

# Balancing Europe's wind power output through spatial deployment informed by weather regimes

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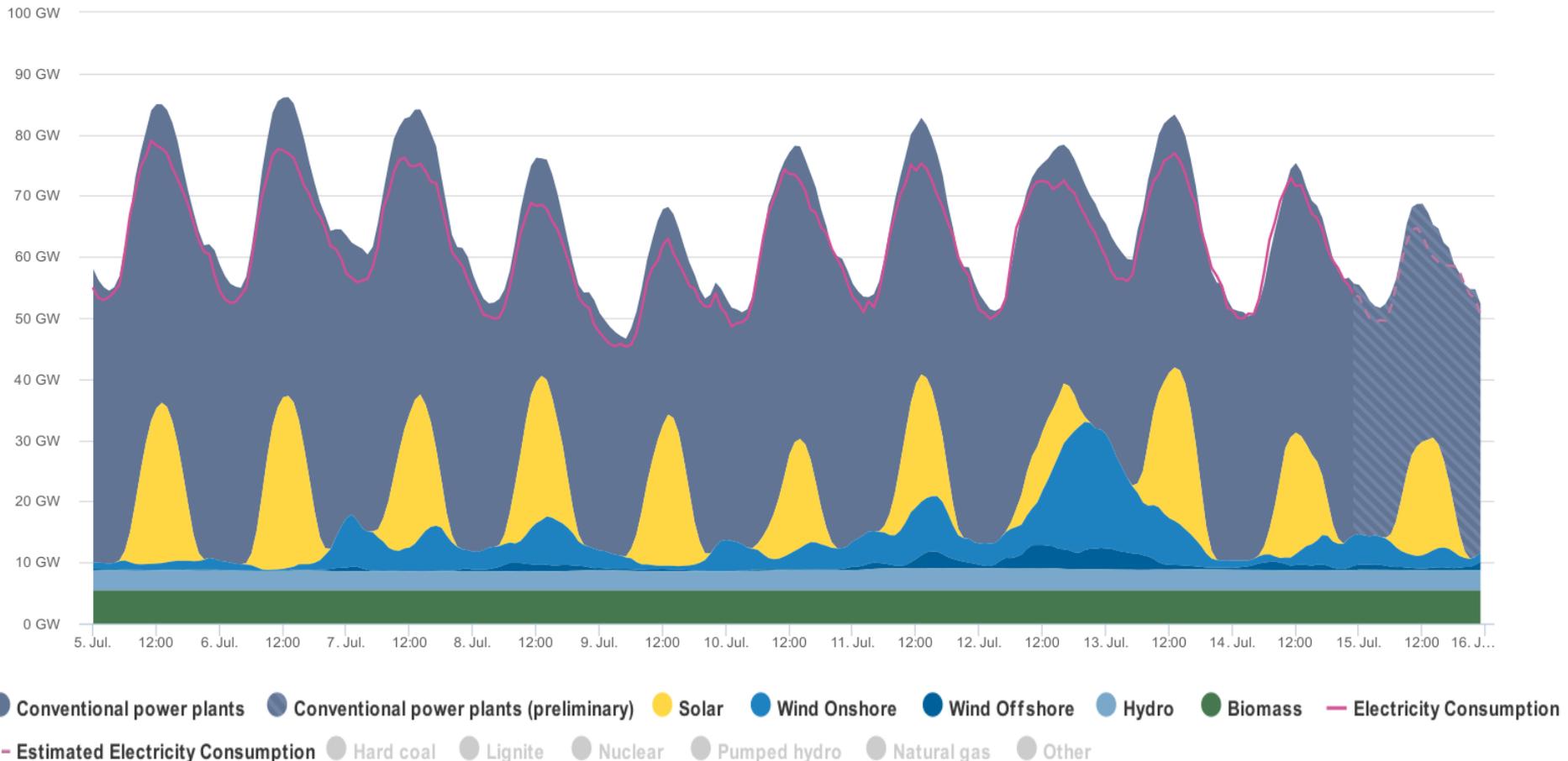
\*\*now at Axpo Trading, Baden, Switzerland

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# Electricity generation

## short-range variability (hours – days)

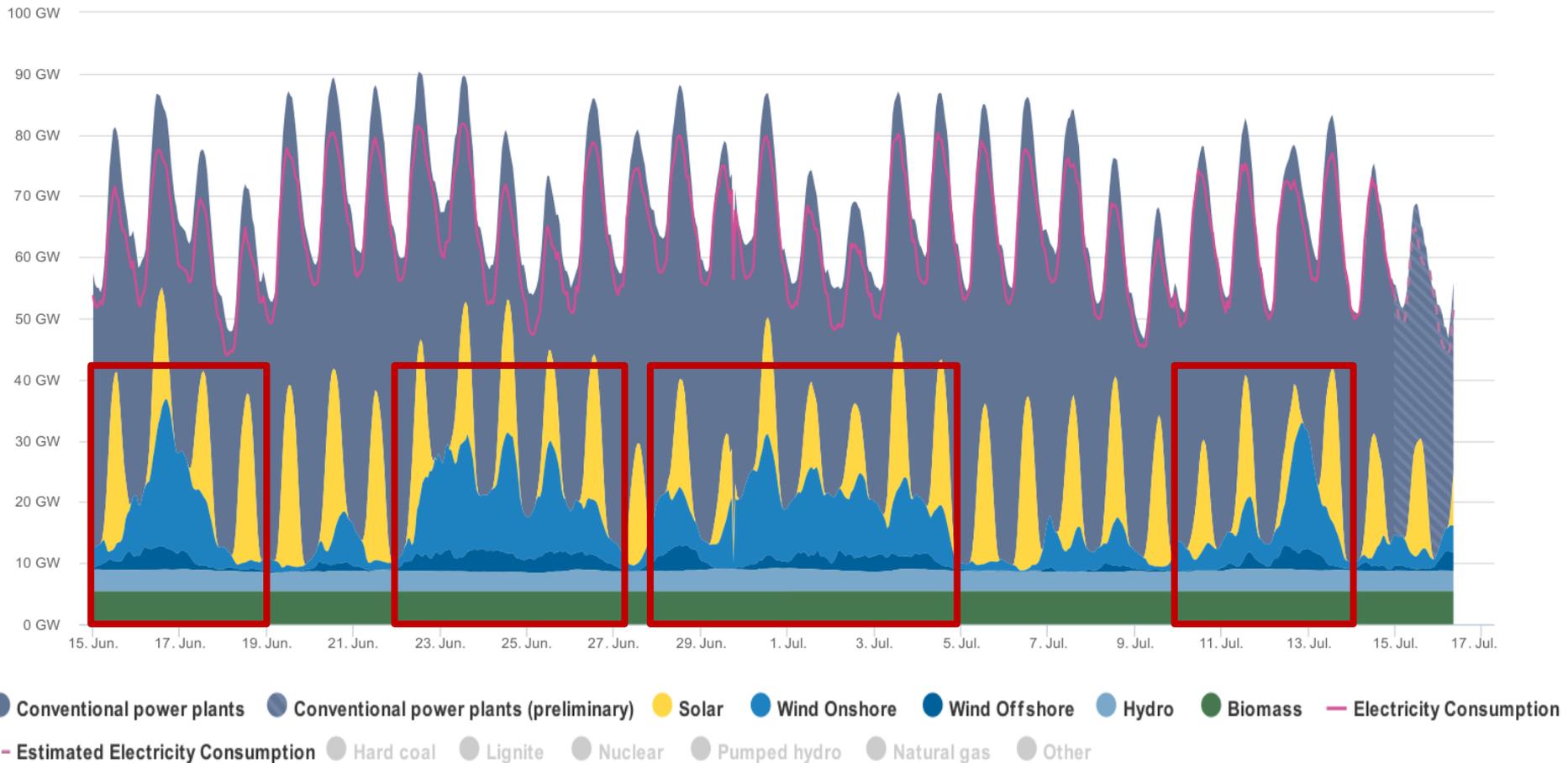
- Generation mix for Germany 5.-15. July 2017



