



Climate Change

Development of the E-OBS wind strength dataset

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The need for a pan-European windfield

Aim:

Pan-European observation-based gridded dataset for (daily-averaged) wind speed

Motivation:

- Wind speed has a strong societal impact
- Wind speed is input to derived indices like
 - Penman-Monteith potential evapotranspiration
 - Universal Thermal Climate Index



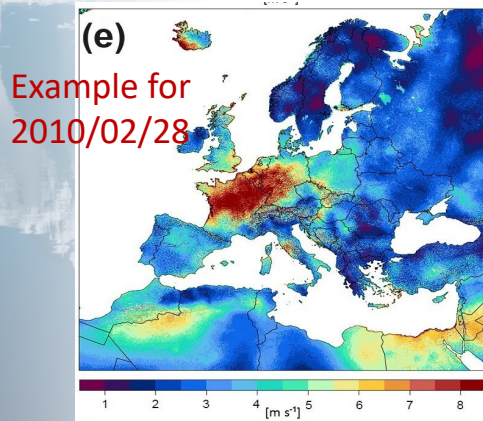


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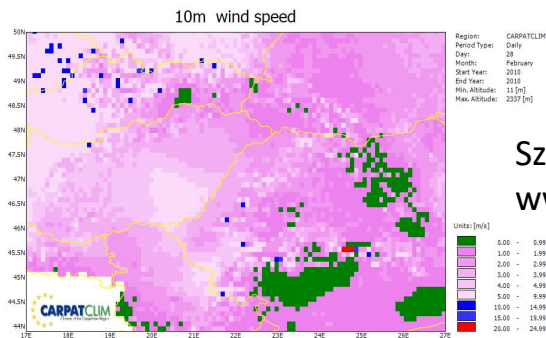
Approach

1. Develop a dataset with observational data
 - dense network of station is required
 - capable QC method
2. Develop an algorithm to grid wind strength which is capable of reflecting the small-scale spatial structure of wind

Examples of other datasets:



Brinckmann et al (2016)



Szalai et al. (2013)
www.carpatclim-eu.org

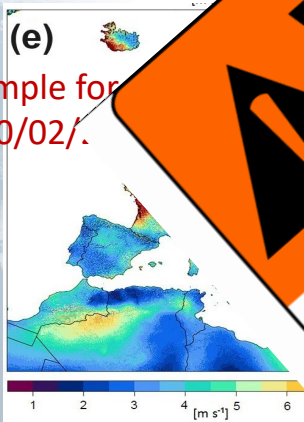


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Approach

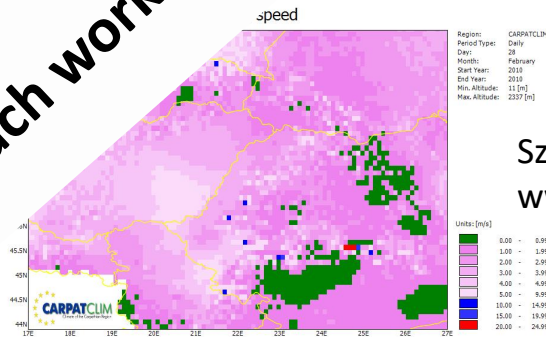
1. Develop a dataset with observations
 - dense network of station is
 - capable QC method
2. Develop an algorithm
 - capable of reflecting
 - wind

Examples of



! WARNING

Still very much work in progress



Szalai et al. (2013)
www.carpatclim-eu.org

.ann et al (2016)



