

DTU



# The Intersection of Climate and Renewable Energy Research: Successes and Limitations

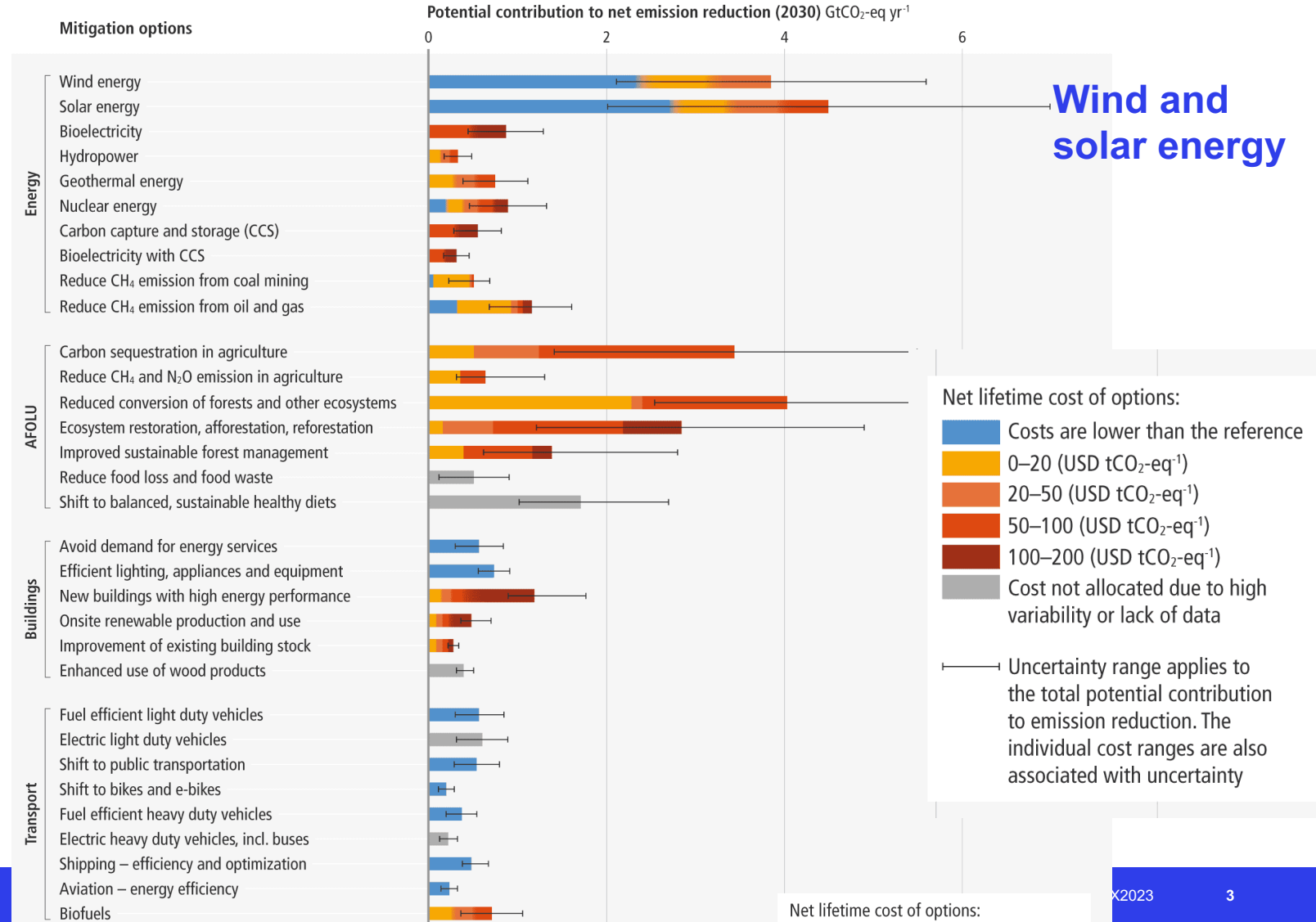
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Technical University of Denmark, Dept of Wind and Energy Systems



# Motivation

Many options available now in all sectors are estimated to offer substantial potential to reduce net emissions by 2030. Relative potentials and costs will vary across countries and in the longer term compared to 2030.

- Harvesting electricity from renewable energy sources is vital in climate change mitigation.
- However, **climate change may influence the conditions in which wind turbines and PV panels operate** and the resources they are designed to harness.
- **Does climate research provide the data so far able to answer these questions?**



# What aspects of the simulated wind climate need to be accurately simulated?

The metrics needed to simulate the power system accurately depend on the application [Sorry. Models are imperfect! 😊]

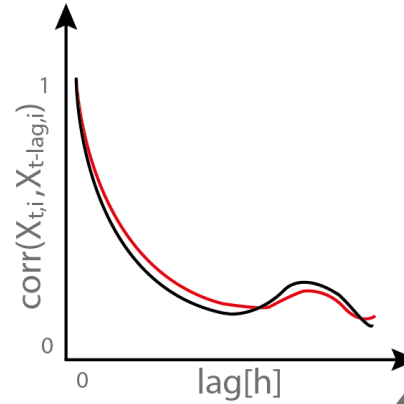
Wind speed and direction distributions ➡ How much energy can a wind farm will produce?

Long-term averages and trends ➡ Would there be enough resources in the future?

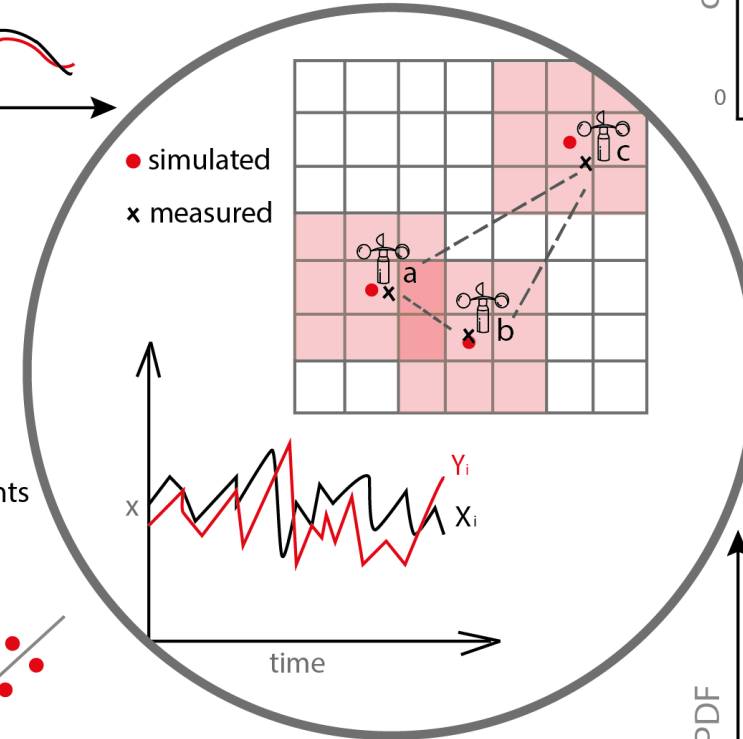
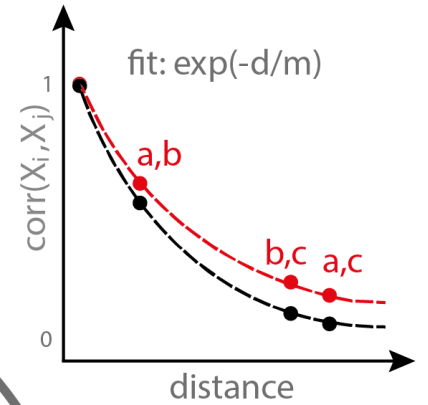
Temporal correlations and auto-correlations ➡ How to design the power system to accommodate weather variability.