# Electricity generation

## multi-day variability (days – weeks)

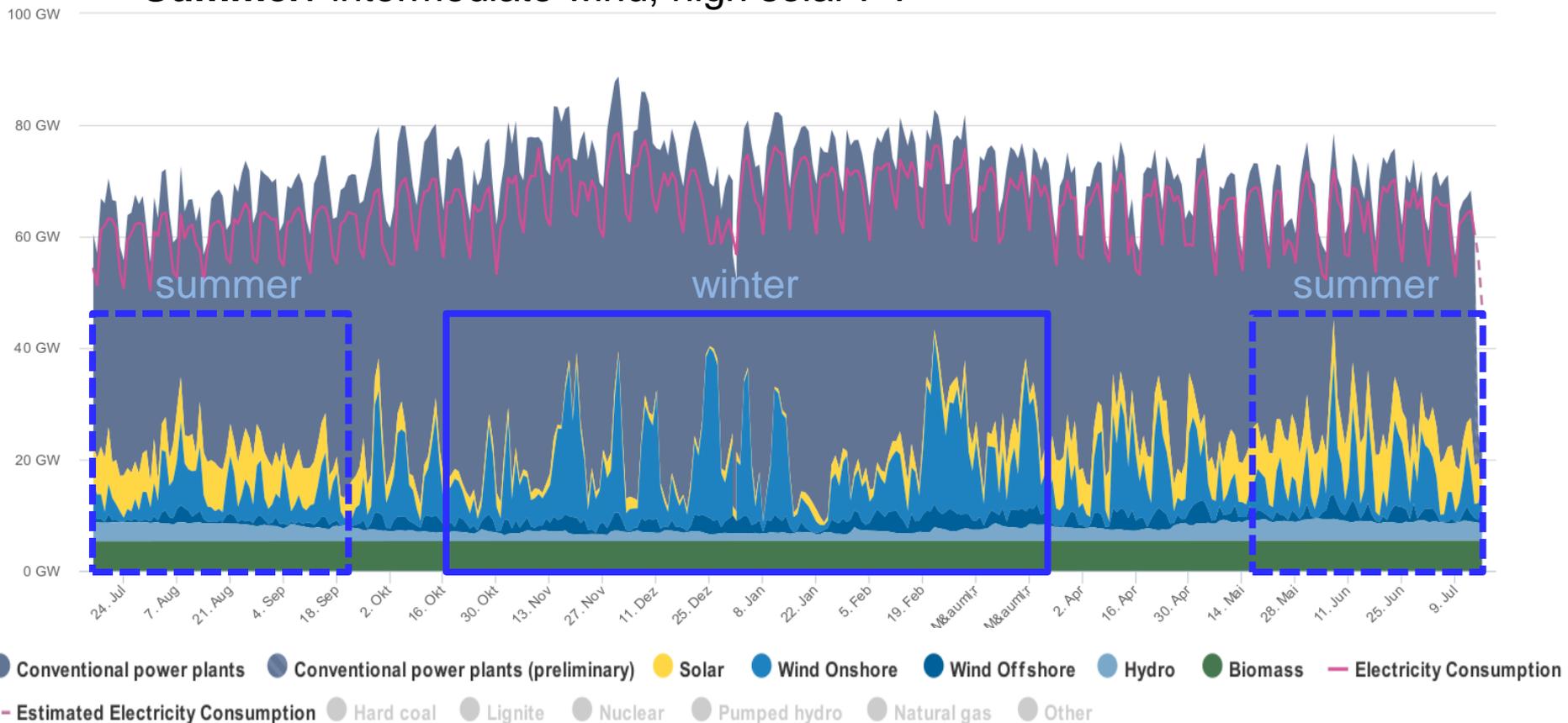
- Generation mix for Germany 15. June - 16. July 2017



# Electricity generation

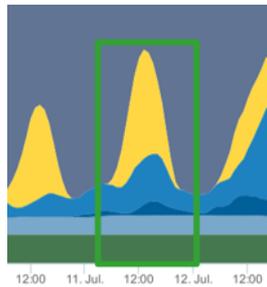
## seasonal variability (months)

- Generation mix for Germany 15. July 2016 - 16. July 2017
- **Winter:** high wind, low solar PV
- **Summer:** intermediate wind, high solar PV



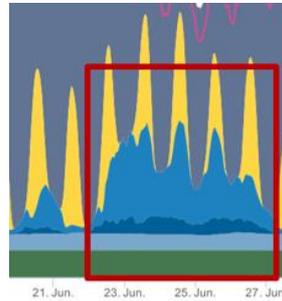
# Atmospheric variability and wind power

## short-range variability (hours – days)



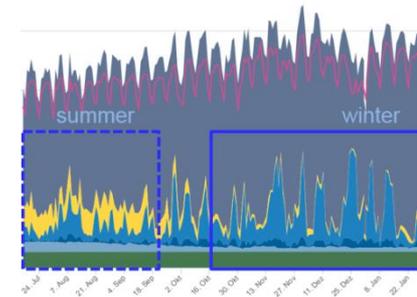
- Diurnal cycle
- local clouds
- thunderstorms

## multi-day variability (days – weeks)



- Weather systems
- continent-scale **weather regimes**

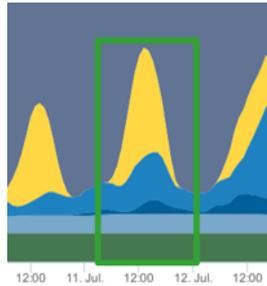
## seasonal variability (months)



- seasonal cycle

# Power output variability

## short-range variability (hours – days)



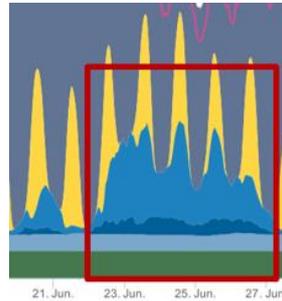
- $\Delta P=0-30$  GW
- often matches peak demand



www.raonline.ch

Storage and flexible demand

## multi-day variability (days – weeks)

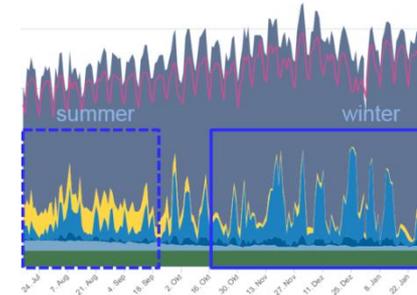


- $\Delta P=10-40$  GW
- strong ramps
- longlasting
- Irregular occurrence



Large-scale storage  
not available currently!

