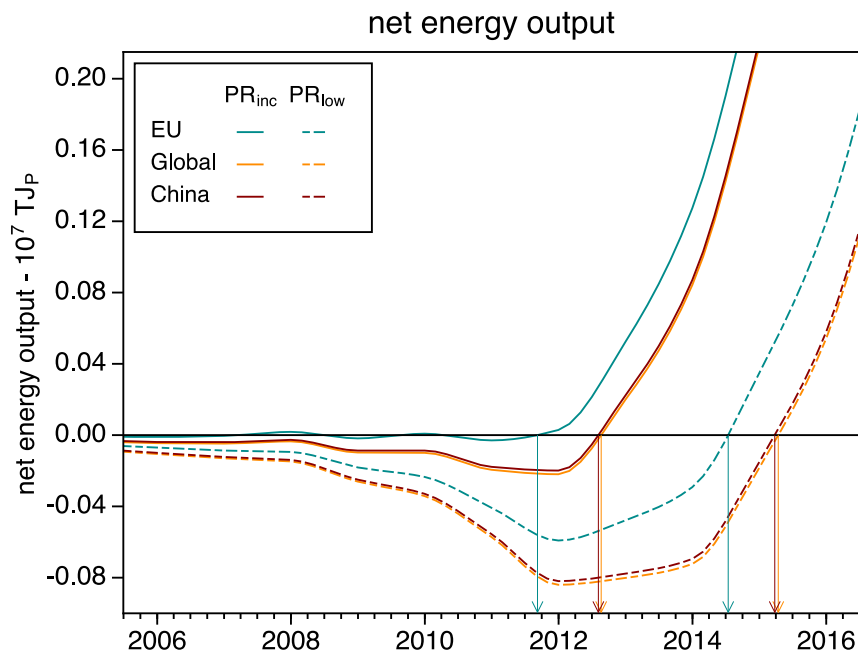
- Analysed multiple scenarios for production in
 - 100% Europe
 - Global (based on actual production shares over time)
 - 100% China
- Analysed two scenarios for performance
 - Constant low performance: worst case ($PR = 0.5$)
 - Increasing performance: from 0.5 in 1970 to 0.8 in 2015 onward (still conservative)



When does break-even occur?



Results – multiple scenarios





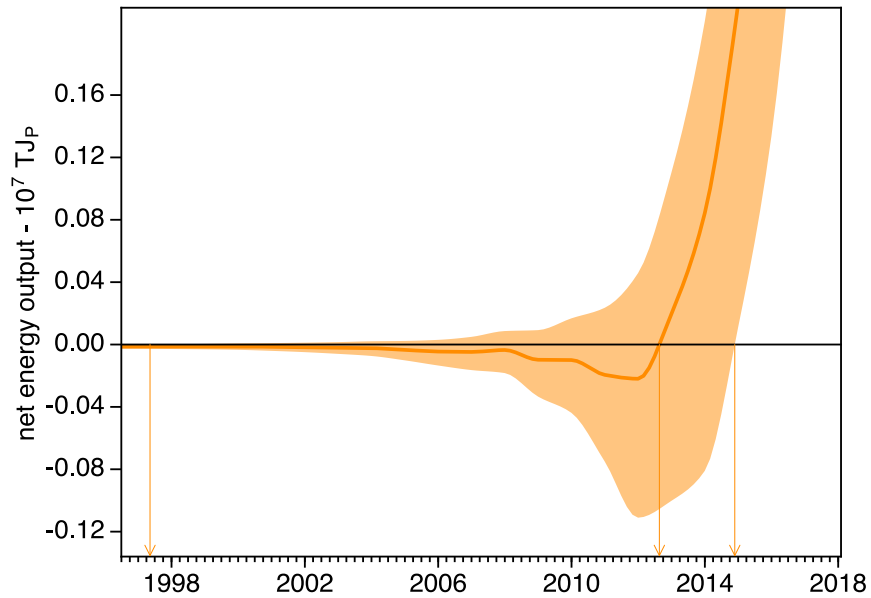
Uncertainty

- As the empirical data (LCA results) are scattered around the experience curve model, there is uncertainty in the parameters
- To analyse, we performed Monte Carlo analysis
 - Draw samples of EC parameters from normal distribution $\mu \pm 1.96\sigma$
 - Recalculate net contributions for each sample set

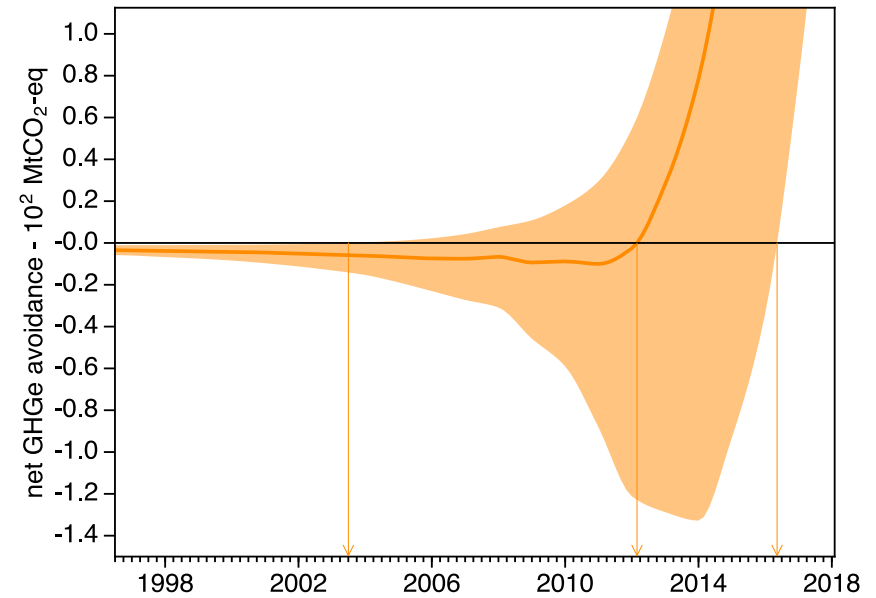


Uncertainty – one scenario

net energy output



net greenhouse gas emissions





Summarising

- Experience curve theory applicable to other metrics than cost, here: CED and GHG emissions
- Clear decrease observed in environmental impact concurrent with increased cumulative capacity
- Break even for energy was here Q3 2012
 - 95% range from 1998-2015
- Break even for GHG was here Q1 2012
 - 95% range from 2003-2016



What does this mean?

- Environmental benefits of PV will be larger, but there is a tradeoff regarding the grid electricity mix GHG
 - Low GHG in mix means low benefits, but also
 - Low GHG in mix means less emission from manufacturing
- From now, at similar growth rate, net environmental benefits of PV quickly and constantly grow
e.g. large constant growth of PV can be sustained without increasing worldwide emissions