

# Forecasting for an Integrated Energy System

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Wednesday, 20th June 2018

ESIG 2018 Forecasting Workshop, St Paul, MN



# Outline

1. Forecast Applications
2. Forecast Ranges
3. Reanalysis Data
4. ShortWave Radiation
5. Wind/SW correlations
6. Systematic Errors
7. PostProcessing
8. Weather and Demand
9. Probabilistic Forecasting
10. MultiVariate Spatial PP

# Forecast Applications

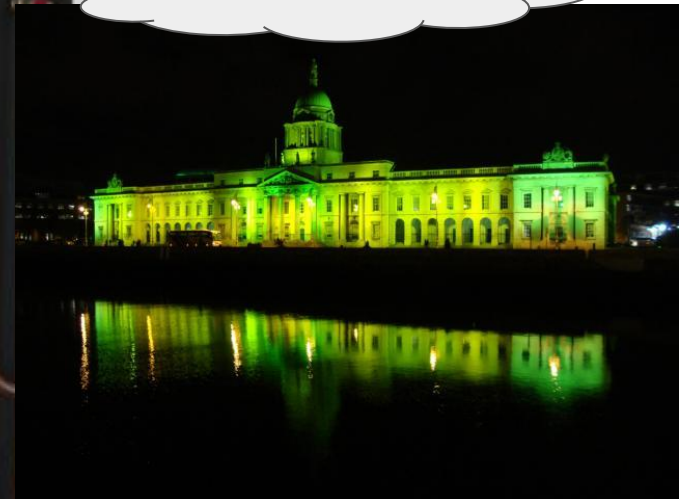
Wind  
Solar/PV } Ramping

Thermal: Heating/cooling

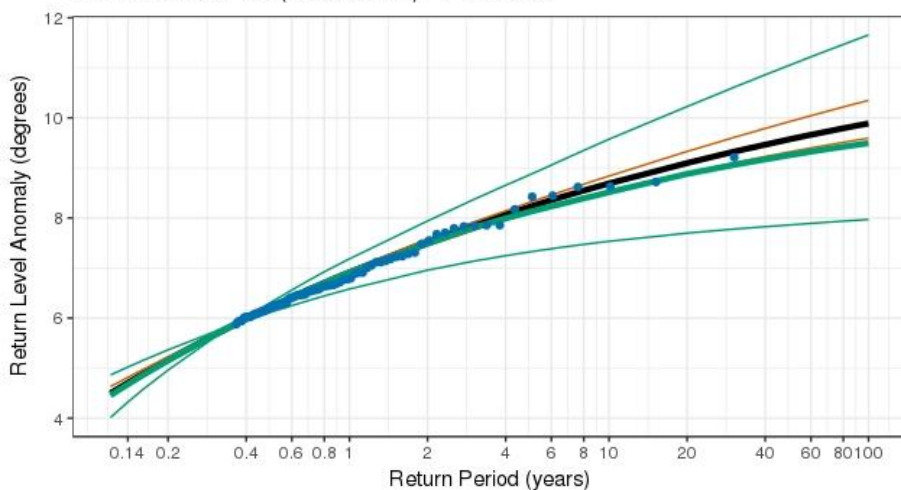
Clouds: Lighting

Precipitation: WWT

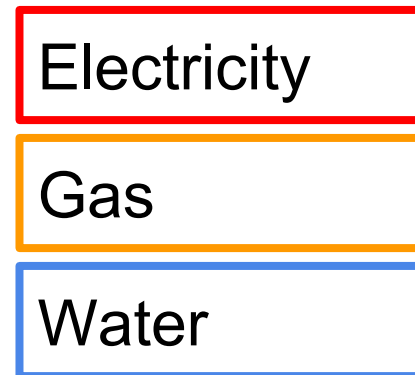
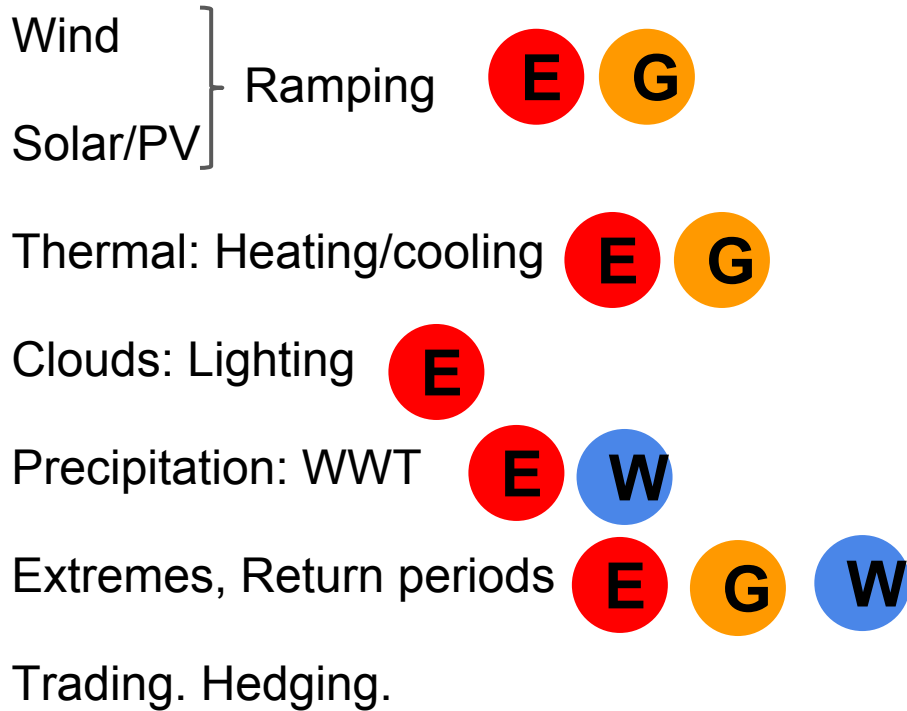
Extremes, Return periods



Return Level Plot (1981-2010) - Point 635



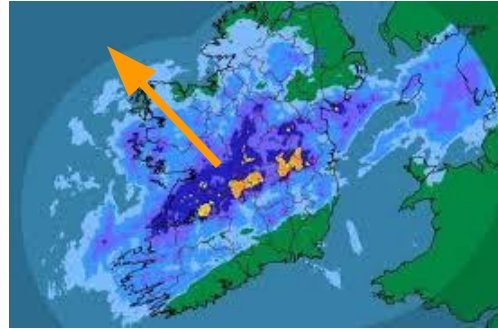
# Forecast Applications



# Forecast Ranges

## Nowcasting/Stats:

Short term. < 6 hours. Stats.



## Operational:

Short range: 6 hours to 5+ days.