## seasonal variability (months)



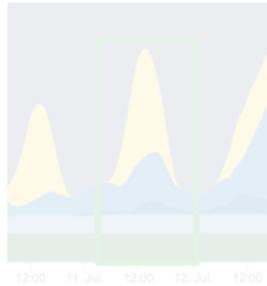
- $\Delta P=10-50$  GW
- Regular seasonal anti-correlation of wind and solar power



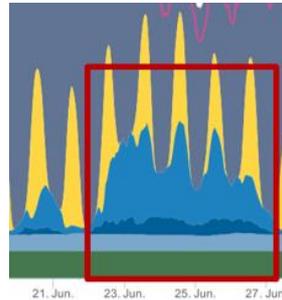
Co-deployment of wind and solar PV

# Scope of the study

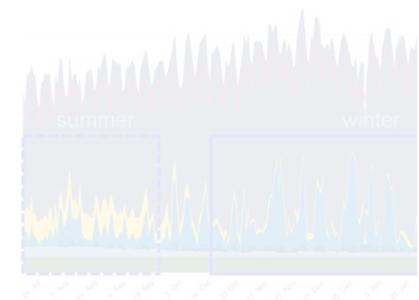
short-range variability  
(hours – days)



multi-day variability  
(days – weeks)



seasonal variability  
(months)



- $\Delta P=0-30$  GW
- often match peak demand

How do continent-scale weather regimes affect multi-day variability of wind and solar PV power output?

- 0-50 GW
- low seasonal correlation of wind and solar power



Storage and flexible demand



Large-scale storage not available!

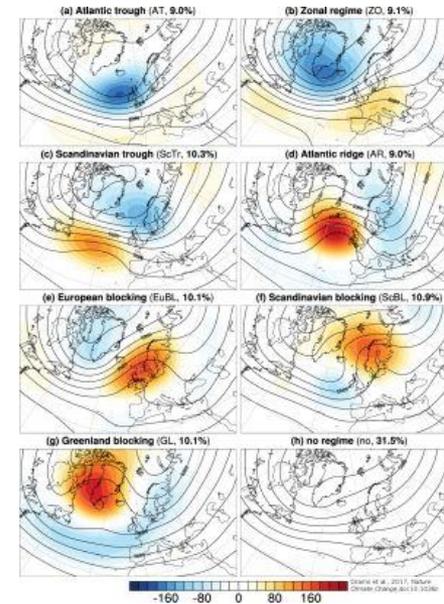


Co-deployment of wind and solar PV

# Approach

- year-round Atlantic-European weather regimes
- Six-hourly data based on ERA-Interim (1979-2016)

Grams et al. (2017), [doi:10.1038/nclimate3338](https://doi.org/10.1038/nclimate3338)



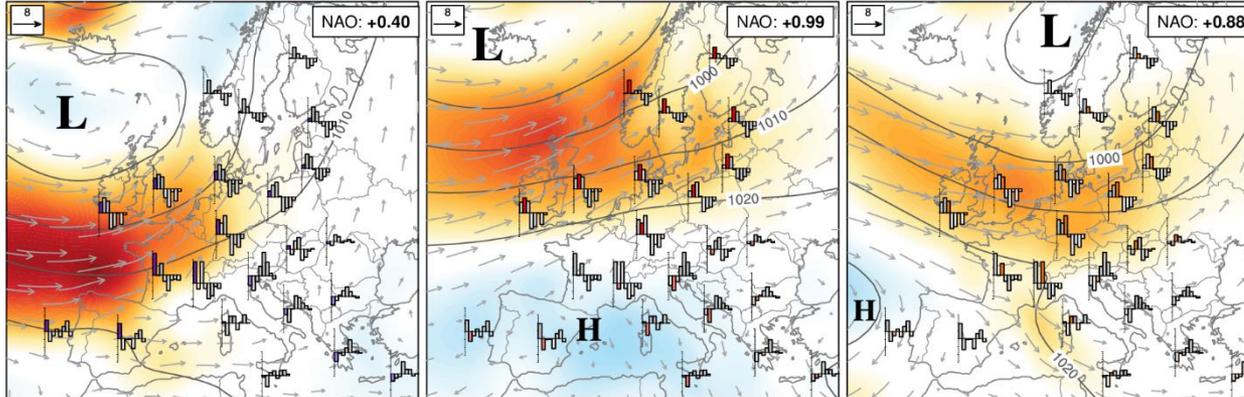
- Country-aggregated wind and solar PV capacity factors  $CF$
- Hourly data based on calibrated [Renewables.Ninja](https://renewables.ninja/) (1985-2016)

Pfenninger et al. (2016), [doi: 10.1016/j.energy.2016.08.060](https://doi.org/10.1016/j.energy.2016.08.060)

Staffell et al. (2016), [doi: 10.1016/j.energy.2016.08.068](https://doi.org/10.1016/j.energy.2016.08.068)

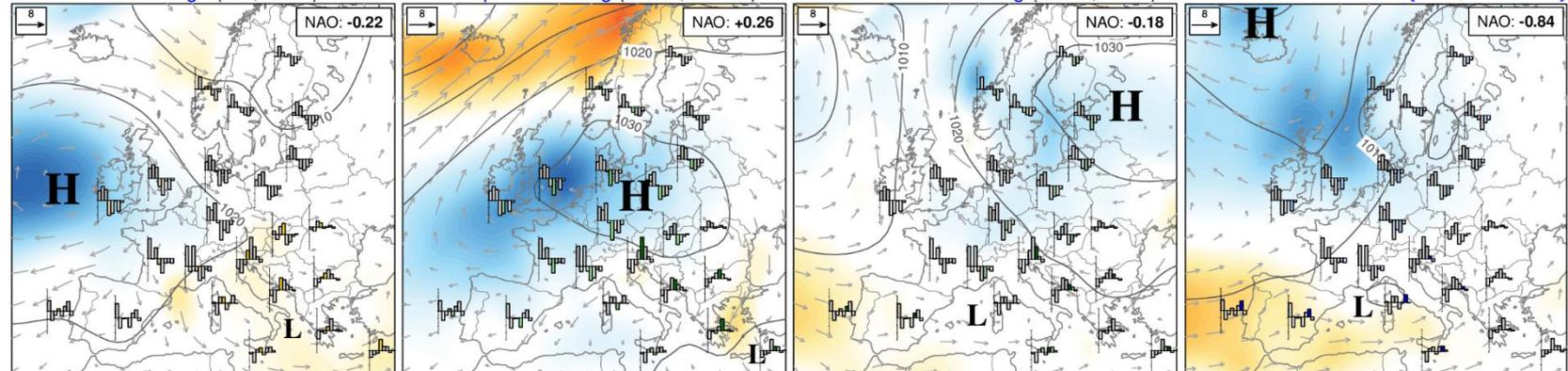
# Modulation of 100 m wind by weather regimes

Atlantic trough (AT, 13.1%)    Zonal regime (ZO, 13.8%)    Scand. Trough (ScTr, 11.3%)



Cyclonic

Atlantic trough (AR, 9.7%)    Eu. Blocking (EuBL, 10.9%)    Sc. Blocking (ScBL, 6.5%)    Greenland BI. (GL, 11.7%)