Spatial/temporal correlations ➡ Is there enough wind and solar energy to drive the energy system?

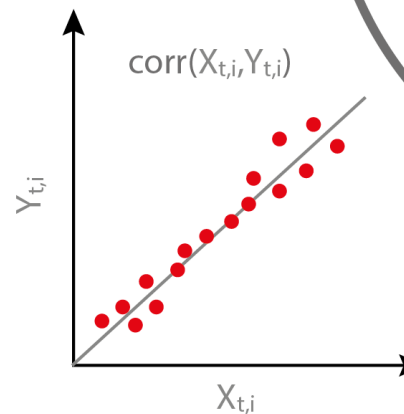
auto-correlation function



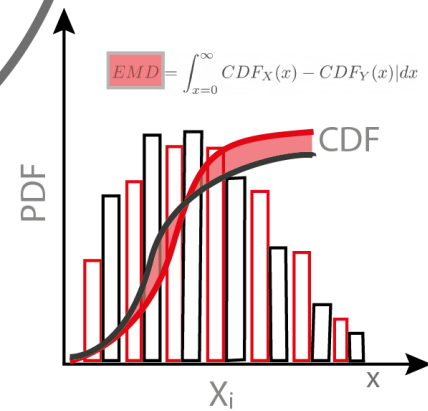
spatial correlation



correlation to measurements



Earth Mover's Distance



Luzia et al (2023)

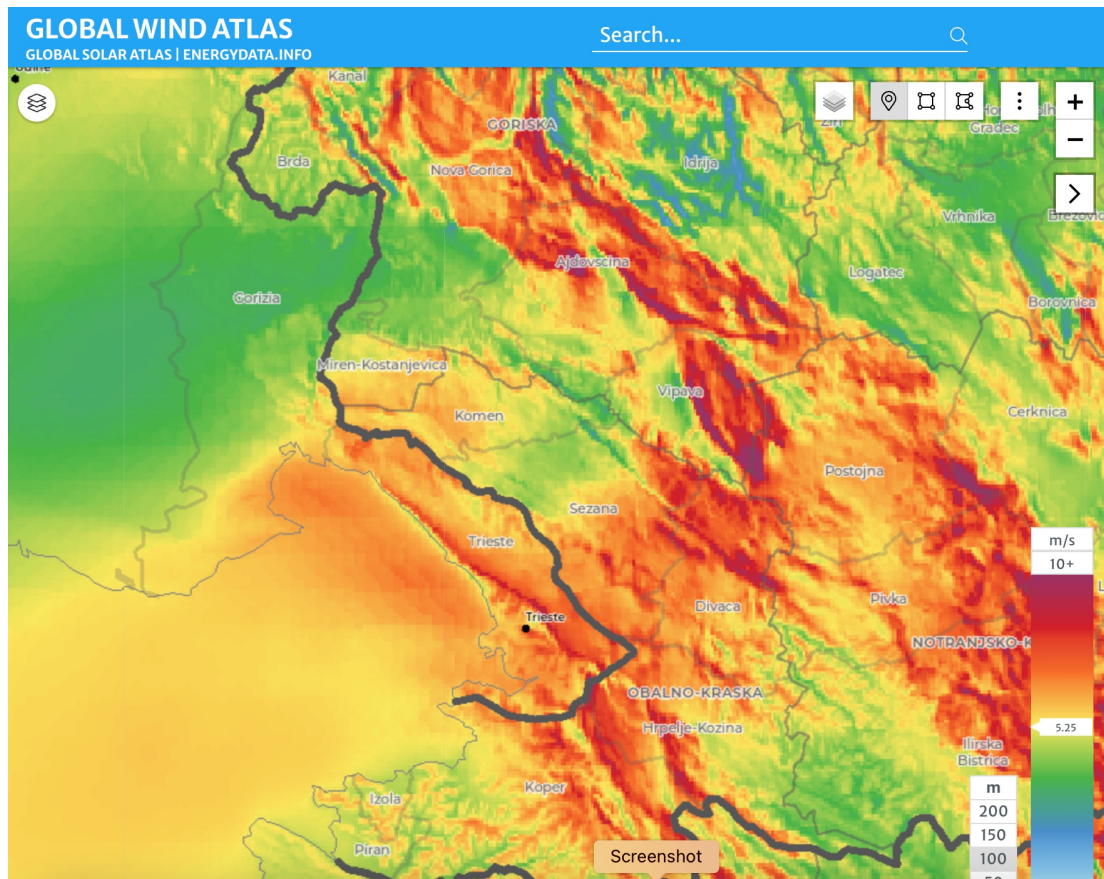
# The wind resources for the past (10-30 years)

Dynamical downscaling

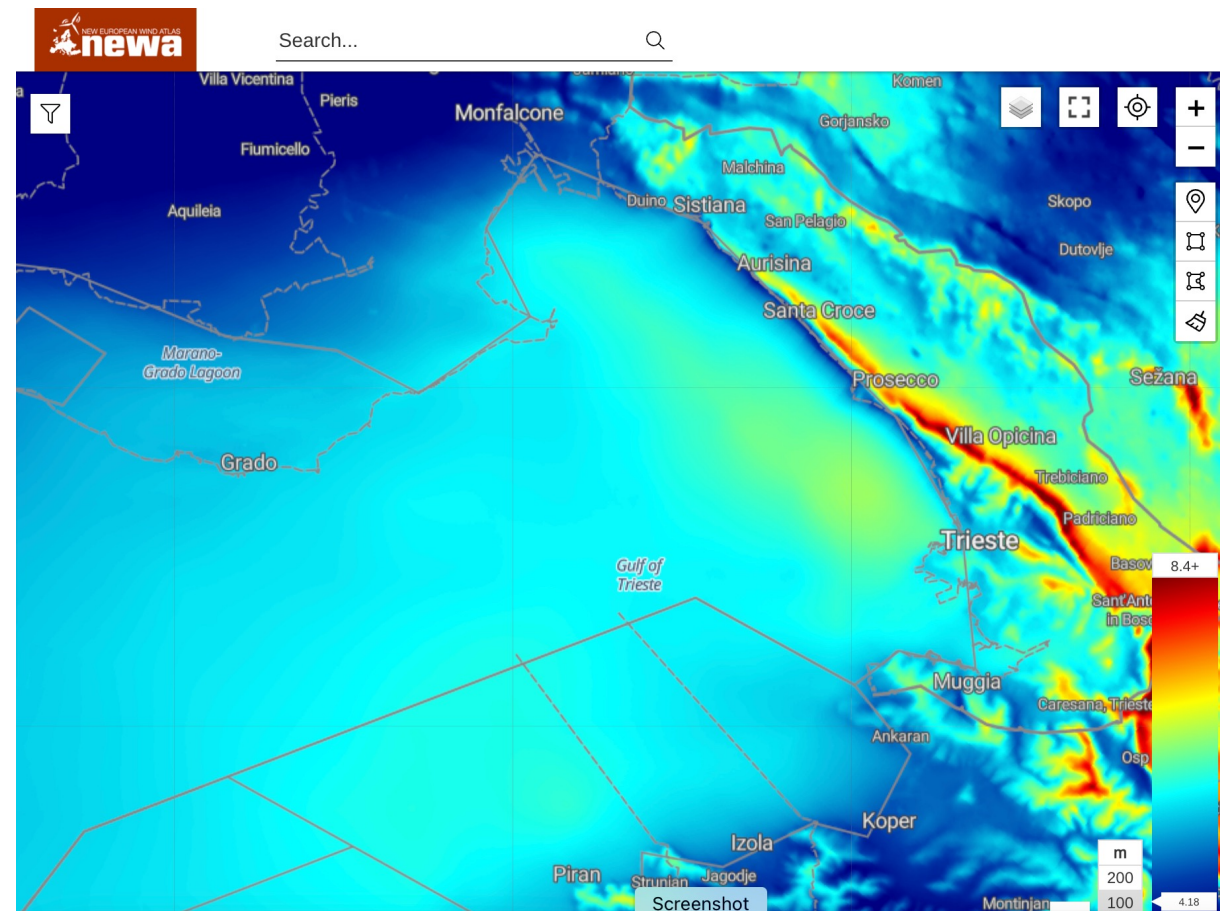
ERA5 forcing (27 km)