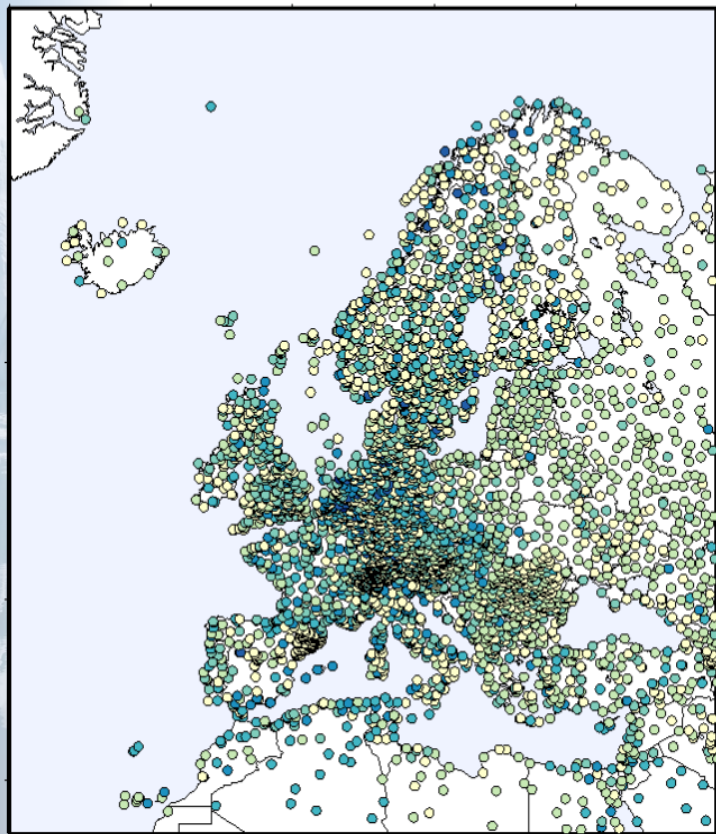
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Data and QC: Collaboration with NEWA



Newa's Project: Development of a New European Wind Atlas

<http://www.neweuropeanwindatlas.eu/>



- How does wind behaves at a local scale?
- How do different models behave in Europe?
- ...



Non-existence of a **Quality Controlled Surface Wind Speed and Direction Observational Database** covering **all the European region.**



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WiSED: How is it developed?

Compilation

- Intensive search for available data sets
- Analyzing each data set.
- Data set unification.

Quality Control

- Data management issues.
- Measurement errors.

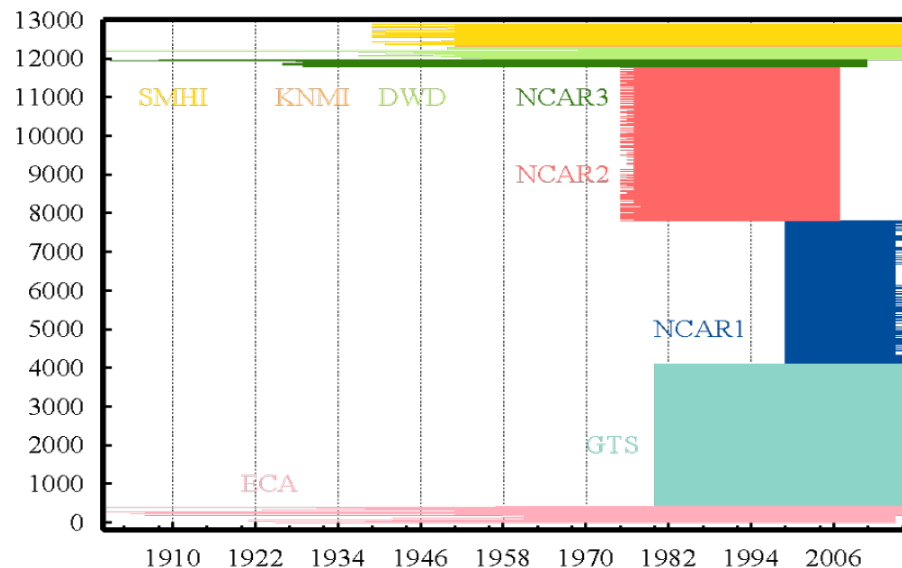
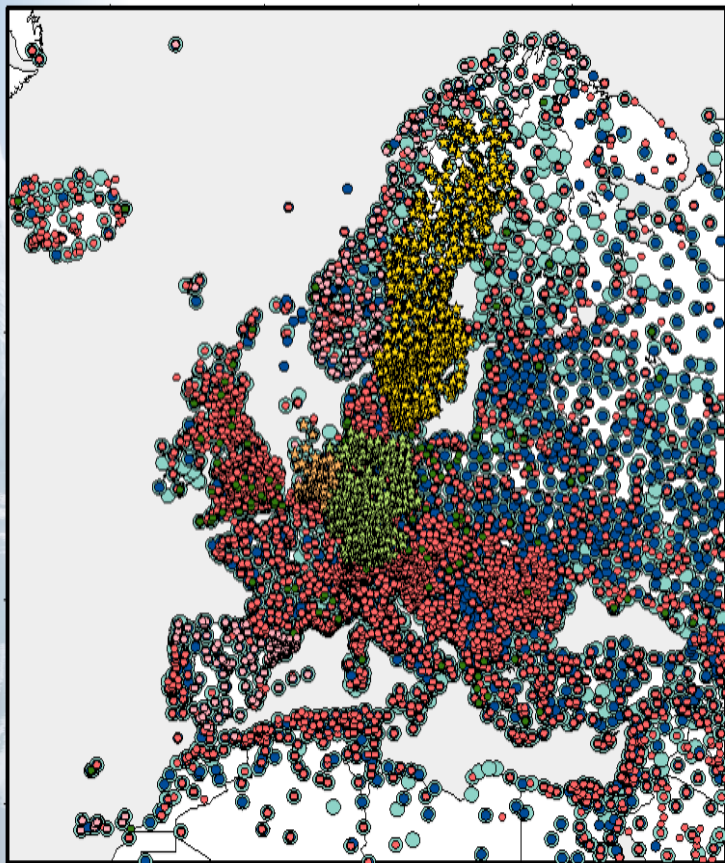
High resolution European quality-controlled database of surface wind speed and direction