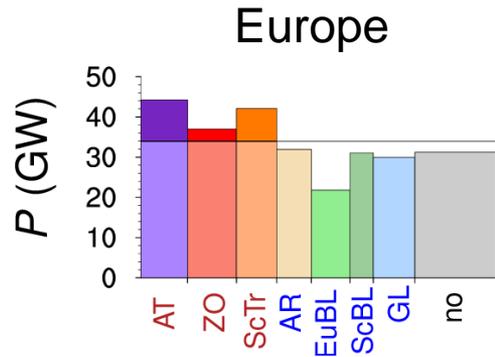


Blocked



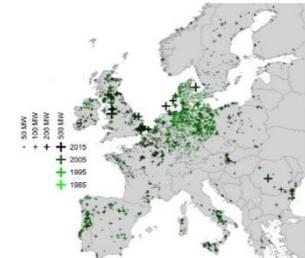
- mean 100 m wind speed anomalies wrt. winter mean for all times attributed to one of the seven weather regimes

# Regimes with strongest impact on wind power



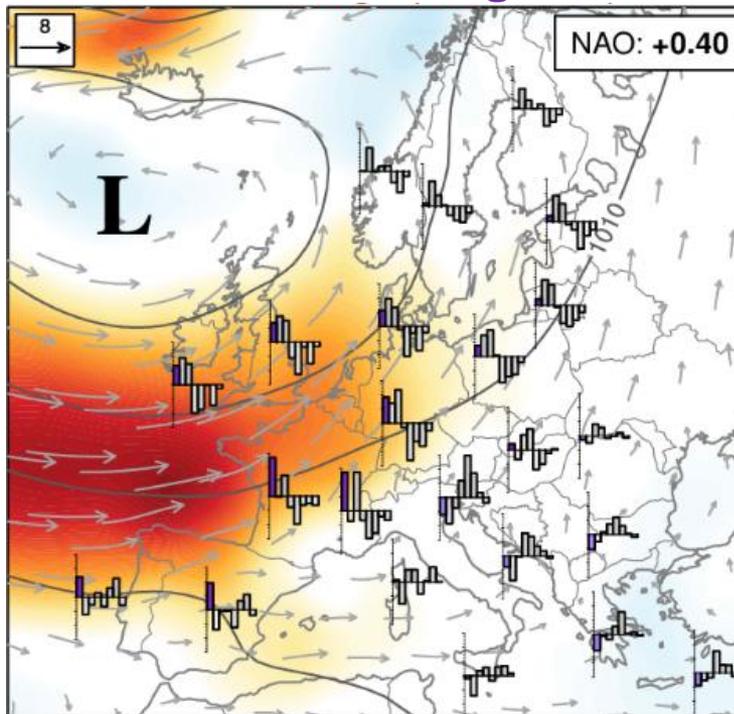
Winter mean: 34 GW

AT: 44 GW (+10 GW)  
 EuBL: 22 GW (-12 GW)