WRF downscaling (3 km)

Wind resources WASP flow model 250 m GWA, 50 m NEWA



**The Global Wind Atlas**  
<https://globalwindatlas.info/en>

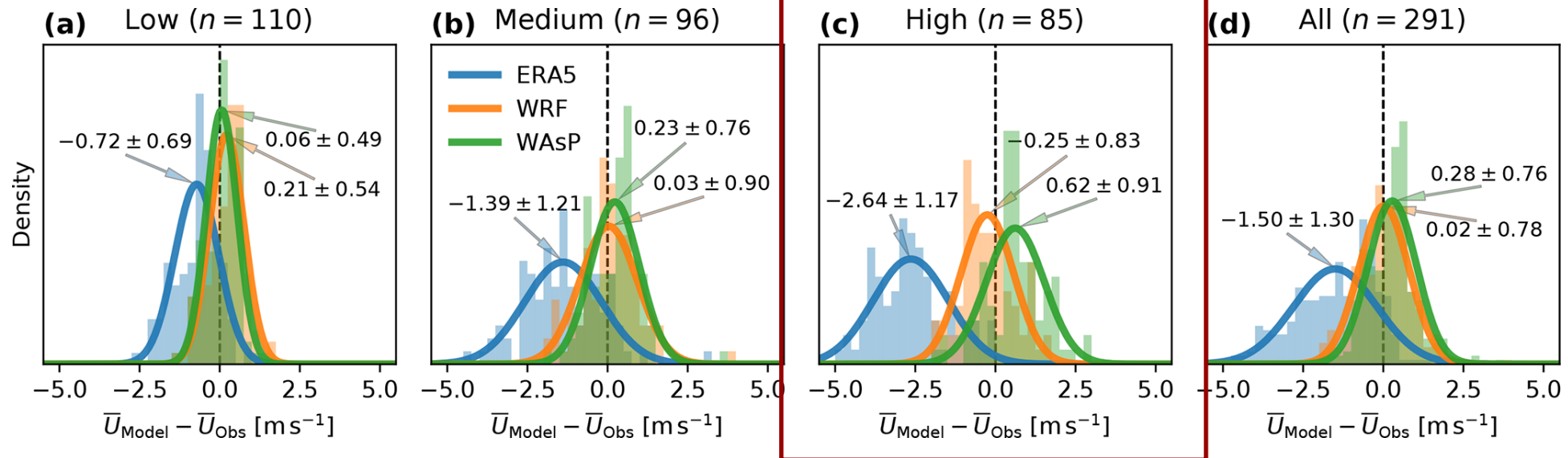


**The New European Wind Atlas**  
<https://map.neweuropeanwindatlas.eu/>

# ERA5, NEWA Validation against 291 tall masts in Europe

ERA5 too low at **complex sites**

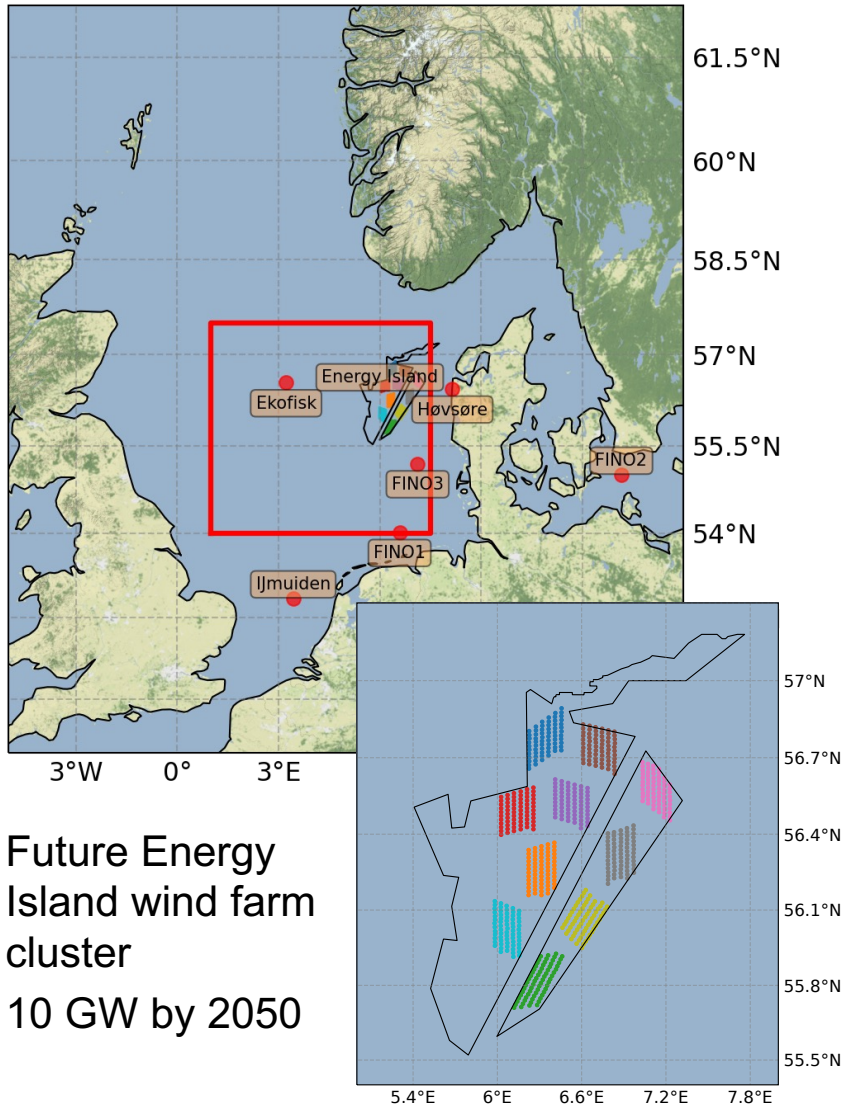
microscale (WAsP) too high due to linearized model



**Figure 9.** Distributions of wind speed biases ( $\bar{U}_{\text{Model}} - \bar{U}_{\text{Obs}}$ ) for ERA5, WRF, and WAsP split by ruggedness index (RIX) category: low (a), medium (b), high (c), and all of the samples combined (d). Fitted normal distributions (lines) are annotated by the mean and standard deviation of the samples ( $\mu \pm \sigma$ ). The number of masts ( $n$ ) in each category is indicated above the subplots.

