



Weather Intelligence  
for Wind Energy  
**WILL4WIND**

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# **Weather Intelligence for Wind Energy - WILL4WIND project -**

Kristian Horvath, Alica Bajić, Stjepan Ivatek-Šahdan,  
and DHMZ team

[kristian.horvath@cirus.dhz.hr](mailto:kristian.horvath@cirus.dhz.hr)



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Science and innovation investment fund, contract no. IPA2007/HR/16IPO/001-040507  
EWGLAM, Offenbach, 30 Sept 2014



# What means to manage energy?



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## Wind energy management is

- Knowing what to do with produced energy
- How frequent is balance of production and consumption?
- Includes issues of planning (transmission, scheduling, maintenance, trading, ..)
- Thus predictions are required for efficient energy management
- Near-surface wind variability and predictability are key words here

## Predictions

- Required forecast horizons from seconds to weeks
- Required realistic treatment of uncertainty

Wind forecasting

Wind energy forecasting

Transmission and delivery

Markets



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# Wind energy in Croatia



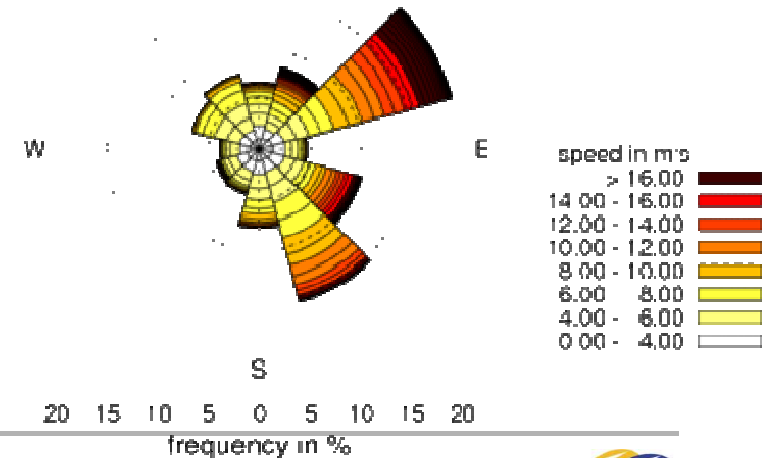
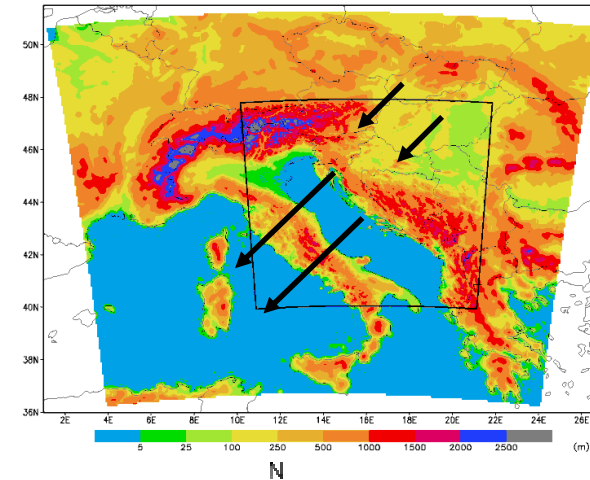
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## Wind energy in Croatia

- Wind energy is an accelerating business in the coastal part of Croatia (currently ~10% of installed total national energy production capacity)
- Plans for 3x by 2020

## Challenges

- The coastal area of Croatia has a specific wind climate
- Complex coastal terrain prone to strong winds, esp. severe, turbulent NE bora windstorms
- May reach wind speeds of 40 m/s, gusts of 70 m/s and TKE of 65 J/kg