Medium range: 15 days

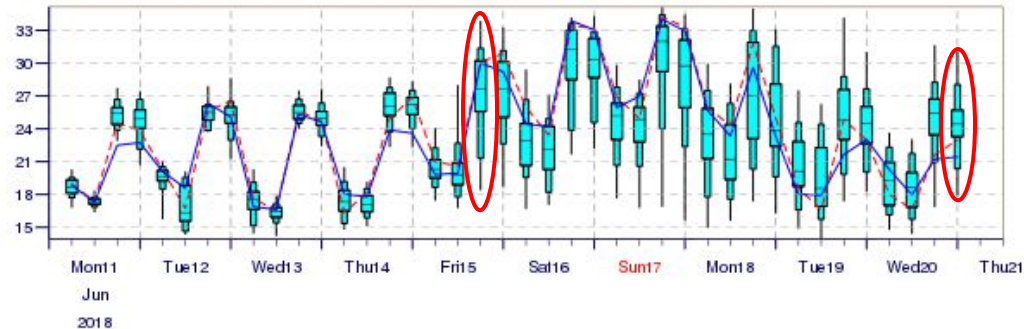
Extended range: 32 day

Long range. Seasonal: 1-3 months

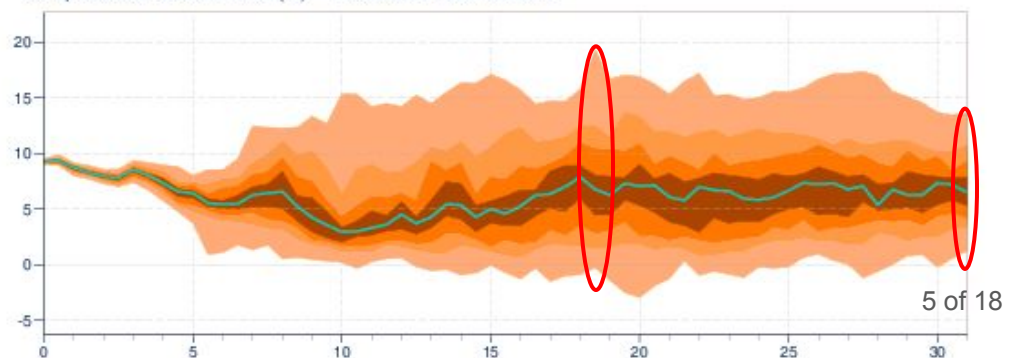
And this!

We do this...

2m Temperature (°C) reduced to 235 m (station height) from 270 m (HRES) and 261 m (ENS)



Temperature at 850 hPa (C) - Ensemble distribution



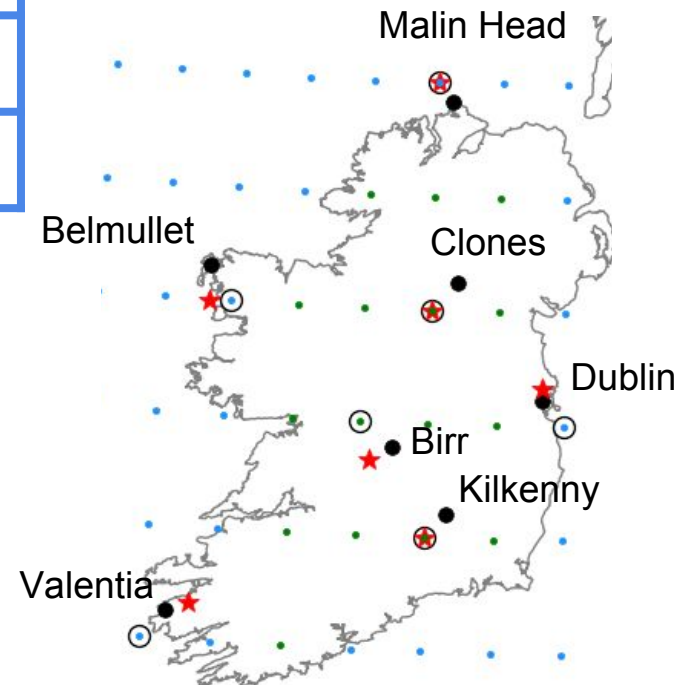
# Reanalysis Data

ERA-Interim	80km. 3-hourly	○
MERRA2	55km. Hourly	★
MÉRA	2.5km. Hourly	●

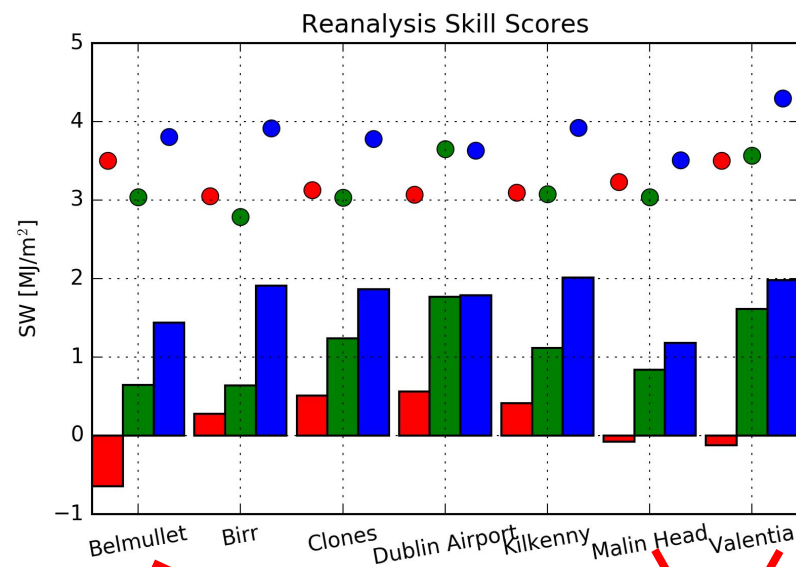
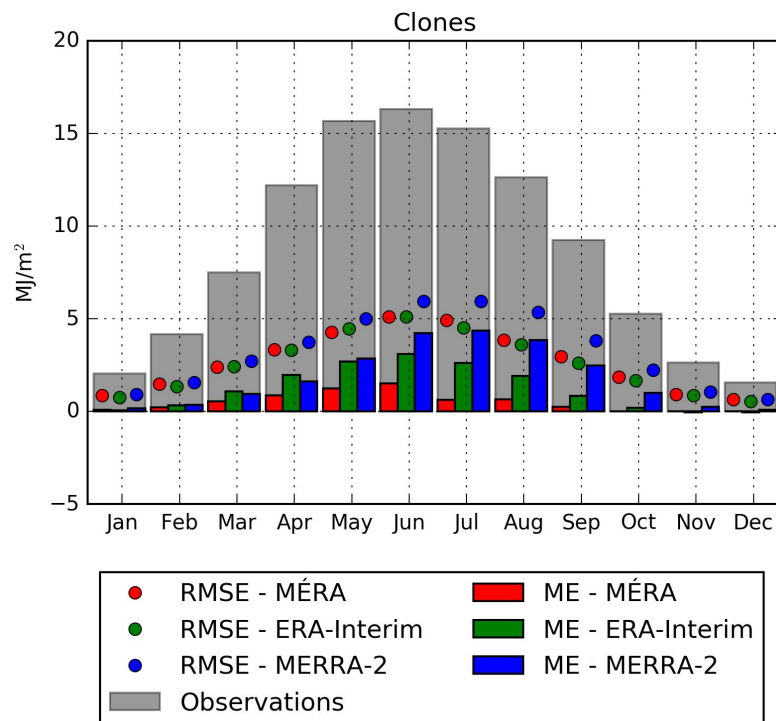
## Observations:

- 10 metre wind
- ShortWave radiation

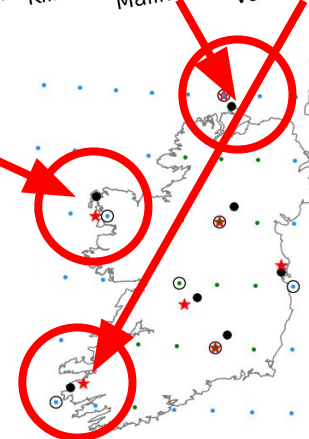
Common validation period:  
1982-2007



# ShortWave Radiation (SW)



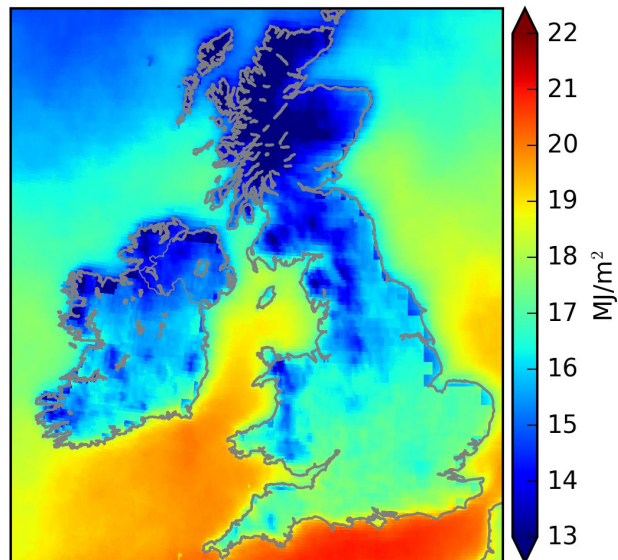
Large relative errors.  
**Coast bias:** Modelled clouds.