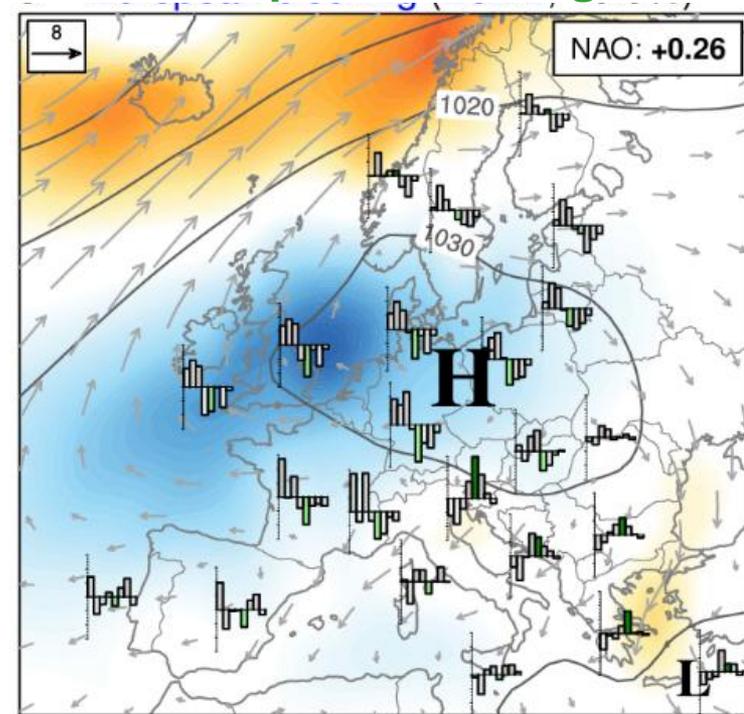


**Difference of 22 GW (65% of mean production)**

## Atlantic trough



## European Blocking

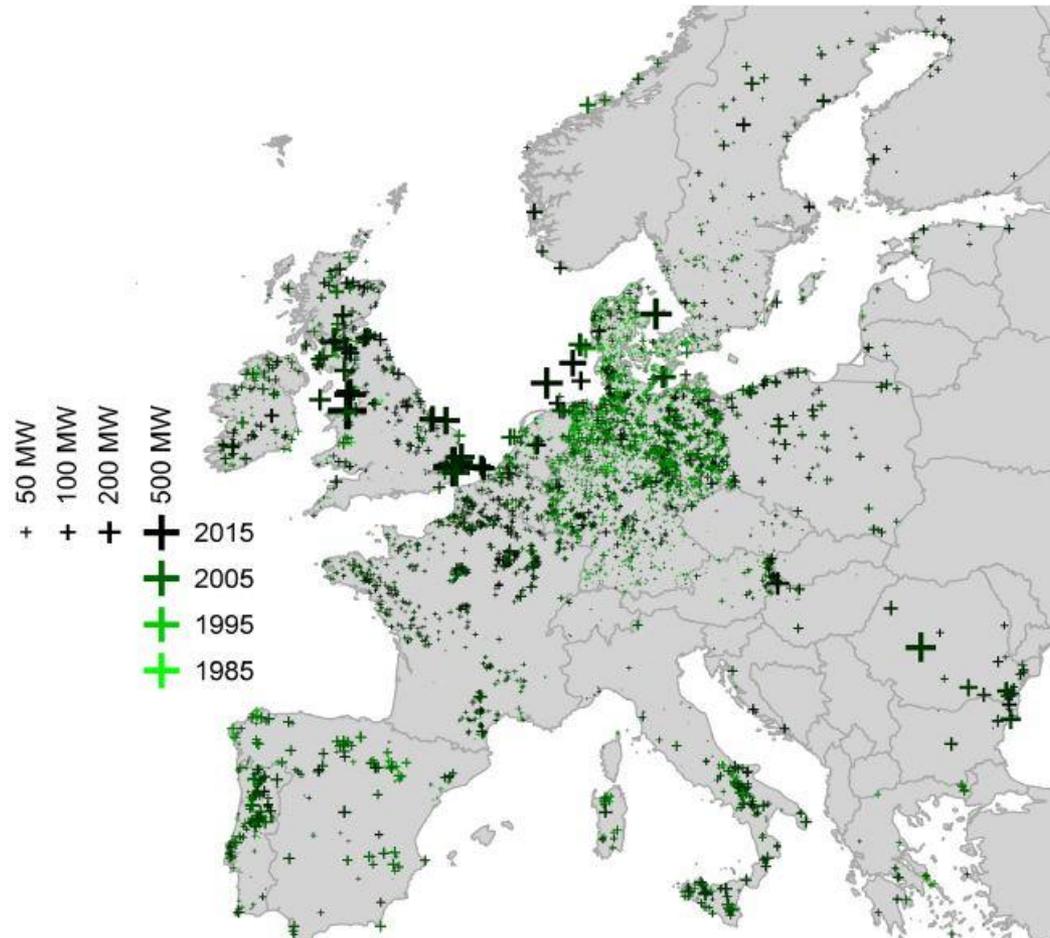


100 m wind



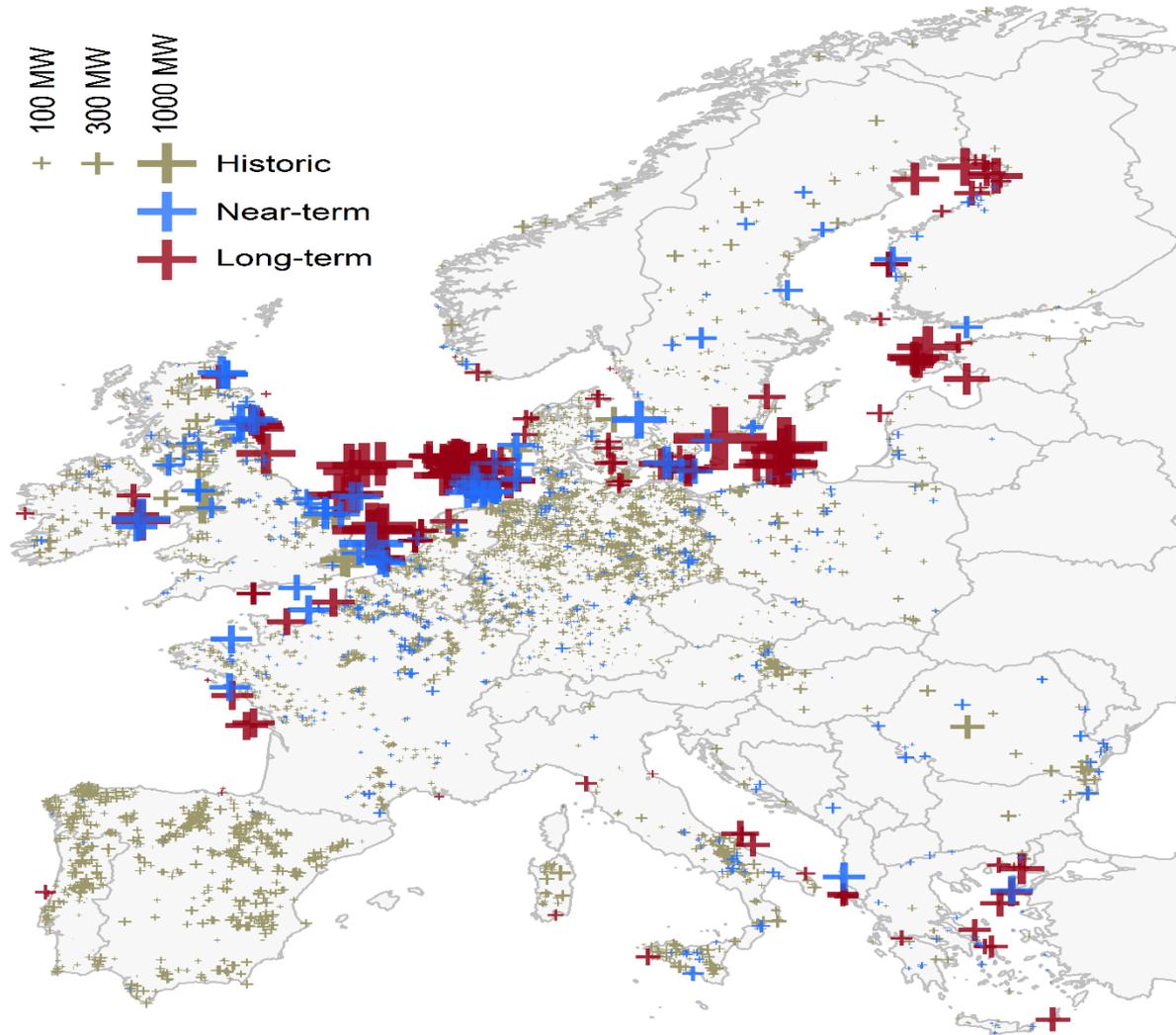
(m s<sup>-1</sup>)

# Installed wind farms (2015)



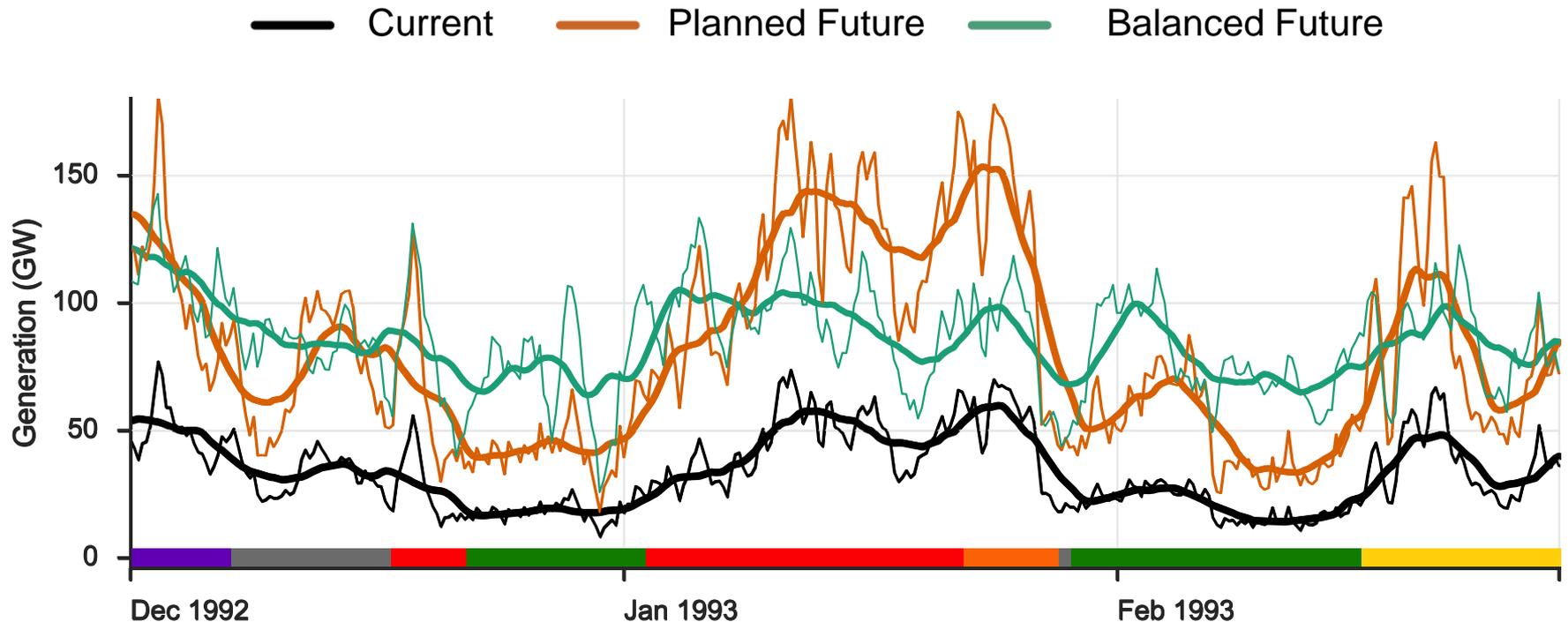
- Heavy bias towards Northwestern Europe