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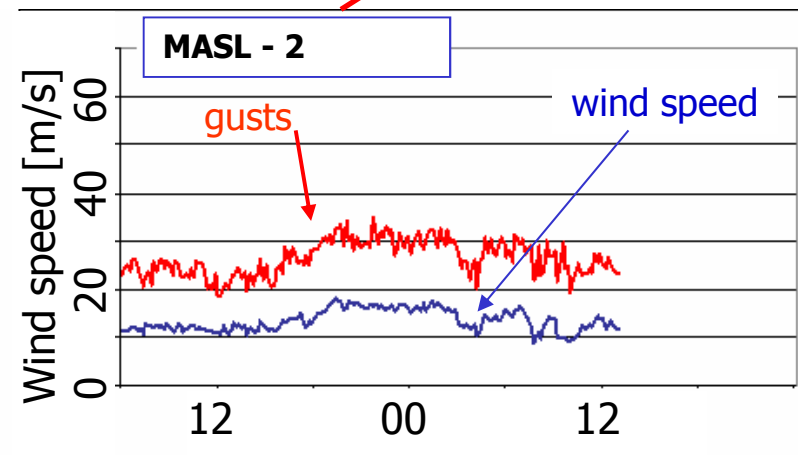
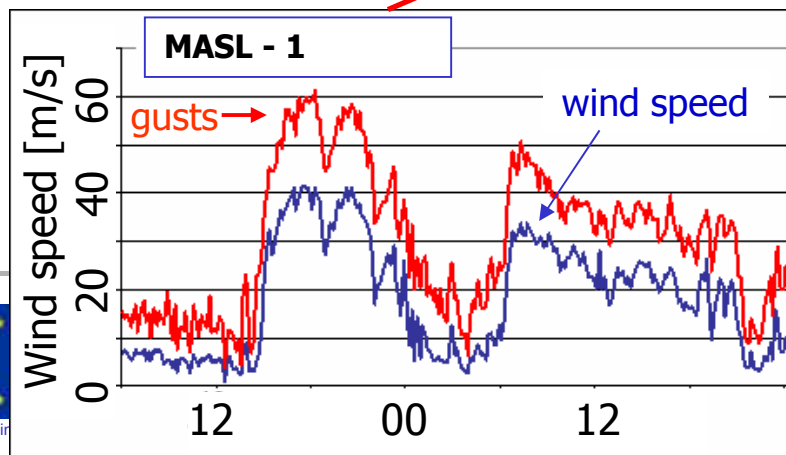
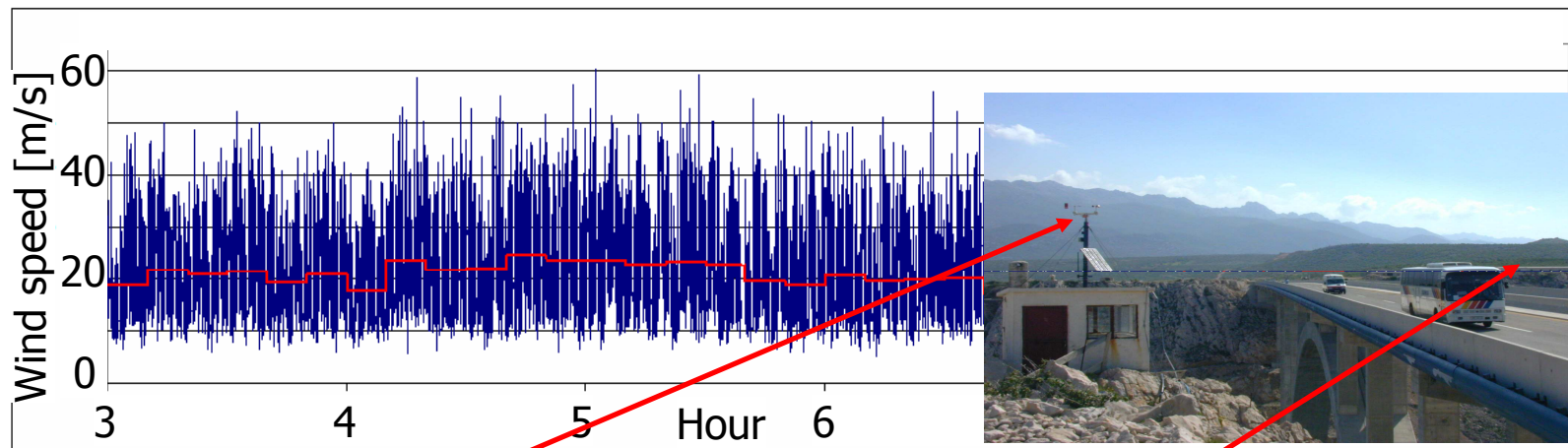
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# Wind energy in Croatia

## Bora flows

- large temporal and spatial variability beyond NWP capabilities



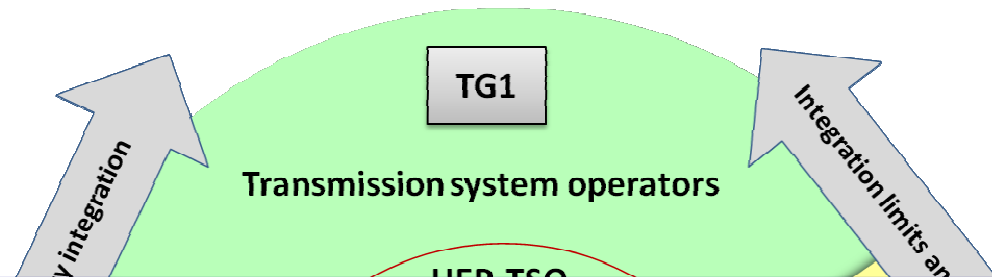
# Project consortium: “handling all aspects”