NEWA, Dörenkämper et al (2020)  
<https://doi.org/10.5194/gmd-13-5079-2020>

# Energy production for the planned North Sea Energy Island

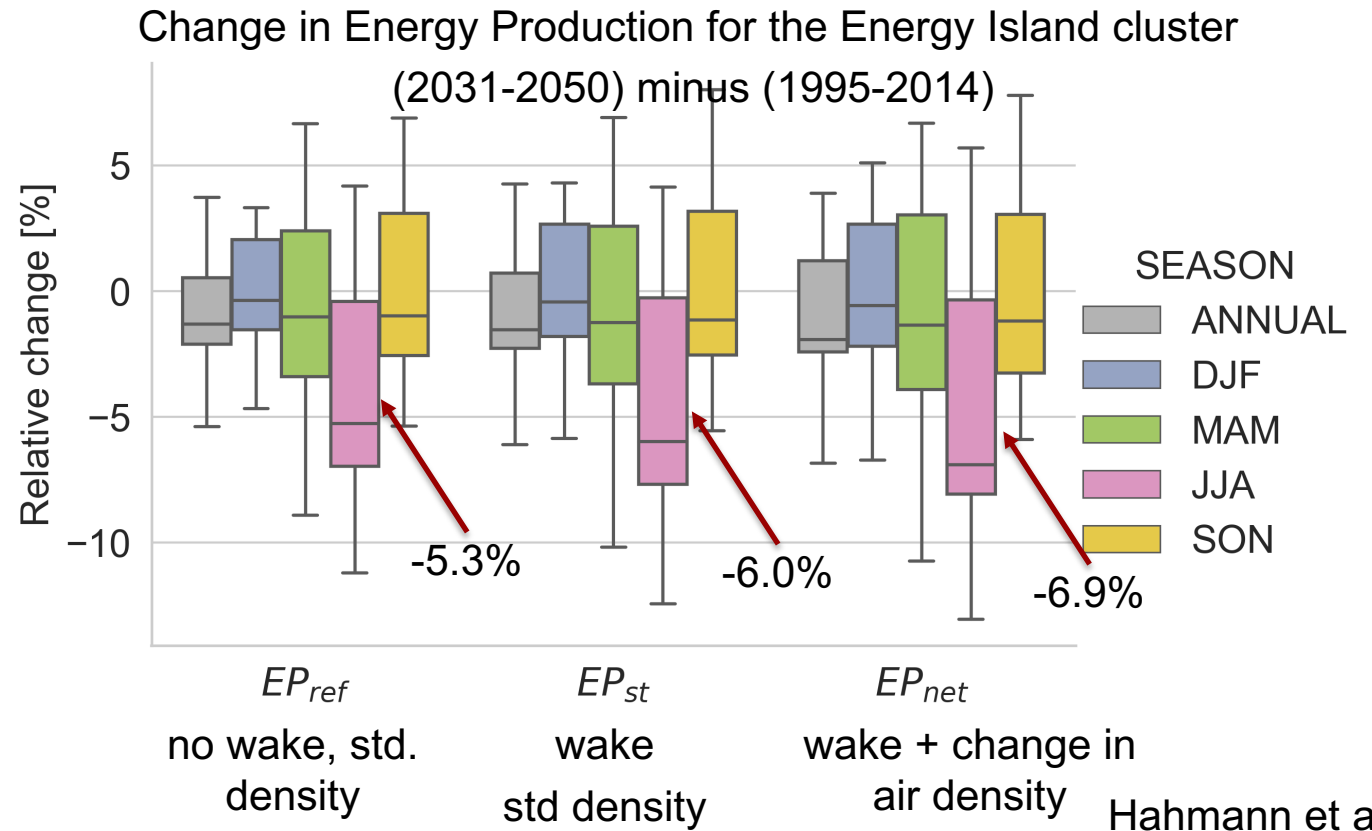


Future Energy Island wind farm cluster  
10 GW by 2050

10 wind farms x 67 turbines x 15 MW reference wind turbine (NREL)