# Future deployment



- Predominant offshore deployment in North and Baltic Seas
- Slow new deployment in Spain

# Example Winter 1992/93

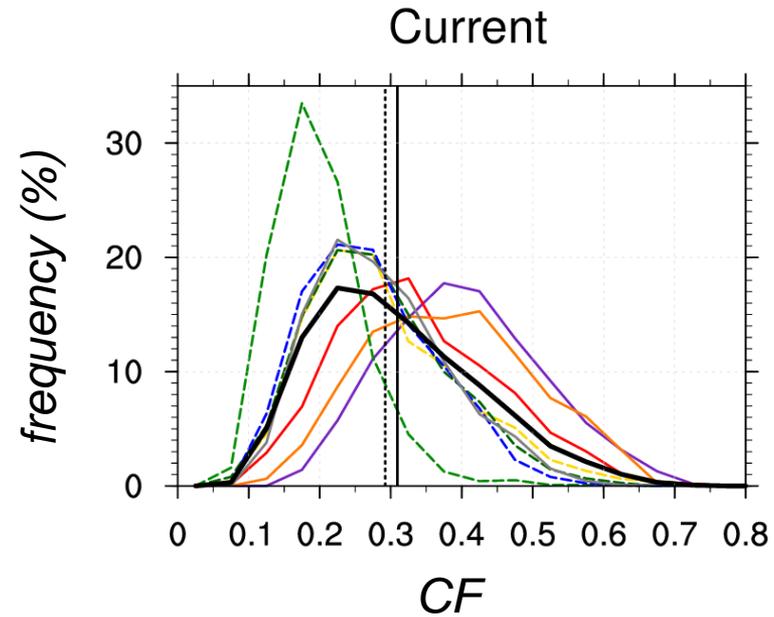


→ Multi-day variability in European wind power output could be balanced through spatial deployment informed by weather regimes

# Future variability

- Histogram of 6-hourly  $CF$  ( $=P/IC$ ) for Europe
- Actual Europe-wide power output / Europe-wide installed capacity

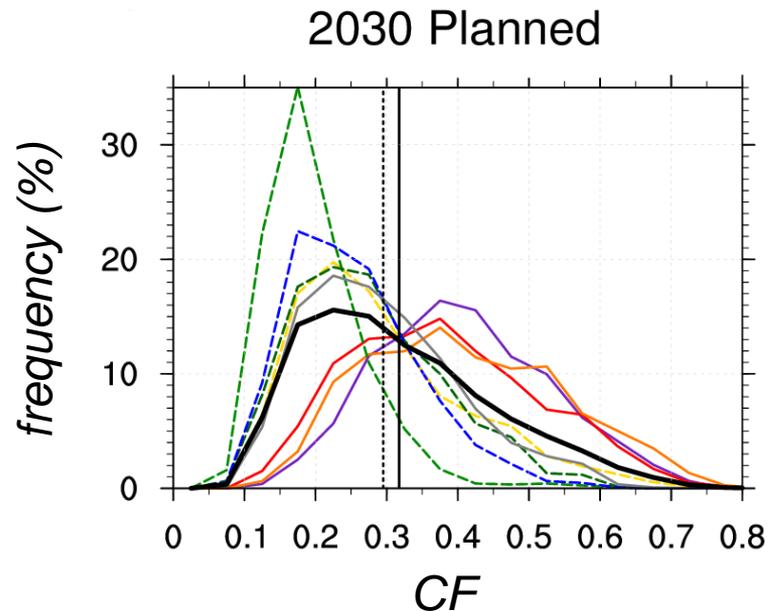
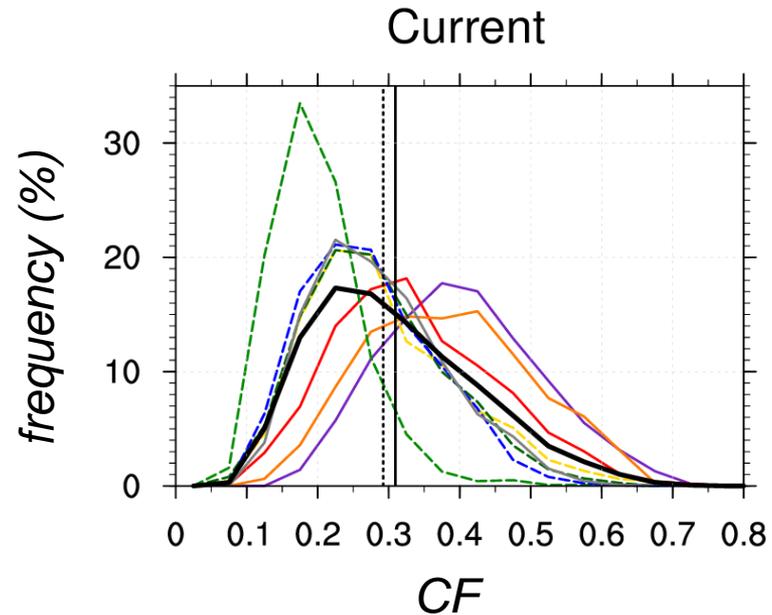
<i>solid</i>	<i>dashed</i>
Atlantic trough	Atlantic ridge
Zonal Regime	European blocking
Scandinavian trough	Scandinavian blocking
No regime	Greenland blocking
All winter days	