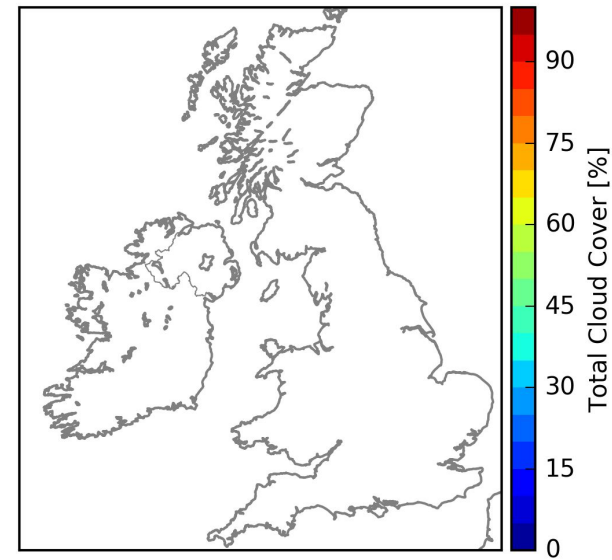
# Spatial SW

Land/sea pattern

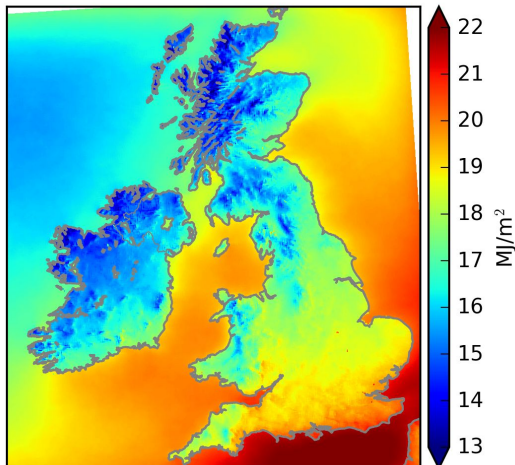
Satellite



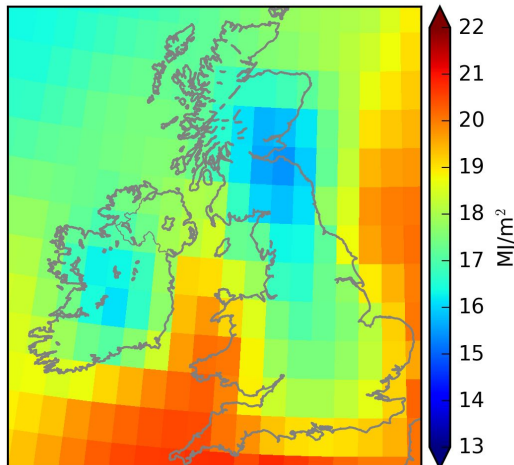
7:00 UTC



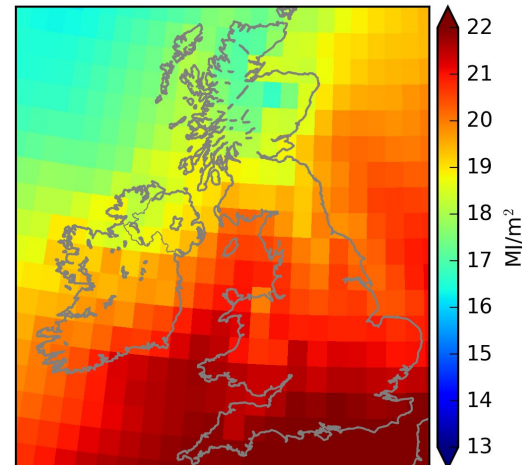
MÉRA



ERA-Interim

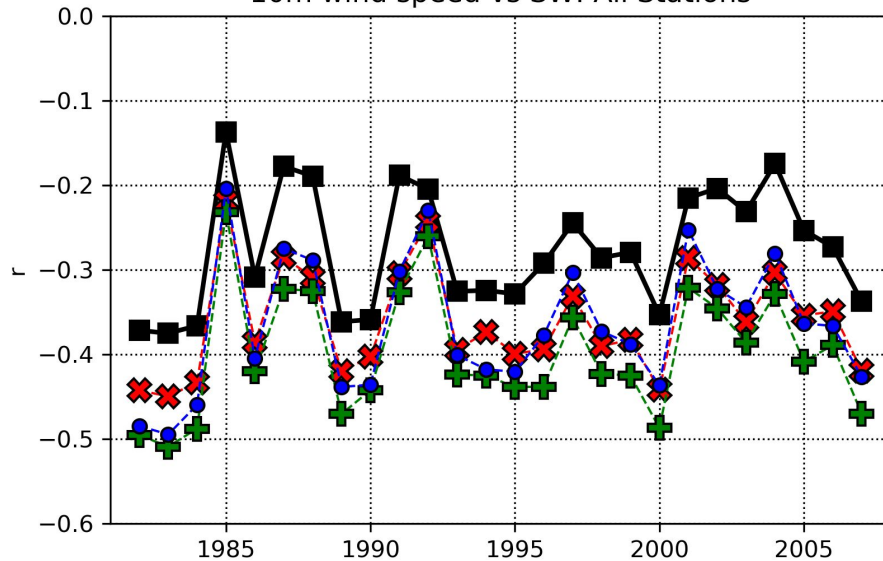


MERRA-2

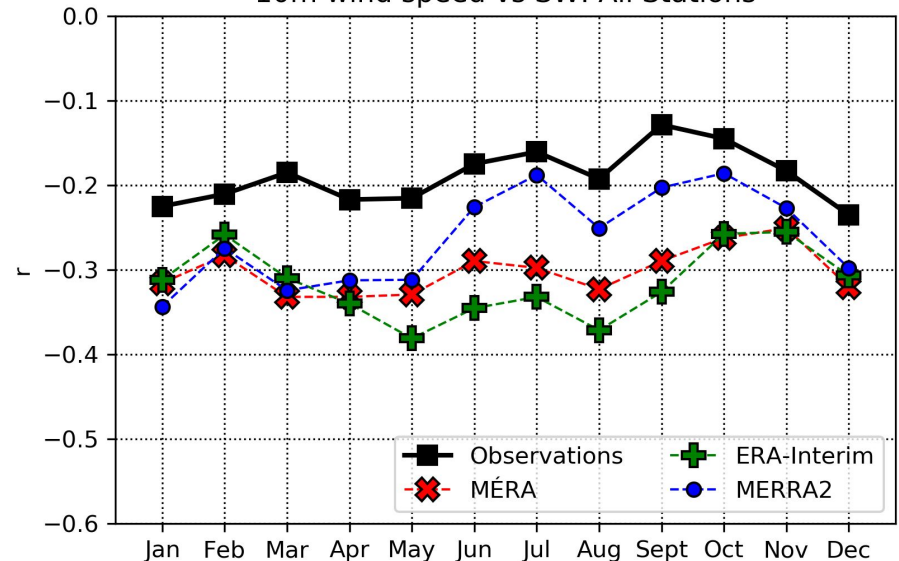


# Wind/SW correlations

10m wind speed vs SW: All Stations



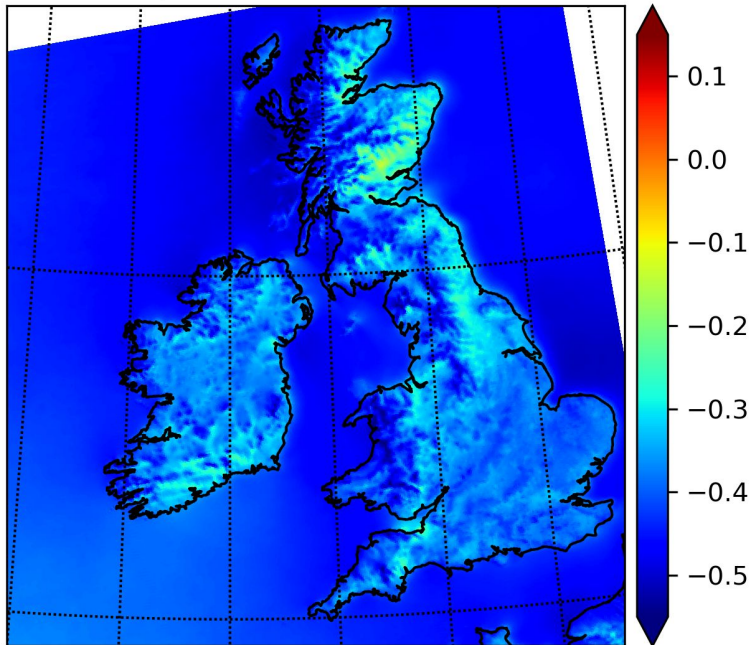
10m wind speed vs SW: All Stations



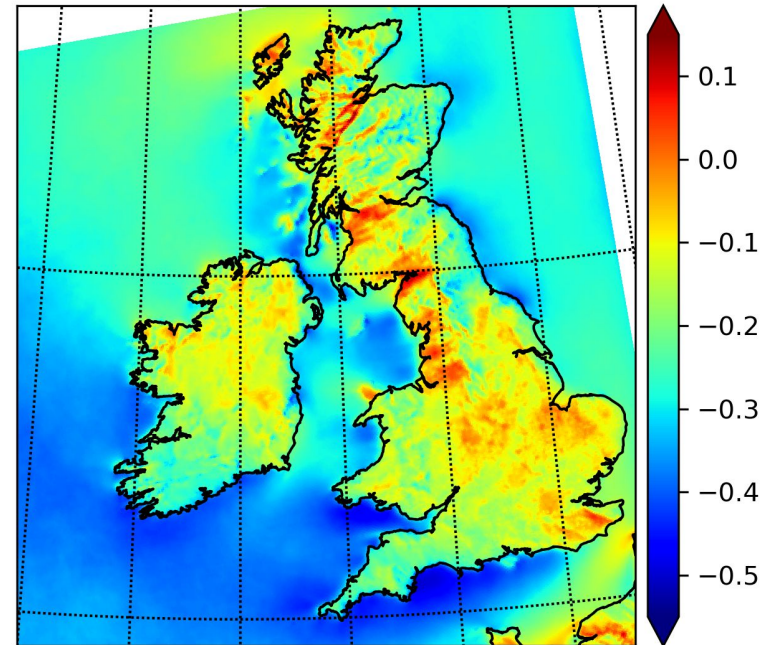
Year-on-year changes > average monthly.

# Spatial Wind/SW correlations

10m wind speed vs SW: 850hPa Westerlies



10m wind speed vs SW: 850hPa Easterlies



Influence of orography  
Correlation changes with wind direction  
Not seen in global reanalyses

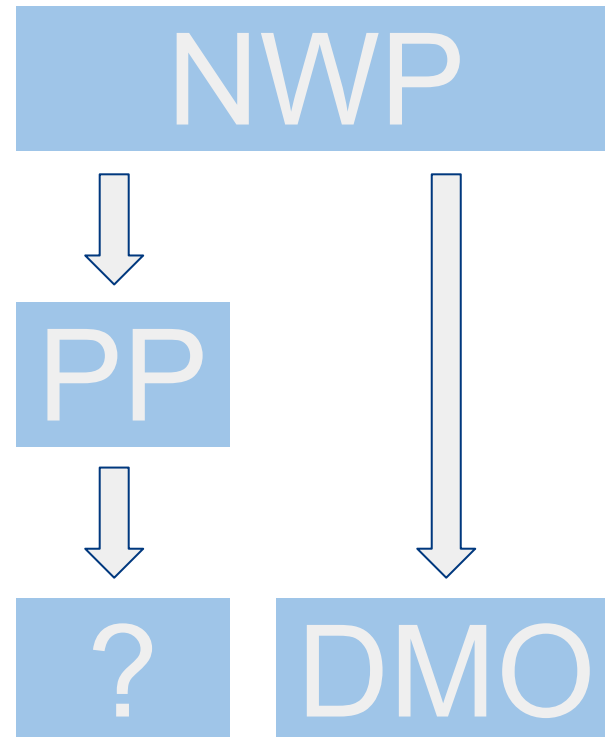
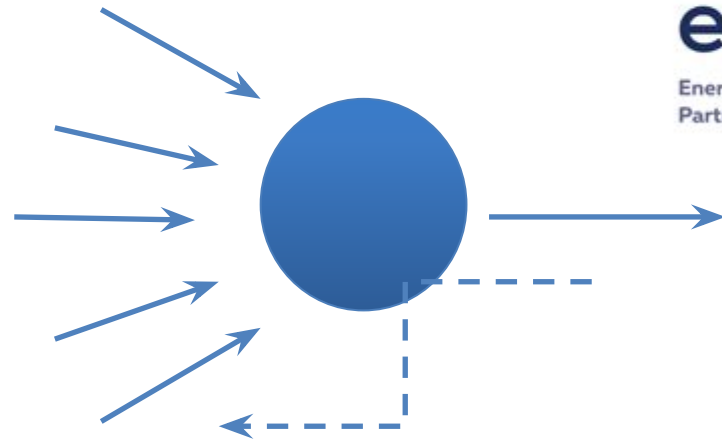
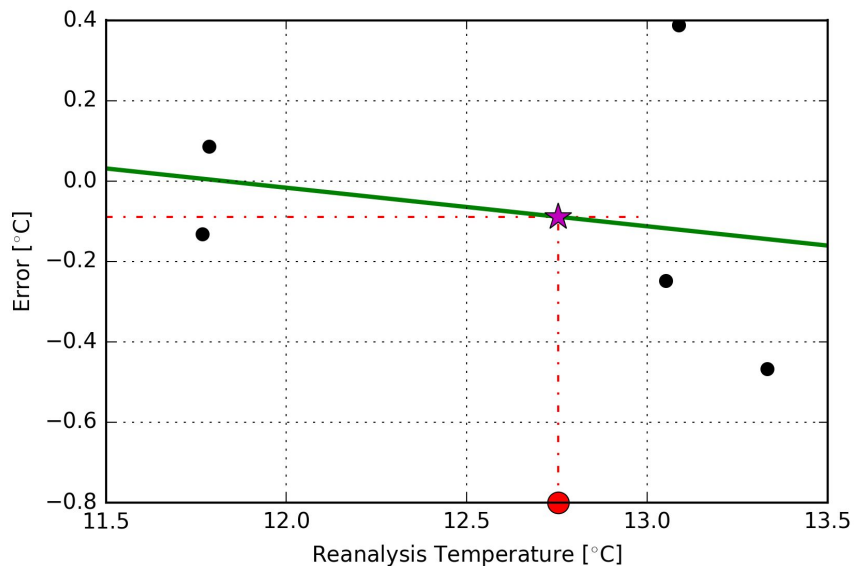
# Systematic Errors

