Using reanalysis and satellite data to model solar and wind power: challenges, applications, and lessons learnt



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Outline

1. Using reanalysis to simulate PV and wind, (and making the results available online)

- 2. Applications
- 3. Challenges and lessons learnt

PART 1

Using reanalysis to simulate PV and wind

How to simulate PV and wind output

- Measured meteo station data
 - Very limited geographical coverage, varying quality
- Satellite images
 - Limited geographical coverage
 - Directly applicable to photovoltaics (PV) only, not wind
- Industry and project developers have other requirements
 - Investment-grade results = investment-grade costs
- <u>Reanalysis data is an alternative</u> but can it be trusted?
 - Data is already cleaned and organised
 - Global coverage for the last 30 years
 - But... 'measurements' come from a coarse numerical model



PV simulation model



Main challenge & key innovation: bias correction



Pfenninger and Staffell (2016), Staffell and Pfenninger (2016)

Main challenge & key innovation: bias correction



Pfenninger and Staffell (2016), Staffell and Pfenninger (2016)

Bias correction is not optional

- Reanalysis without calibration *will* get it wrong!
- Adjust wind speed / irradiance resource data up or down
- Q: But... with ±40% adjustment, *what's the point?*
- A: Bias-corrected simulations are surprisingly accurate



Actual / simulated capacity factor

Bias-corrected simulations



Pfenninger and Staffell (2016)

Bias-corrected simulations

Simulating the UK wind fleet: $R^2 = 0.95$





www.renewables.ninja

Goal: provide easy access to our bias-corrected wind and PV simulations.

>650 users from >210 institutions in 60 countries.

Pfenninger and Staffell (2016). *Energy*; Staffell and Pfenninger (2016). *Energy*

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Pfenninger and Staffell (2016), Staffell and Pfenninger (2016)

PART 2

Applications

Application 1:

Net demand impact by increasing PV penetration

Demand net of PV in Germany



Demand net of PV in Germany



Demand net of PV in Germany



Pfenninger and Staffell (2016)

Application 2:

Understanding weather regimes: more stable European wind power

Weather regimes



Grams, Beerli, Pfenninger, Staffell and Wernli. Nature Climate Change (accepted - under press embargo)

Mean EU-wide wind output





Under construction: + 44 GW

Planned: + 93 GW



22

Staffell and Pfenninger (2016). Energy

Balanced deployment of wind



Grams, Beerli, Pfenninger, Staffell and Wernli. Nature Climate Change (accepted - under press embargo)

PART 3

Challenges and lessons learnt

Renewables.ninja provides open data

- Leads to collaboration, and allows unexpected innovation
- Permits more transparent research on the energy transition



WORLD VIEW A personal take on events





Energy scientists must show their workings

Public trust demands greater openness from those whose research is used to set policy, argues **Stefan Pfenninger**.

Extending our initial approach globally is challenging



Site-specific PV generation data gathered so far; work in preparation

But demand for data globally



We are working on globally validated/corrected simulations. Sign up on <u>www.renewables.ninja</u> to be notified when ready.

Thanks for your attention

- Reanalysis works to simulate wind and PV globally, but only if you correct for bias in the weather data.
- Renewables.ninja is a free platform that lets you model wind and solar easily, and get on with your research.
 Global validation in progress and coming soon.
- Making data available allows innovation to happen

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www.renewables.ninja

www.callio.pe

www.pfenninger.org

- Pfenninger and Staffell (2016). Long-term patterns of European PV output using 30 years of validated hourly reanalysis and satellite data. *Energy* 114, pp. 1251-1265. doi: <u>10.1016/j.energy.2016.08.060</u>
- Staffell and Pfenninger (2016). Using Bias-Corrected Reanalysis to Simulate Current and Future Wind Power Output. *Energy* 114, pp. 1224-1239. doi: <u>10.1016/j.energy.2016.08.068</u>
- Pfenninger (2017). Energy scientists must show their workings. Nature 542, 393. doi: <u>10.1038/542393a</u>