Basis for the windstrength E-OBS



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WiSEd: Compilation



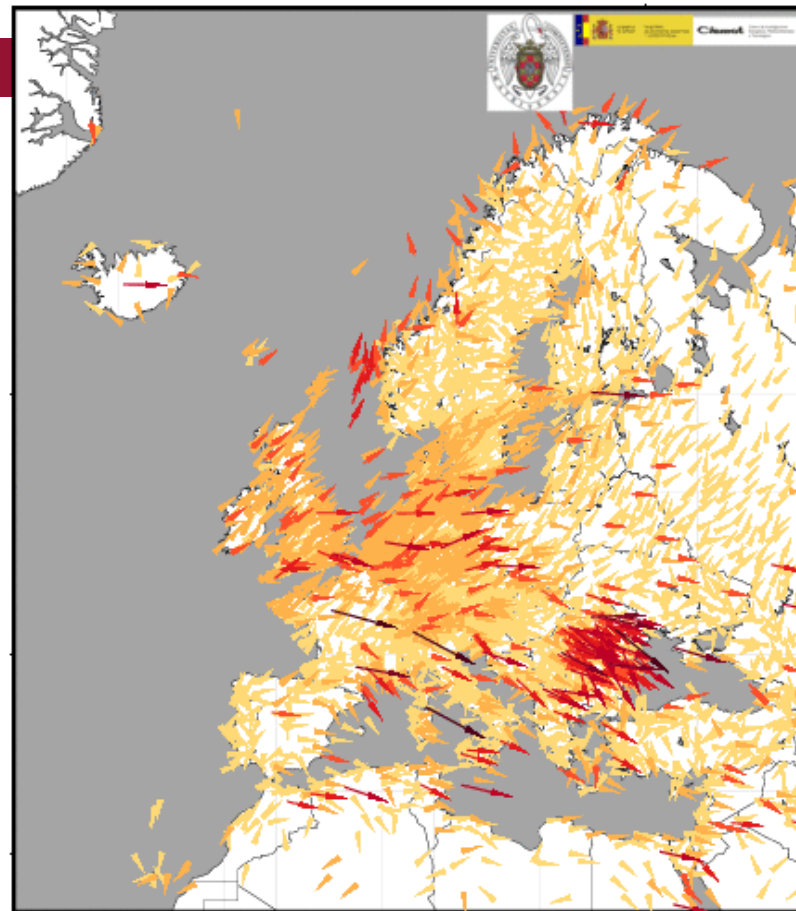
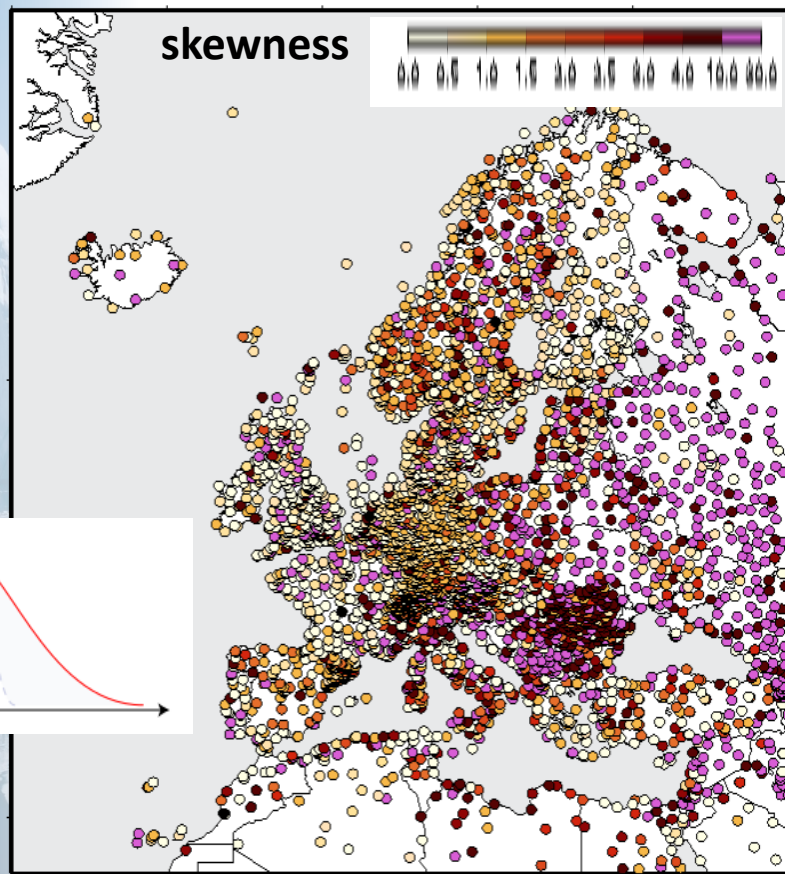
Sources:
NCAR, NMHSs,
GTS, ECA&D

Compilation of **12888**
time series



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WiSED before QC



0 2 4 6 8 10 12 14 16