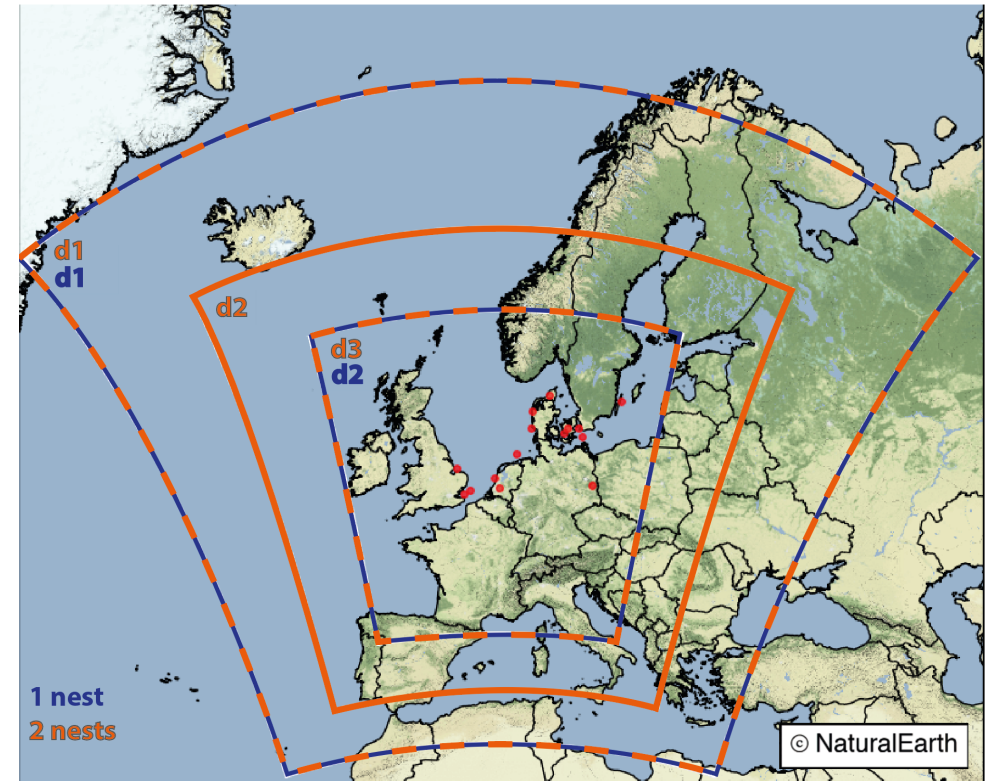
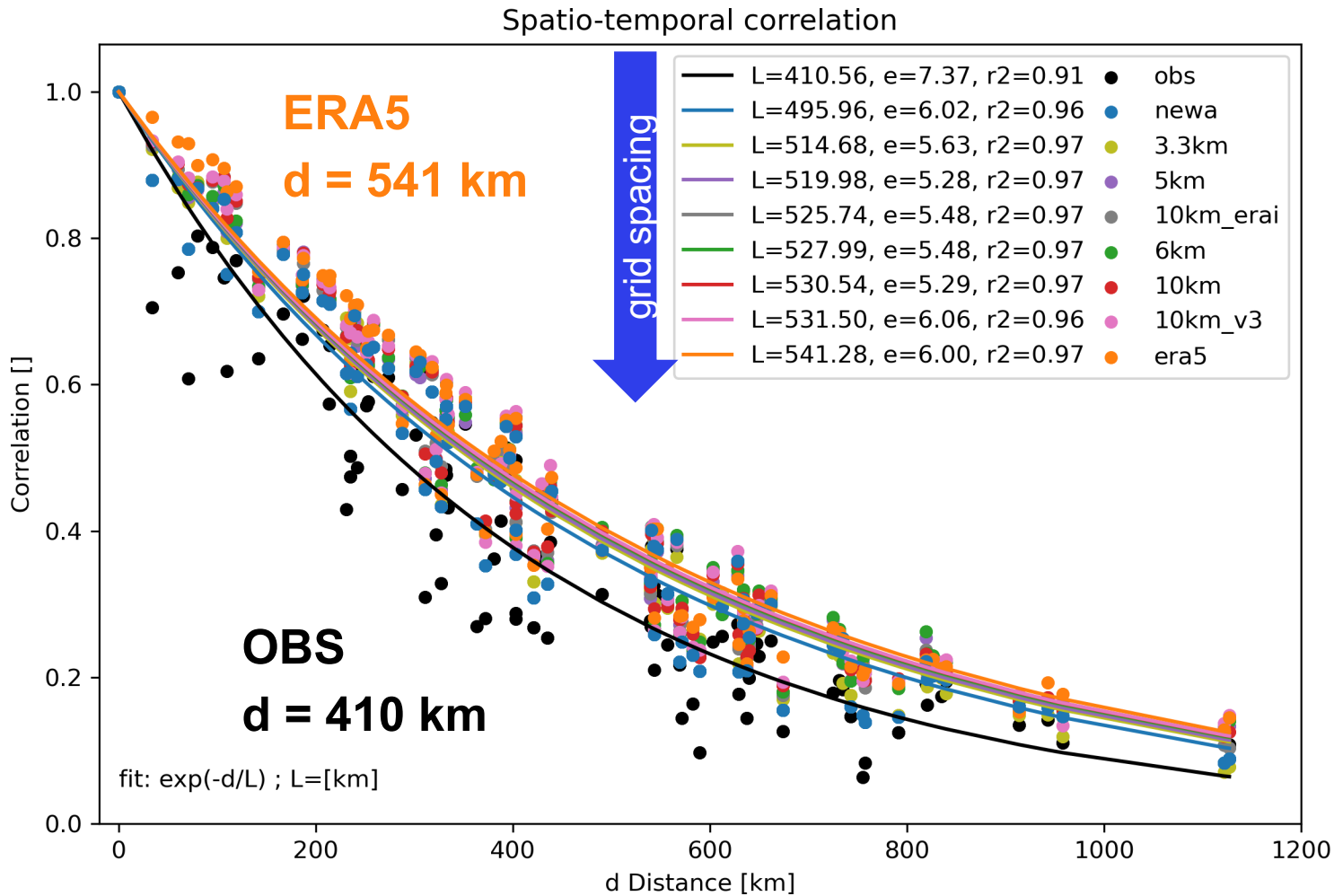
Jensen engineering **wake model**

**Wind speed and direction from 16 CMIP6 models** (AEP within 10% of the value calculated by using ERA5), wind time series at 150 m AMSL



Hahmann et al (2022)

# Spatial correlations, the effect of model resolution



Correlation between pairs of wind speed points (hourly data), Observations and models  
 Plotted here as a function of the distance between the points

Luzia et al (2022)



# Validation of Euro-CORDEX simulations against wind power generation

**Table 1**

Details of the EURO-CORDEX climate simulations. Heights are the number of heights above ground level: a combination of near-surface (10 m) with either one (100 m) or five (50, 100, 150, 200 and 250 m) fixed levels of wind speed, according to the ESGF availability for each model. For models with more than one available scenario, the bold RCP name indicates the representative model used in the validation.

Forcing GCM/ESM	RCM	Short name	Experiments	Heights	References
CNRM-CERFACS-CNRM-CM5 <sup>a</sup>	ALADIN63 <sup>b</sup>	CNRM_A	<b>RCP2.6</b> , RCP8.5	6 levels	<sup>a</sup> [41], <sup>b</sup> [42],
MOHC-HadGEM2-ES <sup>c</sup>	ALADIN63	MOHC_A	RCP8.5	6 levels	<sup>c</sup> [43]
NCC-NorESM1-M <sup>d</sup>	ALADIN63	NCC_A	RCP8.5	6 levels	<sup>d</sup> [44]
CNRM-CERFACS-CNRM-CM5	RegCM4-6 <sup>e</sup>	CNRM_R	RCP8.5	2 levels	<sup>e</sup> [45]
ICHEC-EC-EARTH <sup>f</sup>	RegCM4-6	ICHEC_R	RCP8.5	2 levels	<sup>f</sup> [46]
MPI-M-MPI-ESM-LR <sup>g</sup>	RegCM4-6	MPI_R	<b>RCP2.6</b> , RCP8.5	2 levels	<sup>g</sup> [47]
NCC-NorESM1-M	RegCM4-6	NCC_R	<b>RCP2.6</b> , RCP8.5	2 levels	