## Adaptive PP

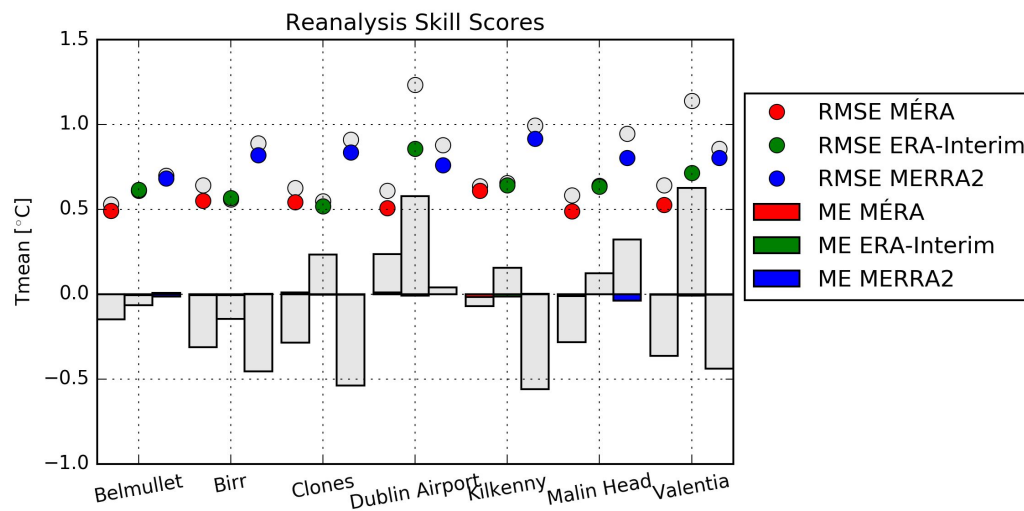
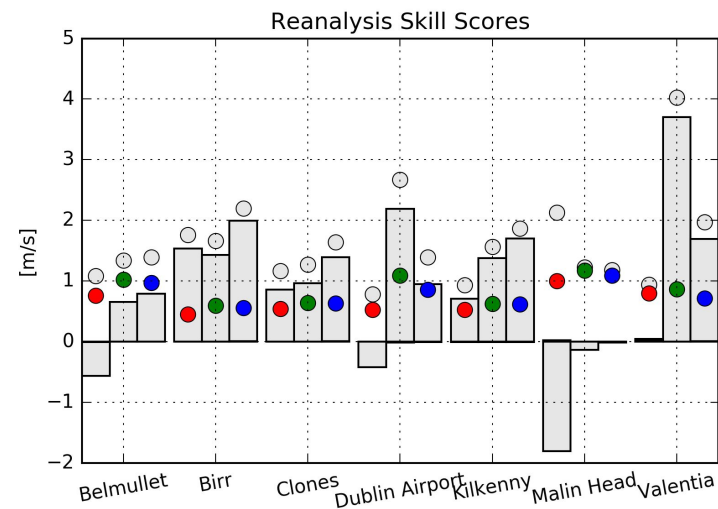
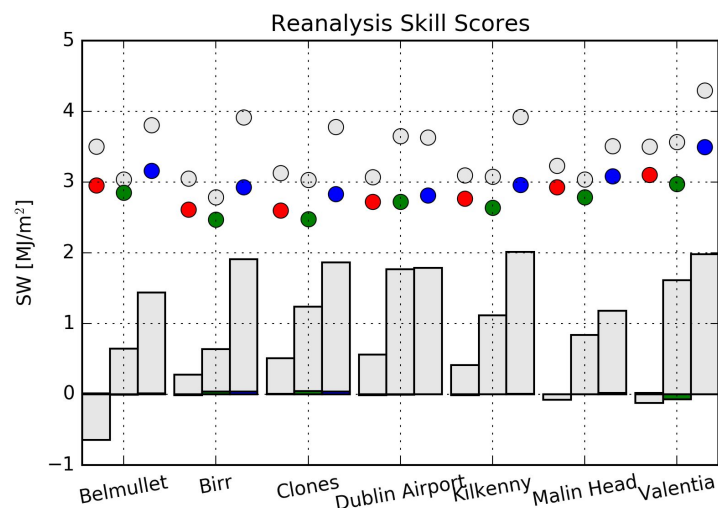
- train from past x days

## Machine learning

- Physical reason?

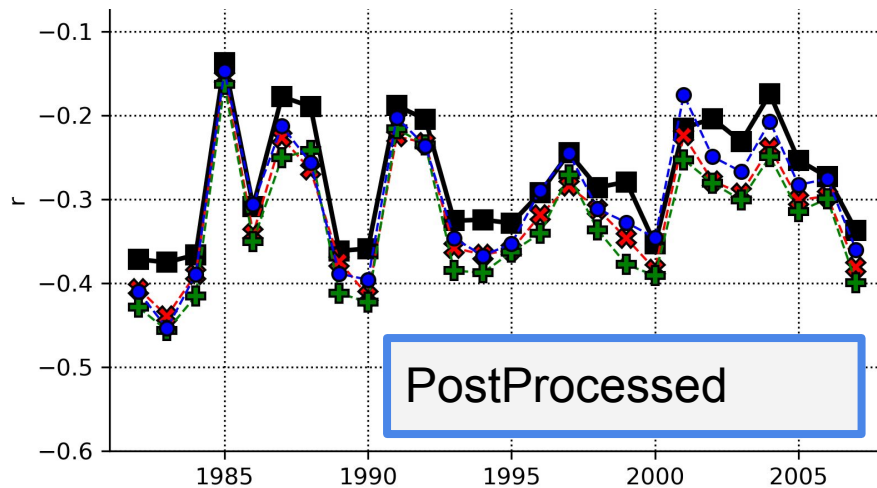
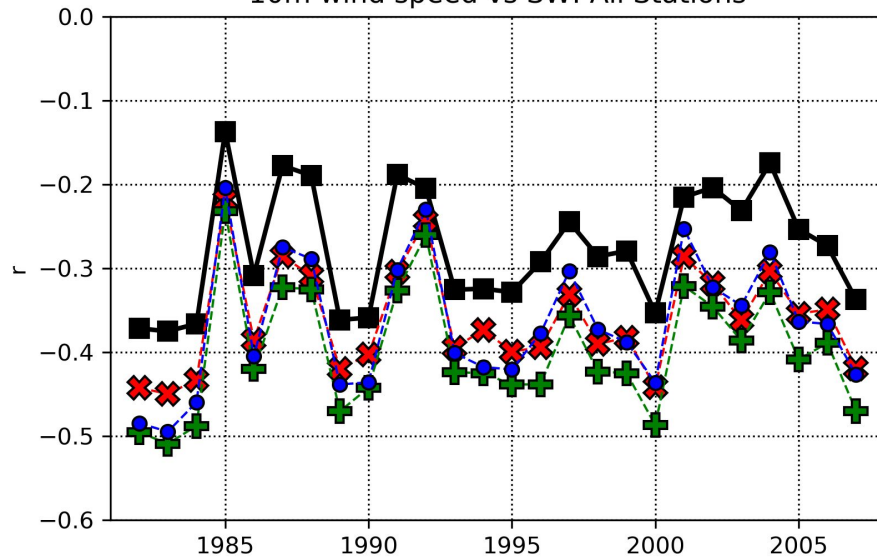