Mean Wind Speed (m/s): Jan, 01



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Approach to grid wind strength

Generalized Additive Models (GAM)

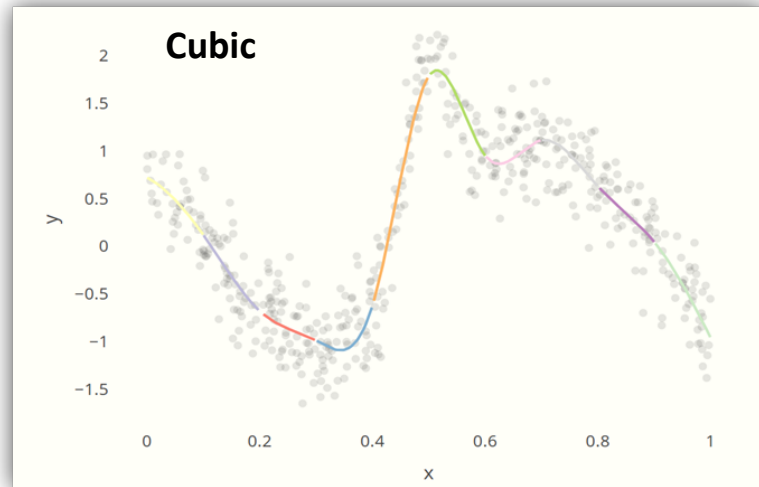
- Models assuming smooth relationships between covariates and target variable
- Piece-wise polynomials that are added to obtain final prediction

characteristics:

- Interpretable: feature importance
- Flexibility: captures non-linearities
- Regularization: smoothness/wiggleness

GAM is used in other E-OBS fields

(Cornes et al. 2018)

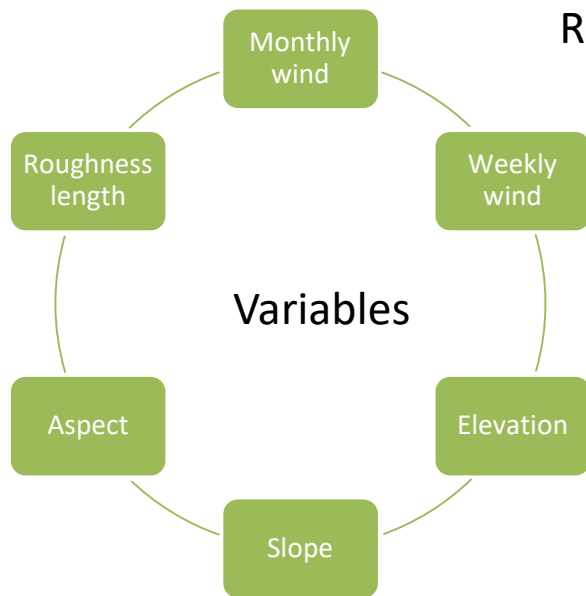


source: <https://m-clark.github.io/generalized-additive-models/technical.html>

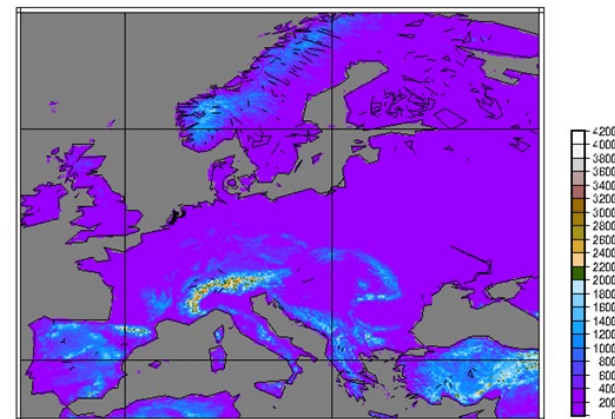
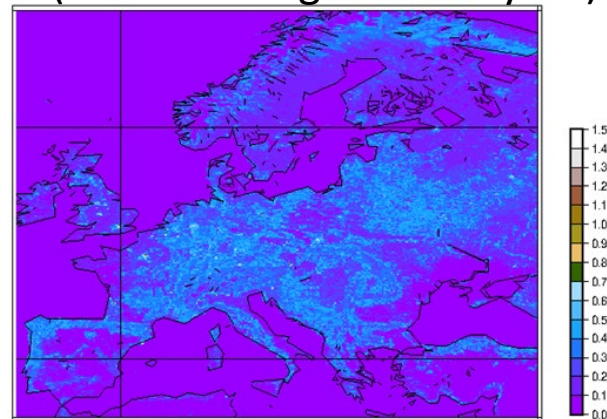


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Co-variables



Roughness length (varies throughout the year)



Elevation (plus slope & aspect)

R's **mgcv** package allows to use all variables as smoothly varying predictors or *combinations* of these variables

e.g. effect of elevation varies smoothly with roughness-length



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Combination of variables: Stormy day

2014-03-14

- 0,0 - 2,0
- 2,0 - 4,0
- 4,0 - 6,0
- 6,0 - 8,0
- 8,0 - 10,0
- 10,0 - 12,0
- 12,0 - 27,3

Station data



Model #5



Model #7





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What did we learn individual modelling?