# Future variability

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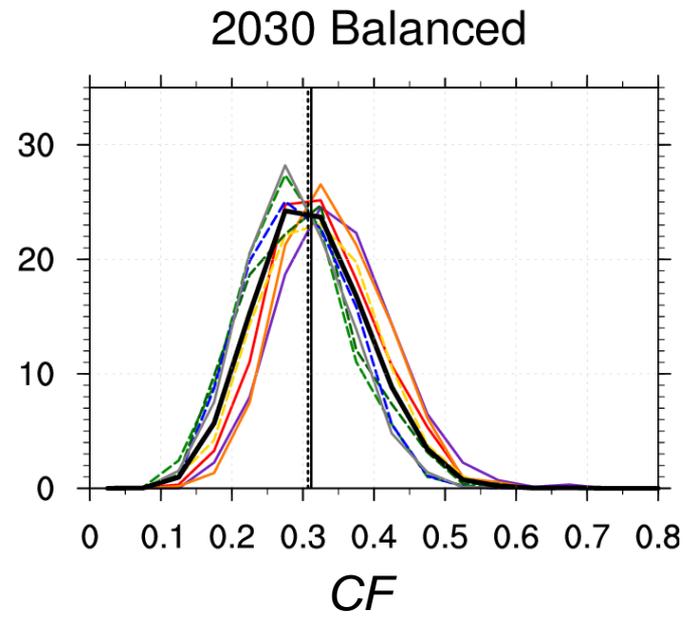
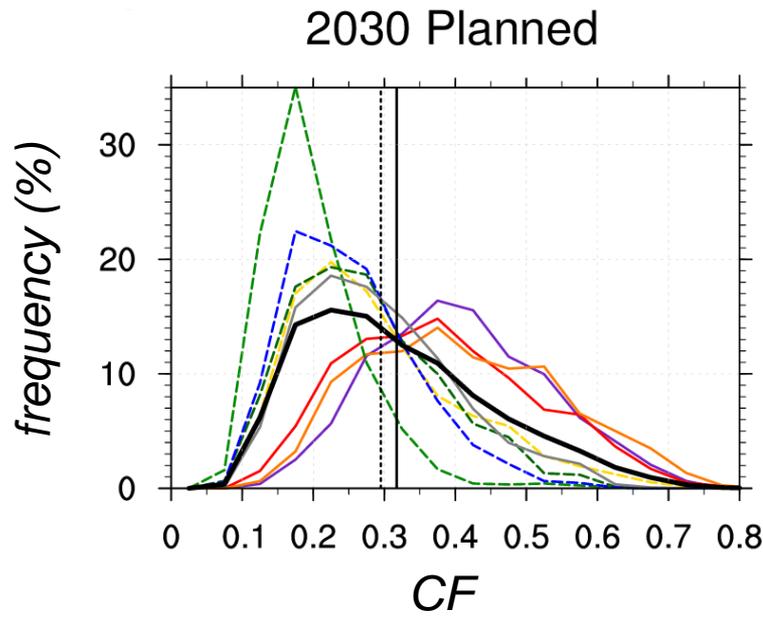
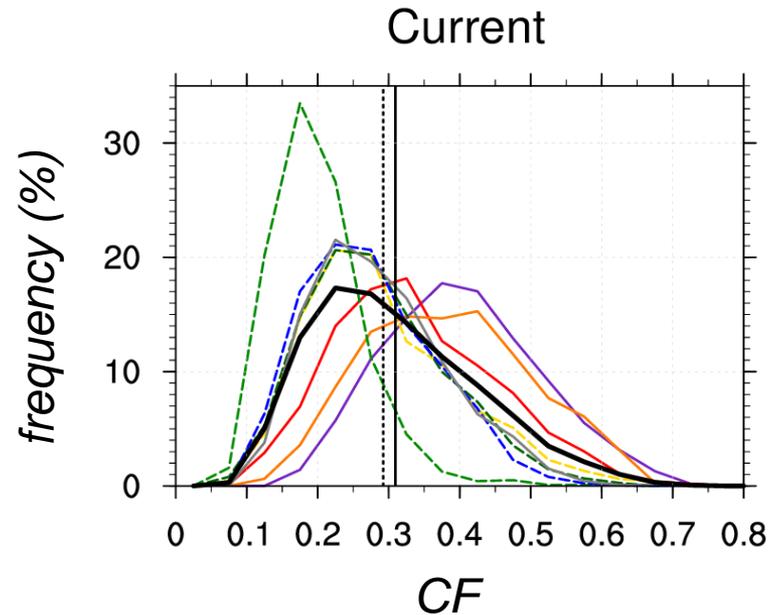
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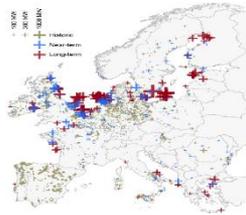
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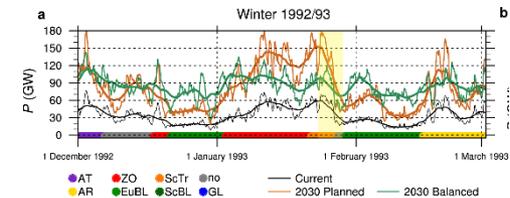
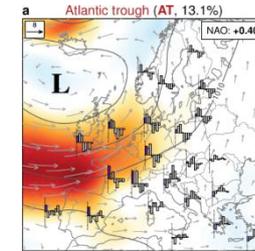
# Conclusions

- Multi-day variability in country-aggregated wind power output governed by weather regimes



- Unbalanced deployment in North Sea region causes very high-volatility of Europe-wide wind electricity

- Future deployment makes volatility worse, but alternate strategies could stabilise wind power
- European collaboration needed



## References

- Grams, C.M., R. Beerli, S. Pfenninger, I. Staffell, and H. Wernli (2017). Balancing Europe's wind power output through spatial deployment informed by weather regimes, *Nature Climate Change*, **7**, 557–562, [doi:10.1038/nclimate3338](https://doi.org/10.1038/nclimate3338)
- Pfenninger, S., and I. Staffell, 2016: Long-term patterns of European PV output using 30 years of validated hourly reanalysis and satellite data. *Energy*, **114**, 1251–1265, [doi:10.1016/j.energy.2016.08.060](https://doi.org/10.1016/j.energy.2016.08.060).
- Staffell, I., and S. Pfenninger, 2016: Using bias-corrected reanalysis to simulate current and future wind power output. *Energy*, **114**, 1224–1239, [doi:10.1016/j.energy.2016.08.068](https://doi.org/10.1016/j.energy.2016.08.068).

Data: <https://www.renewables.ninja/>

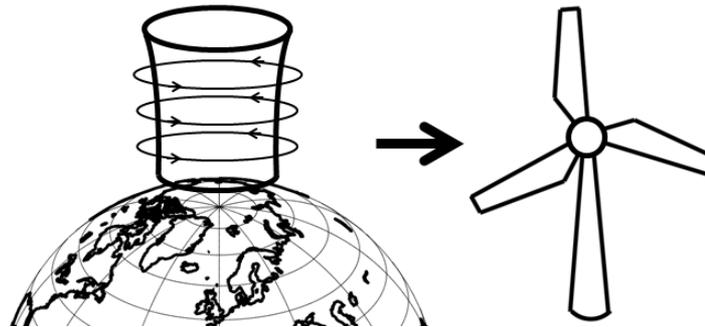
Blog: <https://christiangrams.wordpress.com/balancing-europes-wind-power/>



# Outlook

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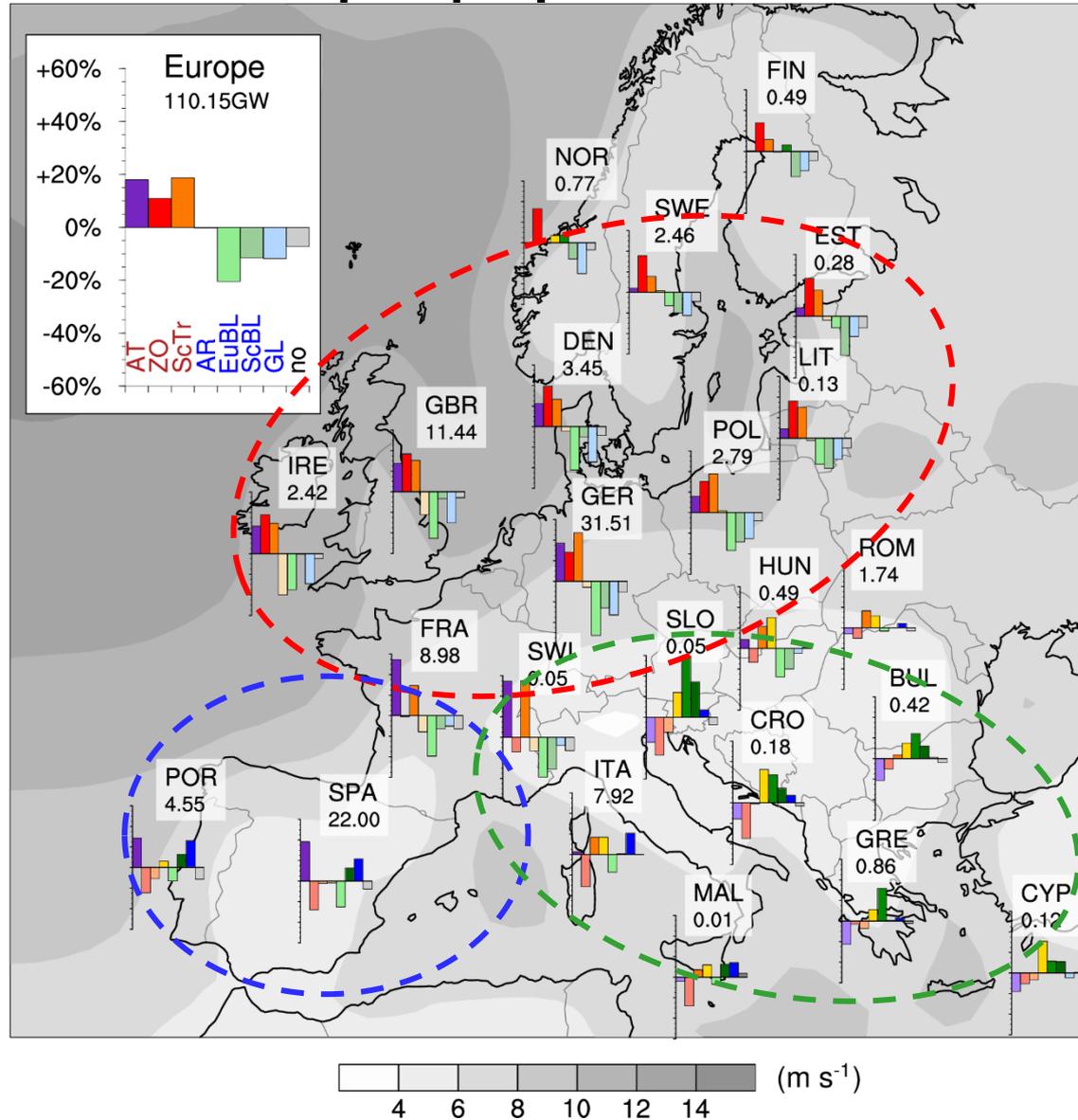
- In a second paper which combines reanalysis data and renewables.ninja we showed that for two of the seven weather regimes there exists predictability of wind power on monthly time scales, when there are strong anomalies in the stratosphere