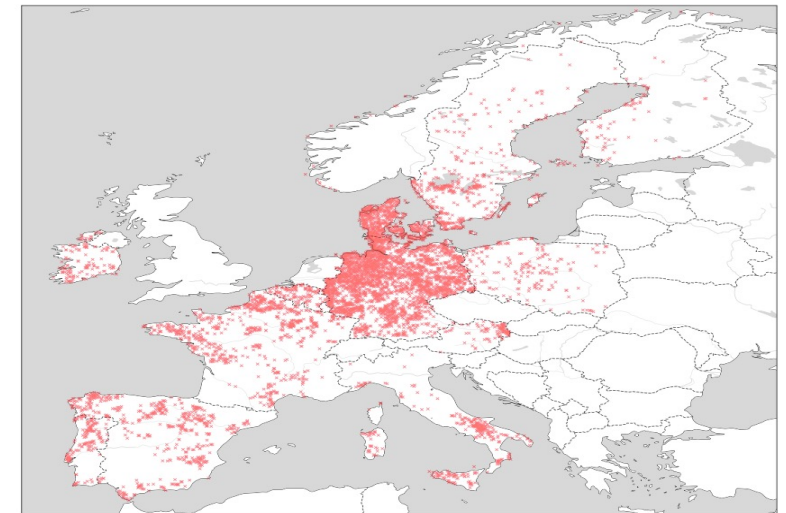
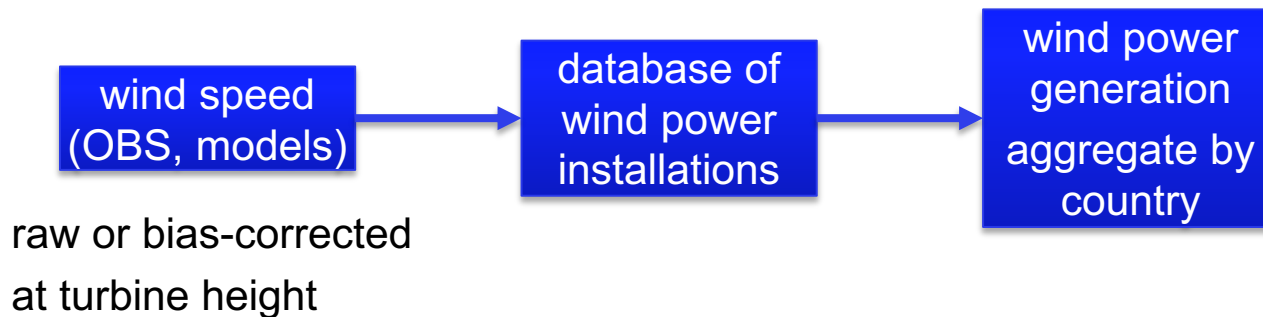
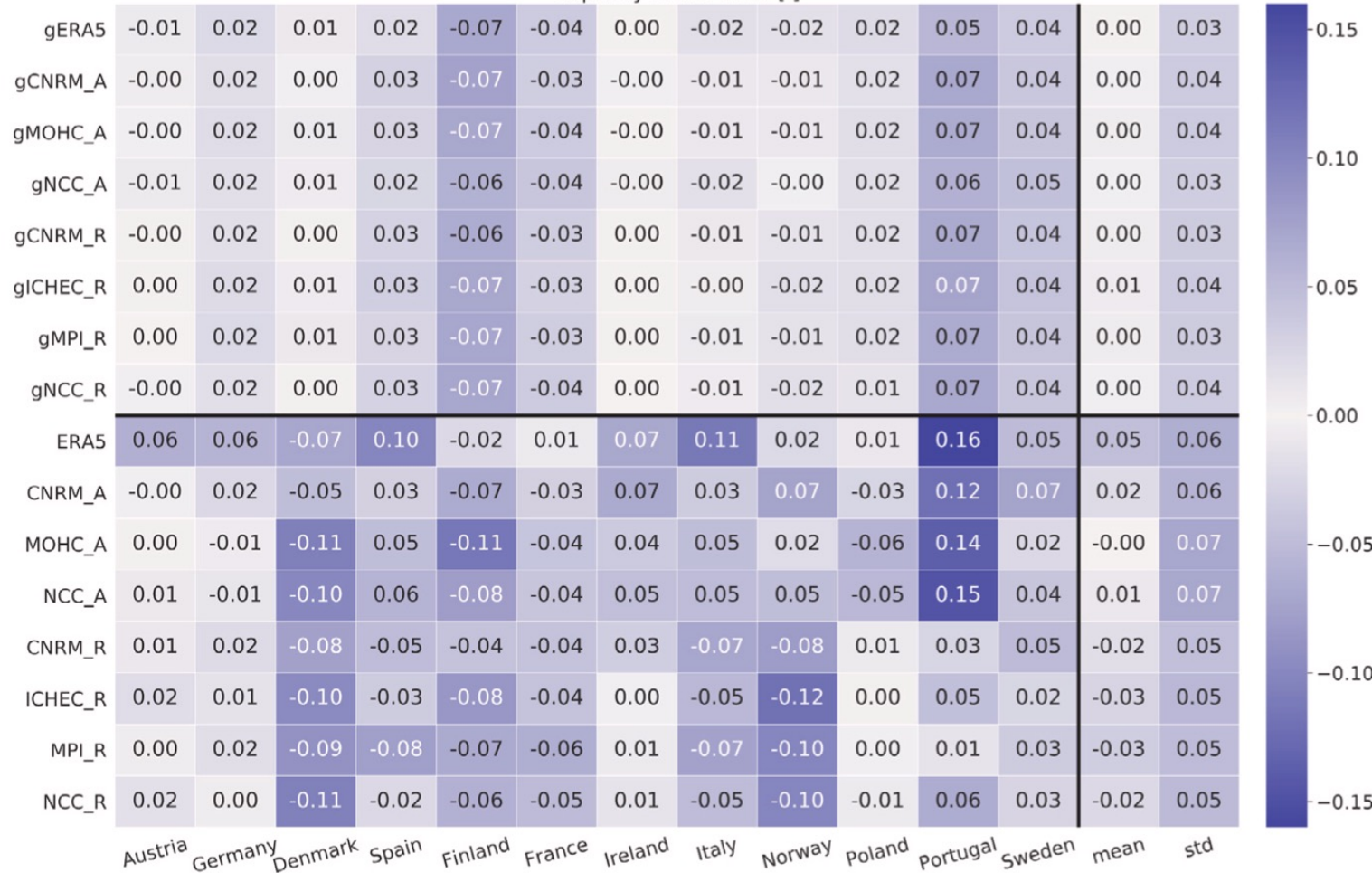


Fig. 2. Location of wind power plants operating in 2018.



Luzia et al (2023)

Capacity factor error [ % ]