Variable importance

Variance captured:

- Lat/lon: 15% - 53%
- Background wind: 15% - 37%
- Surface roughness and aspect & slope: < 12%

- "good stable day" vs "turbulent day"
- Some variables may not contribute at all, despite making sense

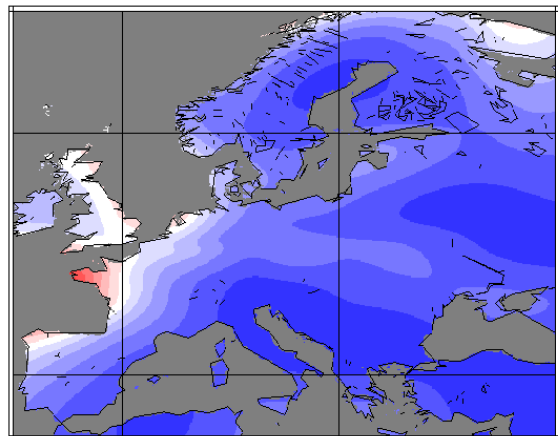
Temporal cost

- Tensor calculations are faster than smooth splines

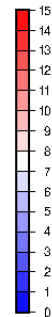
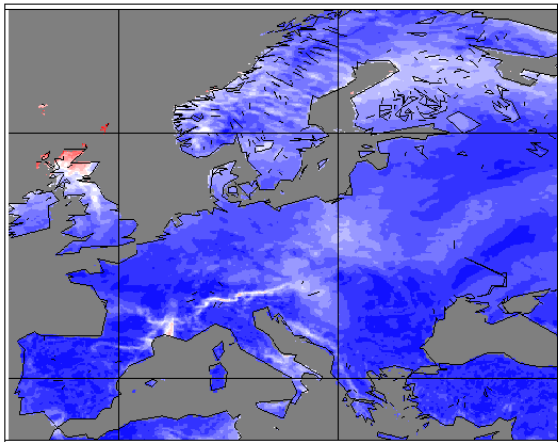


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Comparison against reanalysis