# PostProcessing

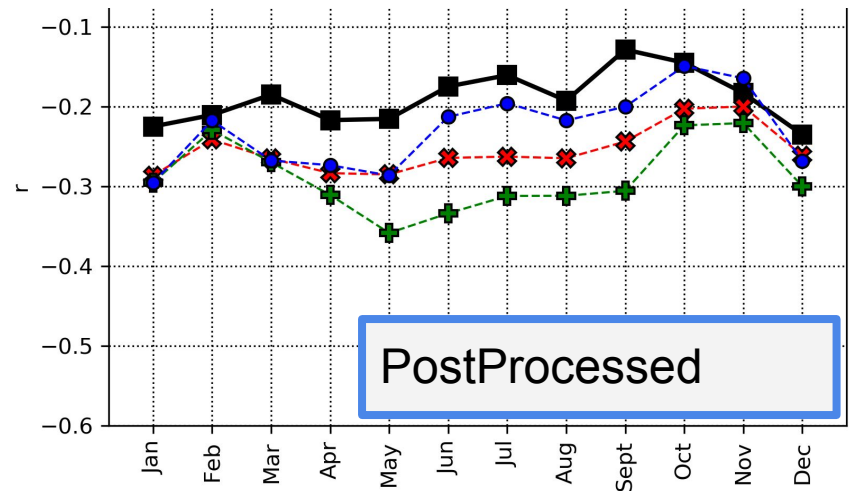
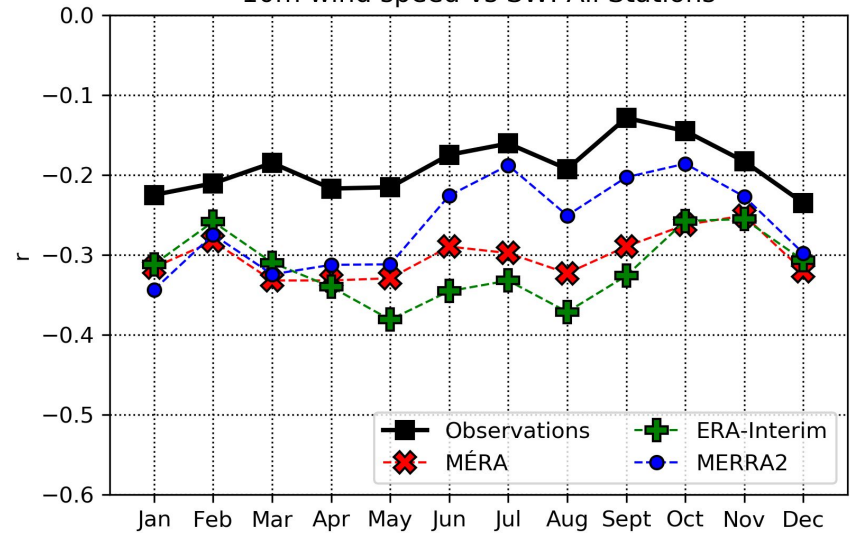