Capacity factor =  
Energy  
Produced/Energy  
produced at full  
operation

Bias corrected

uncorrected

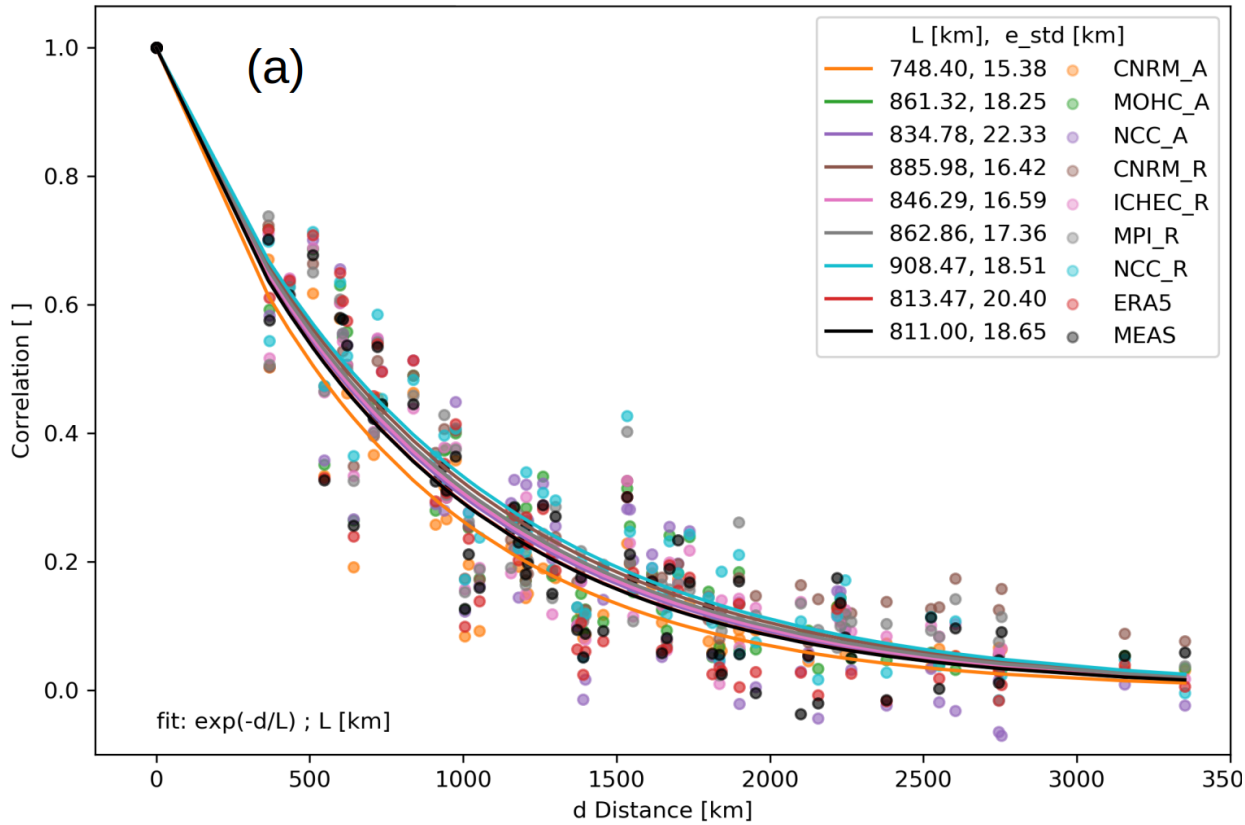
Capacity factor (CF) error computed by the difference measured minus simulated CF for all 12 European countries and ERA5 and EURO-CORDEX models. GWA2 scales the top 7 models (names starting with “g”).

The last two columns show the mean and the standard deviation for all countries.

Luzia et al (2023)

# Spatial correlations in the Euro-CORDEX models

## Wind power generation (measurements vs models), 12 countries



Luzia et al (2023)

wind speed  
(OBS, models)

↓  
database of  
wind power  
installations

↓  
wind power  
generation  
aggregate by  
country

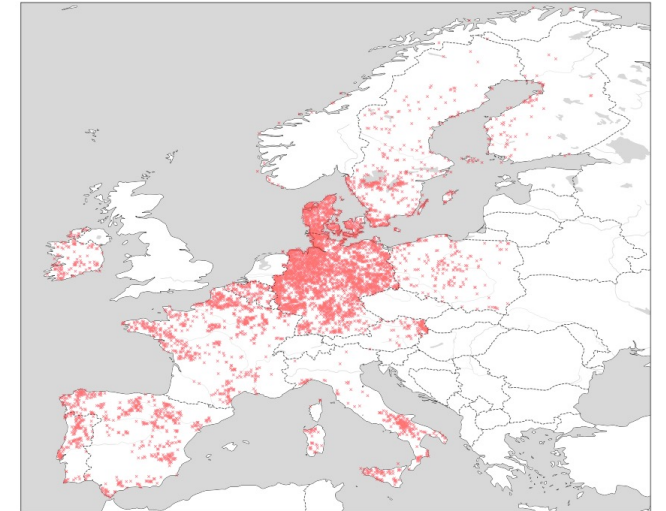


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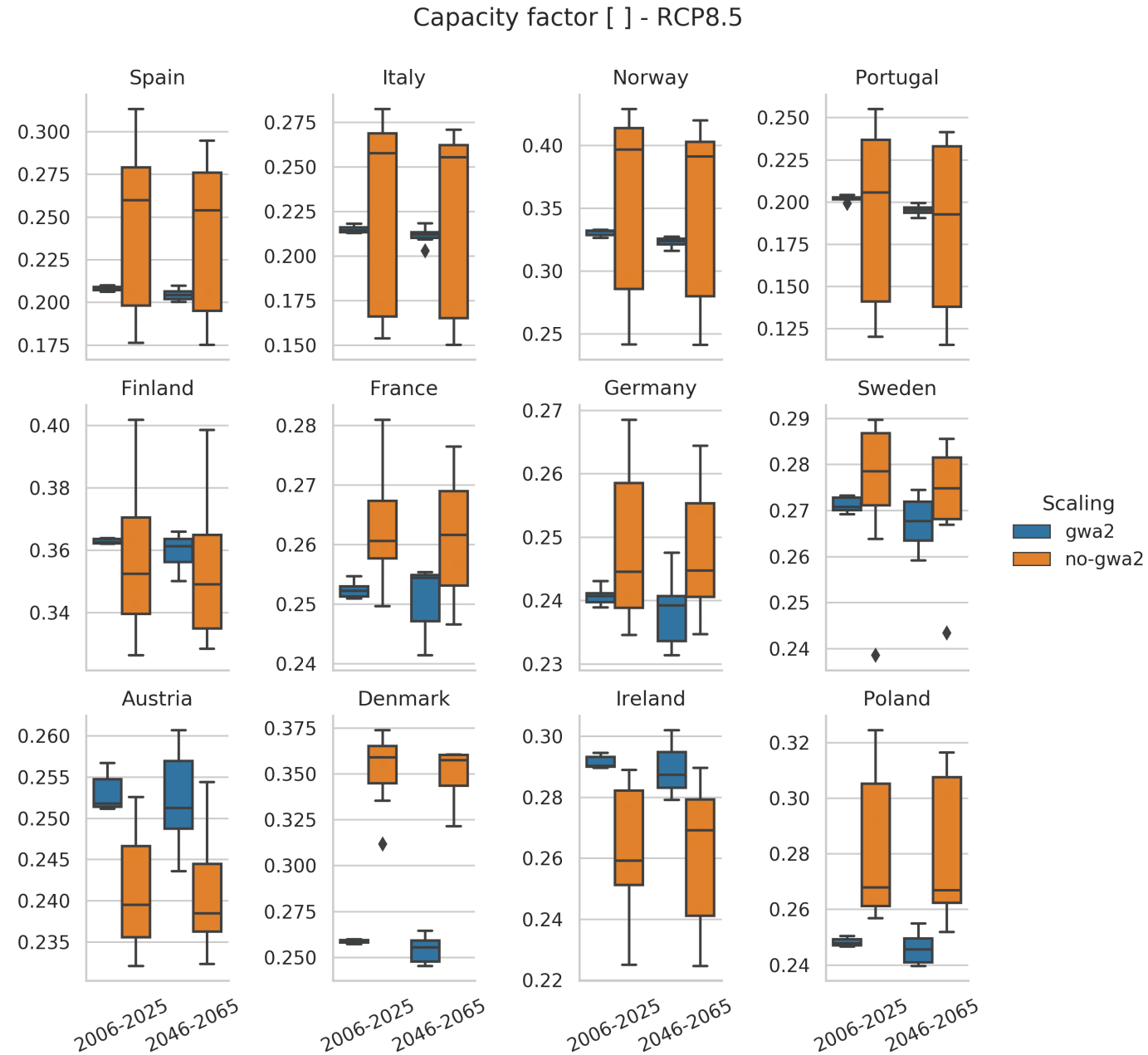
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# The future of energy production in Europe according to CORDEX