Beerli, R., H. Wernli and C. Grams (2017). Does the lower stratosphere provide predictability for month-ahead wind electricity generation in Europe? Quarterly Journal of the Royal Meteorological Society, [doi:10.1002/qj.3158](https://doi.org/10.1002/qj.3158)



# Appendix: Modulation of wind power



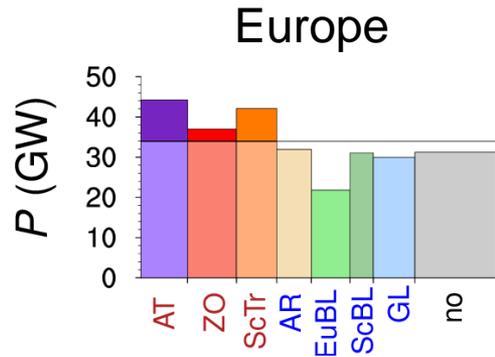
Bars for each country of

$\Delta CF$ : wind power output change from winter mean

numbers: country's IC in GW (as of end 2014)

grey shading: DJF mean 100m wind

# Appendix Maximum Over-/Under-production

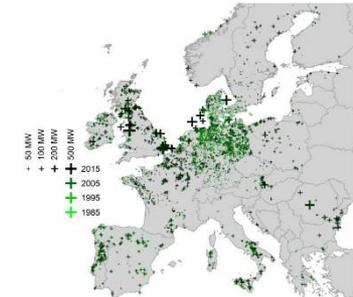


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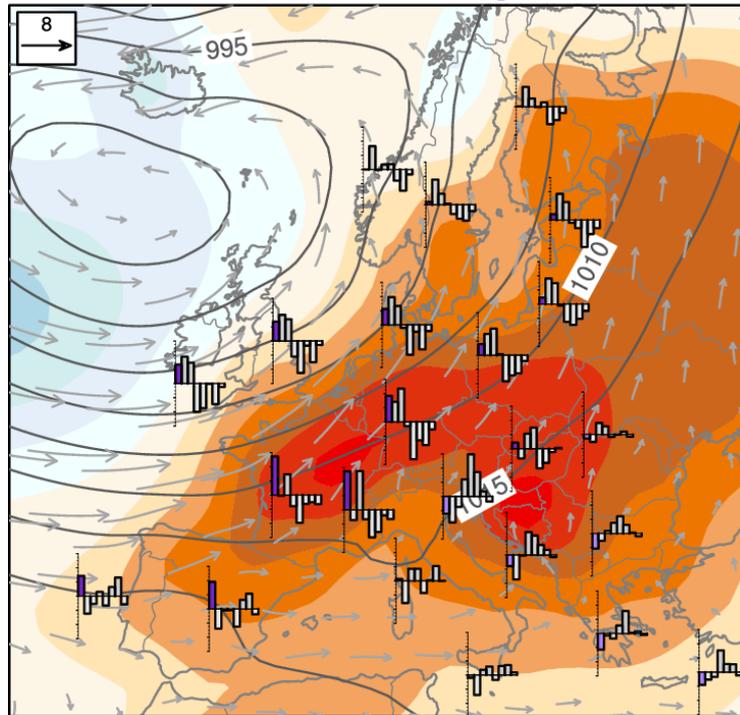
**AT:** 44 GW (+10 GW)

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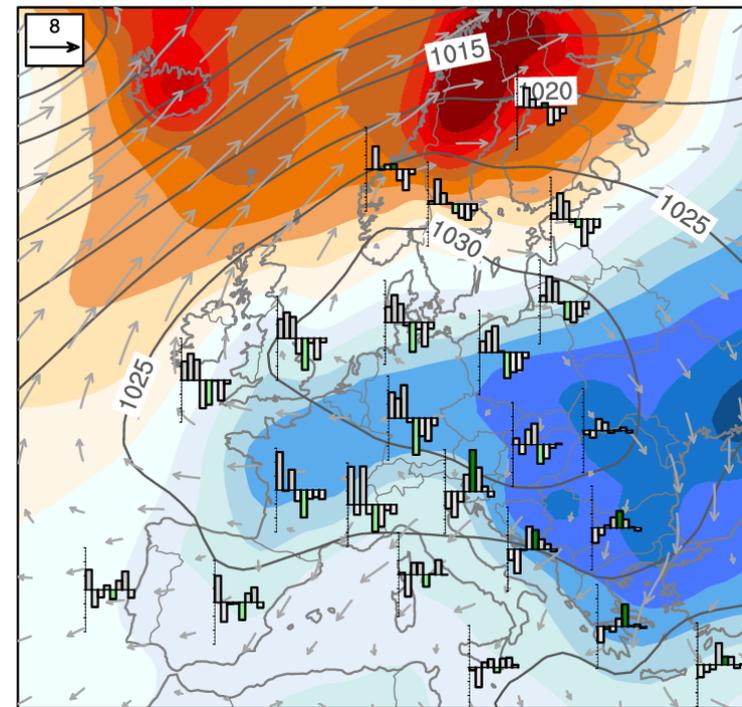
Volatility of 22 GW (65%)



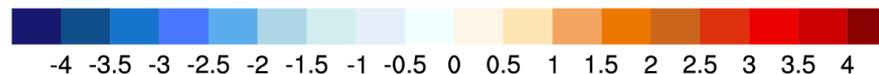
Atlantic trough



European Blocking



Temperature 2 m



(K)