# PostProcessing

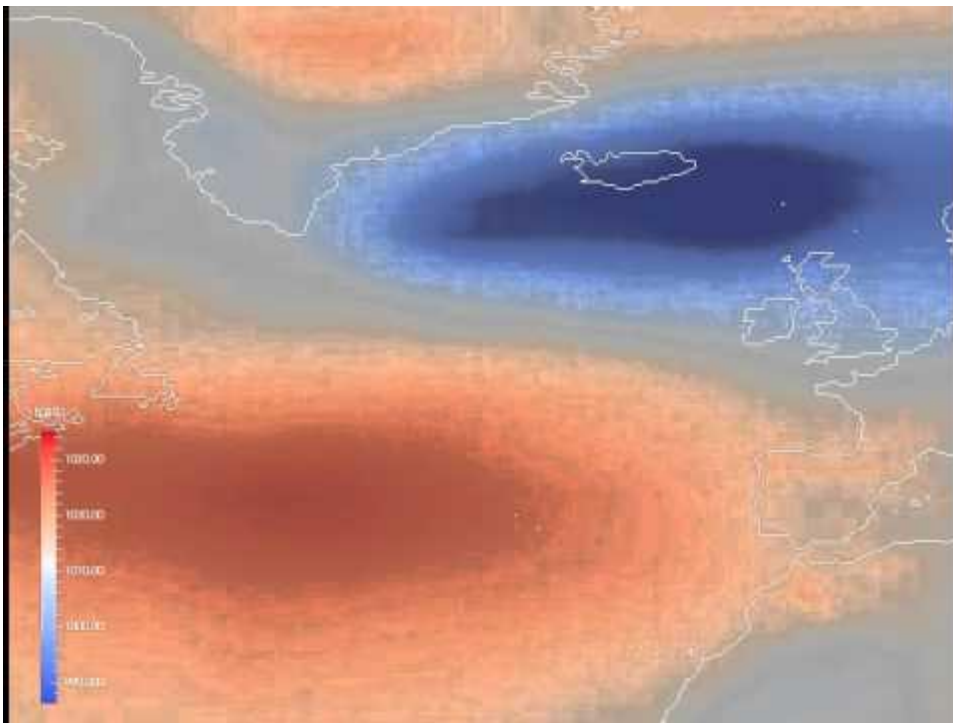
10m wind speed vs SW: All Stations



10m wind speed vs SW: All Stations

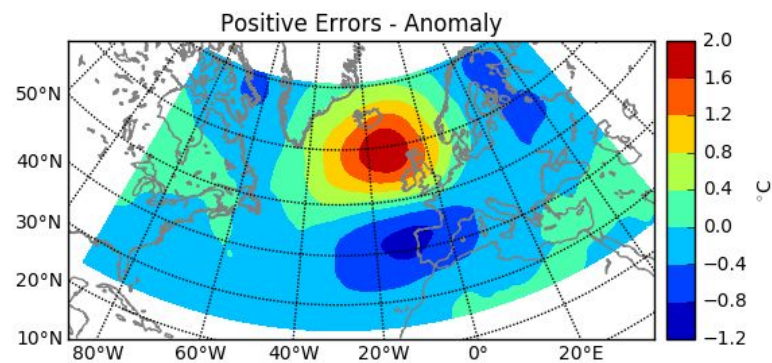


# Don't Average everything

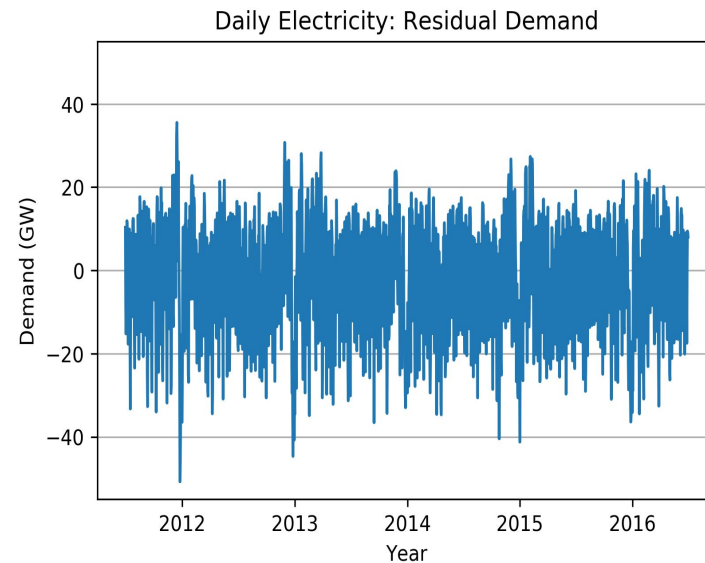
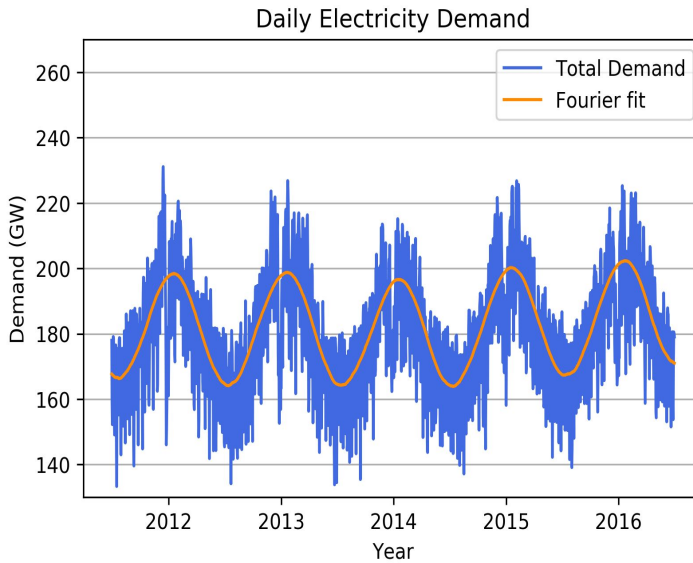


<https://www.youtube.com/watch?v=9D451XcuQmY>

Largest SW errors:  
T at 500hPa



# All Ireland Electricity Demand Profiles



$$\text{Total Demand} - \text{Fourier Fit} = \text{Residual Demand}$$

Annual trend:

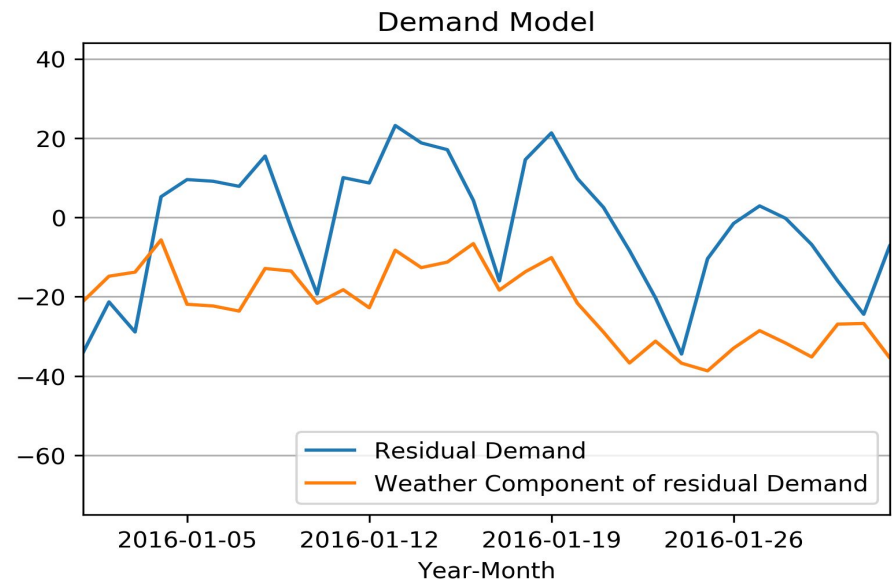
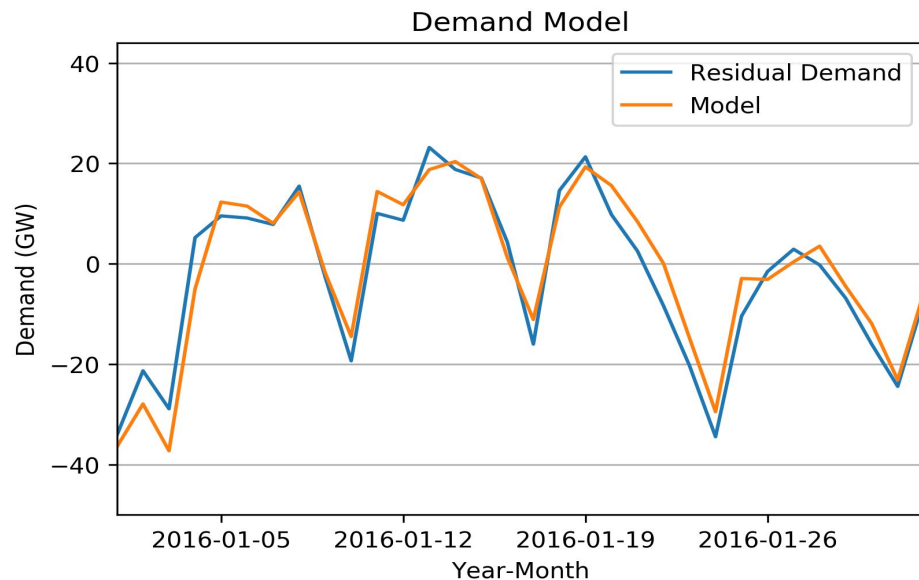
- Climate, GDP, elec price, tech, society.

Seasonal:

- Temperature, daylight...