Raw versus bias-corrected (using Global Wind Atlas wind speeds); 2006-2025 compared to 2046-2065

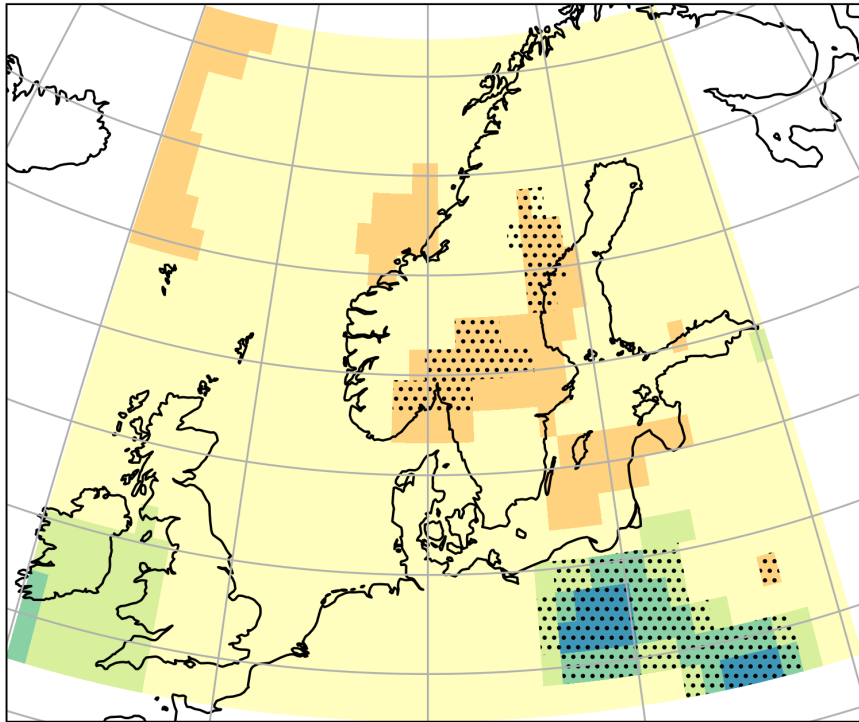


# Final thoughts...

- Extrapolating wind speeds from 10 meters to turbine height using a constant exponent power law is a poor approximation and will often exaggerate future changes in wind resources. **Please include at least the wind speed and direction at 100 m in the new CORDEX runs.**

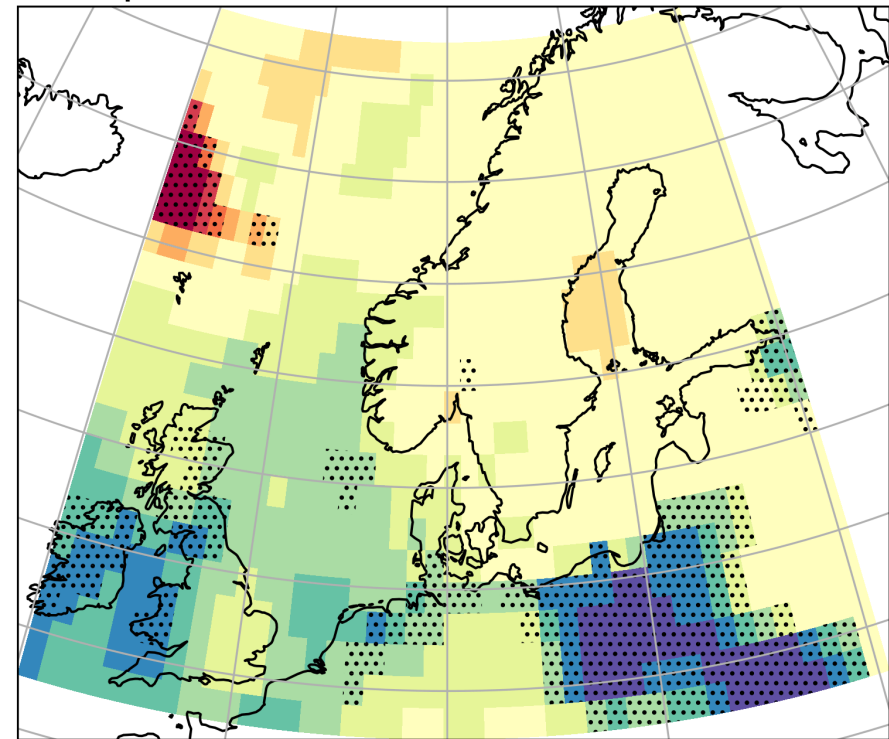
# Wind Extrapolation, future – past wind speed, 100 m

mean wind speed, h=100m  
ssp585 - historical; MPI-ESM1-2-HR



**Interpolation** from  
model levels

mean wind speed, h=100m (PL)  
ssp585 - historical; MPI-ESM1-2-HR



**Vertical extrapolation**  
from wind speed at 10-  
meters

$$U_{100} = U_{10} \left( \frac{100}{10} \right)^\alpha$$

where  $\alpha = 1/7$

# Final thoughts...

- Extrapolating wind speeds from 10 meters to turbine height using a constant exponent power law is a poor approximation and will often exaggerate future changes in wind resources. **Please include at least the wind speed and direction at 100 m in the new CORDEX runs.**
- The **full chain of models** is necessary to understand the effects of climate change on future power generation. Simple approximations are often misleading.
- Wind speeds from CORDEX represent the power generation in Europe very well when biased-corrected using the GWA (other studies also). **But more models and scenarios are needed.**
- Other variables are also used in power system models, including solar PV, electric & heat demand and hydropower simulation.

# References

- N. N. Davis, et al. “The Global Wind Atlas: A High-Resolution Dataset of Climatologies and Associated Web-Based Application”. *Bull of the American Meteorological Society* 104 (2023): 1507–1525.
- G. Luzia, M. J. Koivisto, A. N. Hahmann. “Validating EURO-CORDEX climate simulations for modelling European wind power generation”. *Renewable Energy* 217 (2023): 118989.  
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- A. N. Hahmann, O. Garcia-Santiago, A. Peña. “Current and future wind energy resources in the North Sea according to CMIP6”. *Wind Energy Science* 7, no. 6 (2022): 2373–2391. <https://wes.copernicus.org/articles/7/2373/2022/>.
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- M. Dörenkämper, et al. “The Making of the New European Wind Atlas – Part 2: Production and evaluation”. *Geoscientific Model Development* 13, no. 10 (2020): 5079–5102.  
<https://gmd.copernicus.org/articles/13/5079/2020/>.
- A. N. Hahmann, et al. “The making of the New European Wind Atlas – Part 1: Model sensitivity”. *Geoscientific Model Development* 13, no. 10 (2020): 5053–5078. <https://gmd.copernicus.org/articles/13/5053/2020/>.