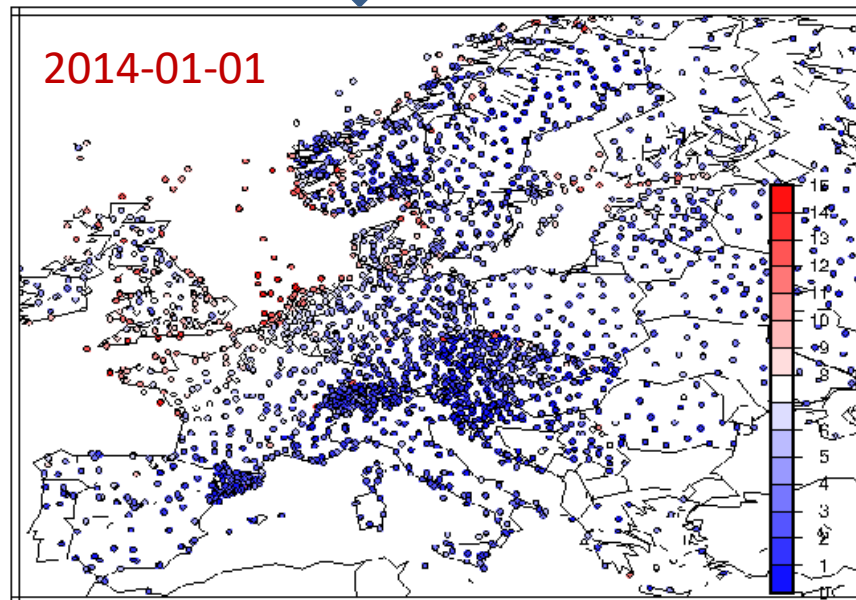
gridded observations



HARMONIE reanalysis



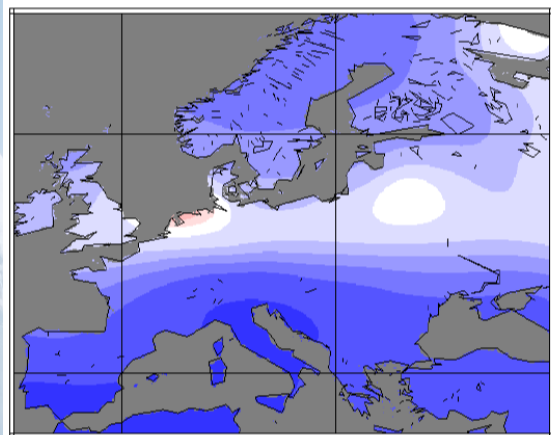
observations



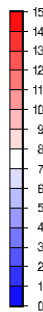
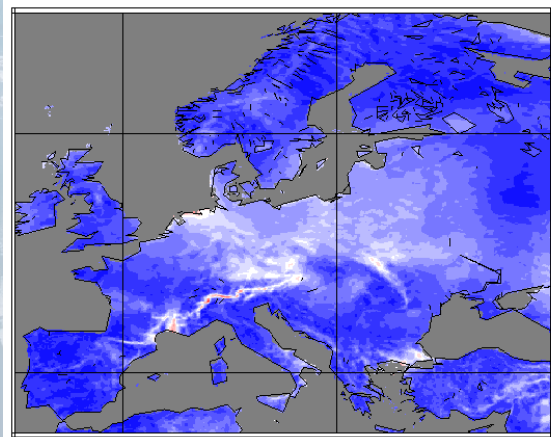


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Comparison against reanalysis

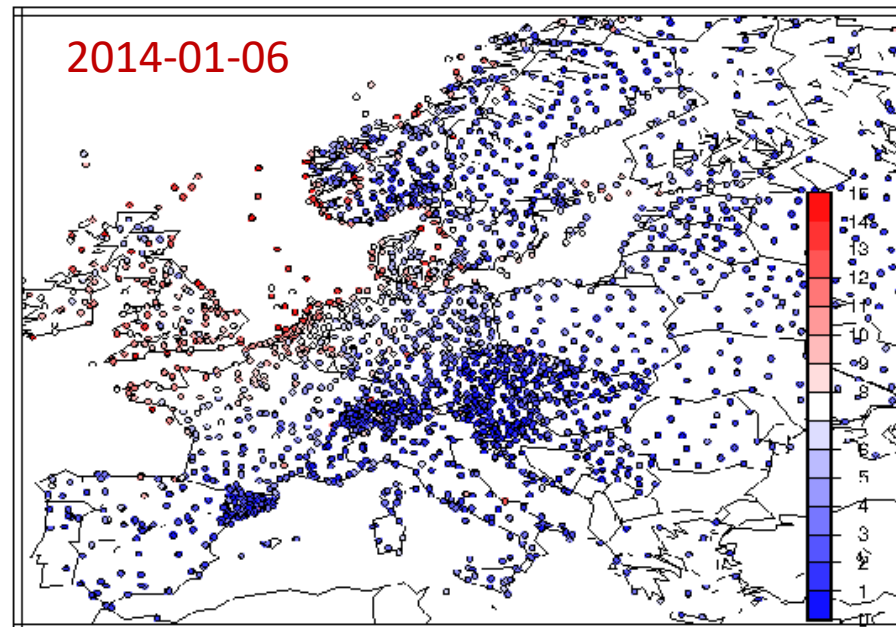


gridded observations



HARMONIE reanalysis

observations



ECMWF

Copernicus
Europe's eyes on Earth

European
Commission



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Conclusions

E-OBS member for pan-European wind strength

- Collaboration with NEWA: access to a large data set of measurements
- Rigorous quality control
- Generalized Additive Models used to construct daily maps
- Set of variables used to explain data
 - Roughness length, position & altitude, mean (background) value
- Effects of variables modelled as purely additive and interactions between variables
- Resulting maps resemble observations
- ... *far* too smooth