- Day of Week
- Holidays
- Weather

# Weather Driven Demand



$$D_R = aTe + bTe^2 + cCloud + dWind + eDay + fHol + gXmas$$

$$D_{RW} = D_R - eDay - fHol - gXmas$$

Atmospheric patterns  $\propto$  Demand. Extremes.  
Spatial Demand

# Probabilistic forecasting

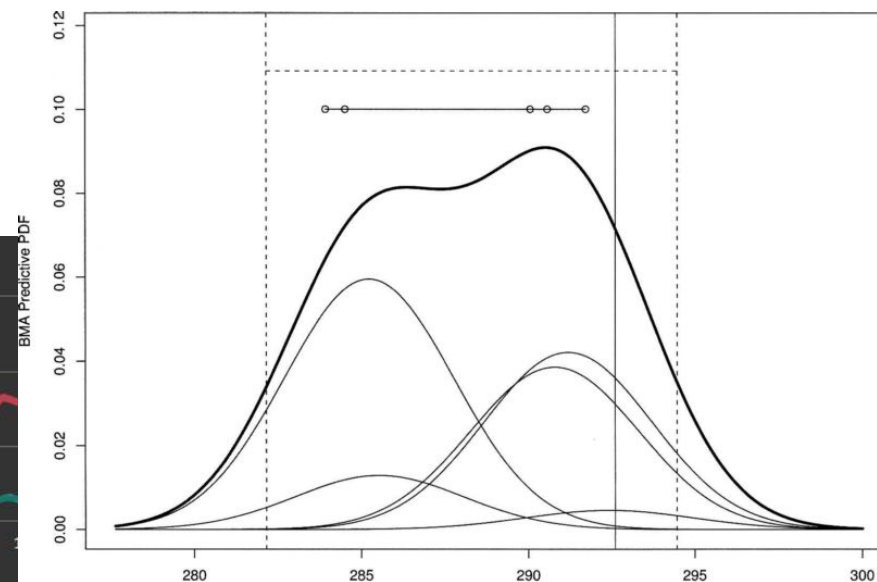
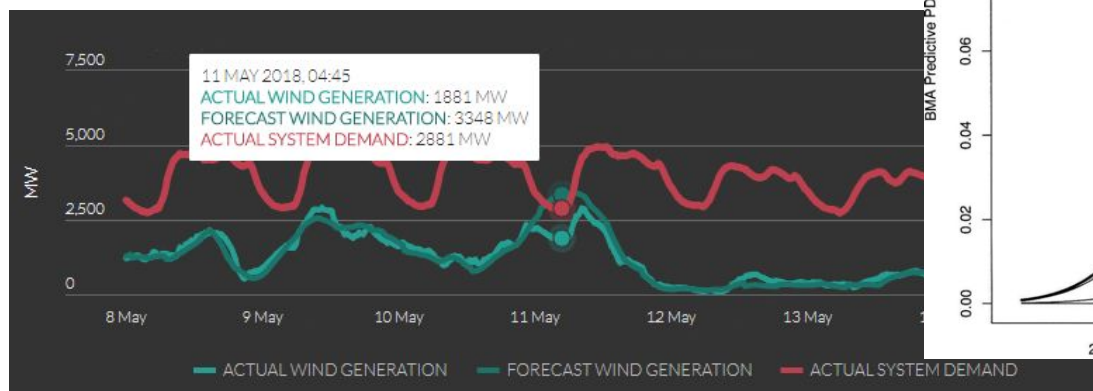
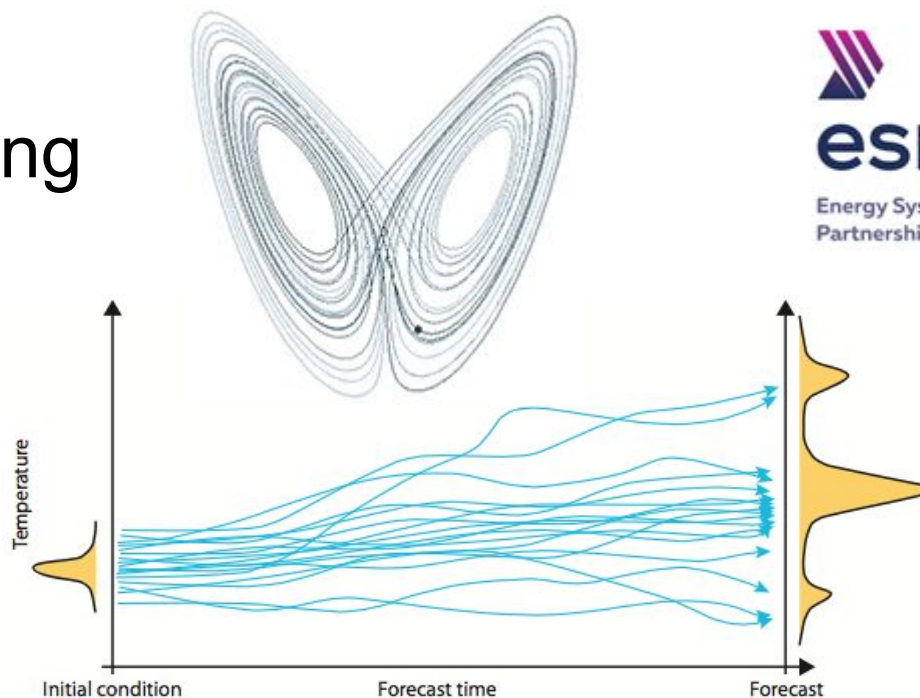
Chaos

High-Res Ensembles

- Adaptive physics
- Satellite updates

Post-processing

Bayesian Model Averaging



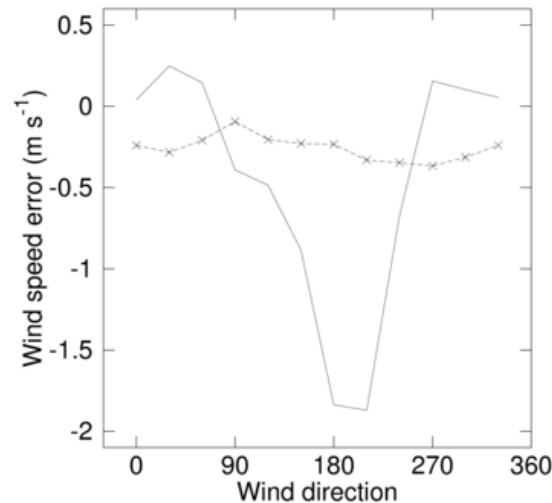
# MultiVariate Spatial Post-Processing

Wind speed,  
direction. T2m.  
Cloud, type.  
Stability, CAPE.

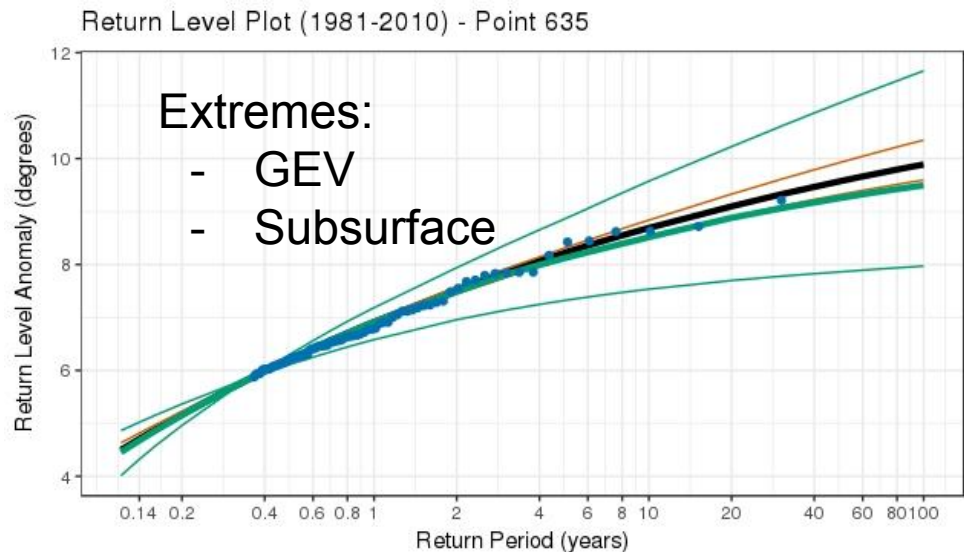
MultiVariate

Spatial input:  
Pattern recognition

- MSLP.
- Jet stream.
- 500hPa T



Spatial PP:  
Hyperparameter  
surface



# Thank you.