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## WILL4WIND project

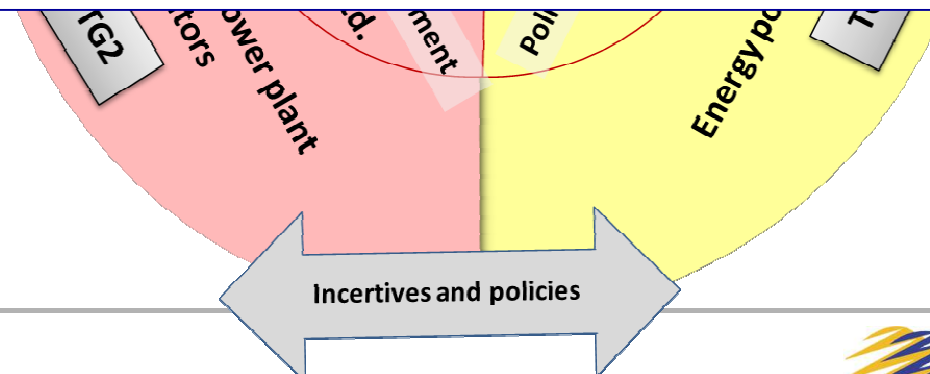
- Starting date: 10 Apr 2013
- Duration: 2 years



**Energy systems are local-oriented – needs for local interactions**

**Croatian consortium = Solutions for specifics of the wind climate**

- TSO (Croatian)
- Energy Inst. Hrvoje Požar
- SME (RPGP)
- (Wind turbine producer Končar)



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# ALADIN model chain



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- Meteorological aspects
  - NWP modelling
  - Statistical modelling
- Period 2010-2012

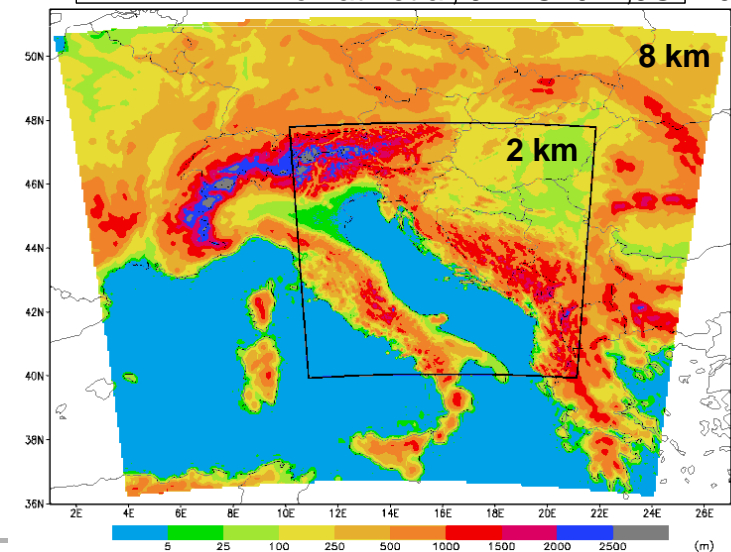
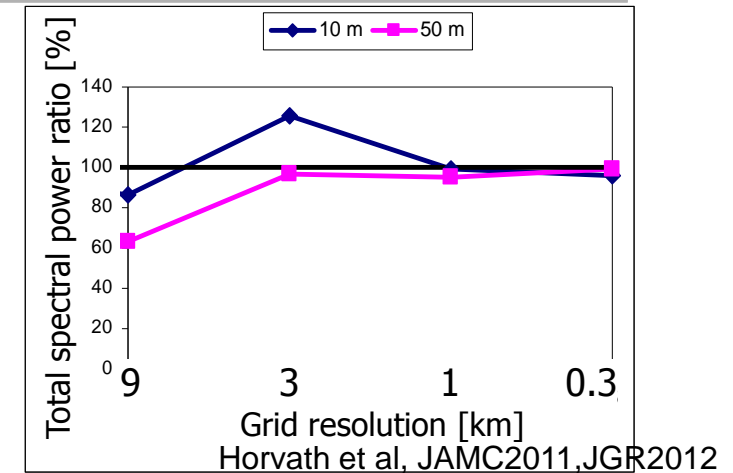
**GLOBAL MODEL(S)**  
**ARPEGE/IFS (&IFS)**

**ALARO32T3+3DVar**

Grid spacing  $\sim 8$  km, +72h  
(MPS-Catry et al., 2007; Geleyn et al., 2008  
CPS-Gerard et al., 2009; PBL-Geleyn et al. 2006)  
(national poster!)

**1. ALADIN (DADA)**  
Dx  $\sim 2$  km, +72h

**2. ALARO36T1-NH**  
Dx  $\sim 2$  km, +30h



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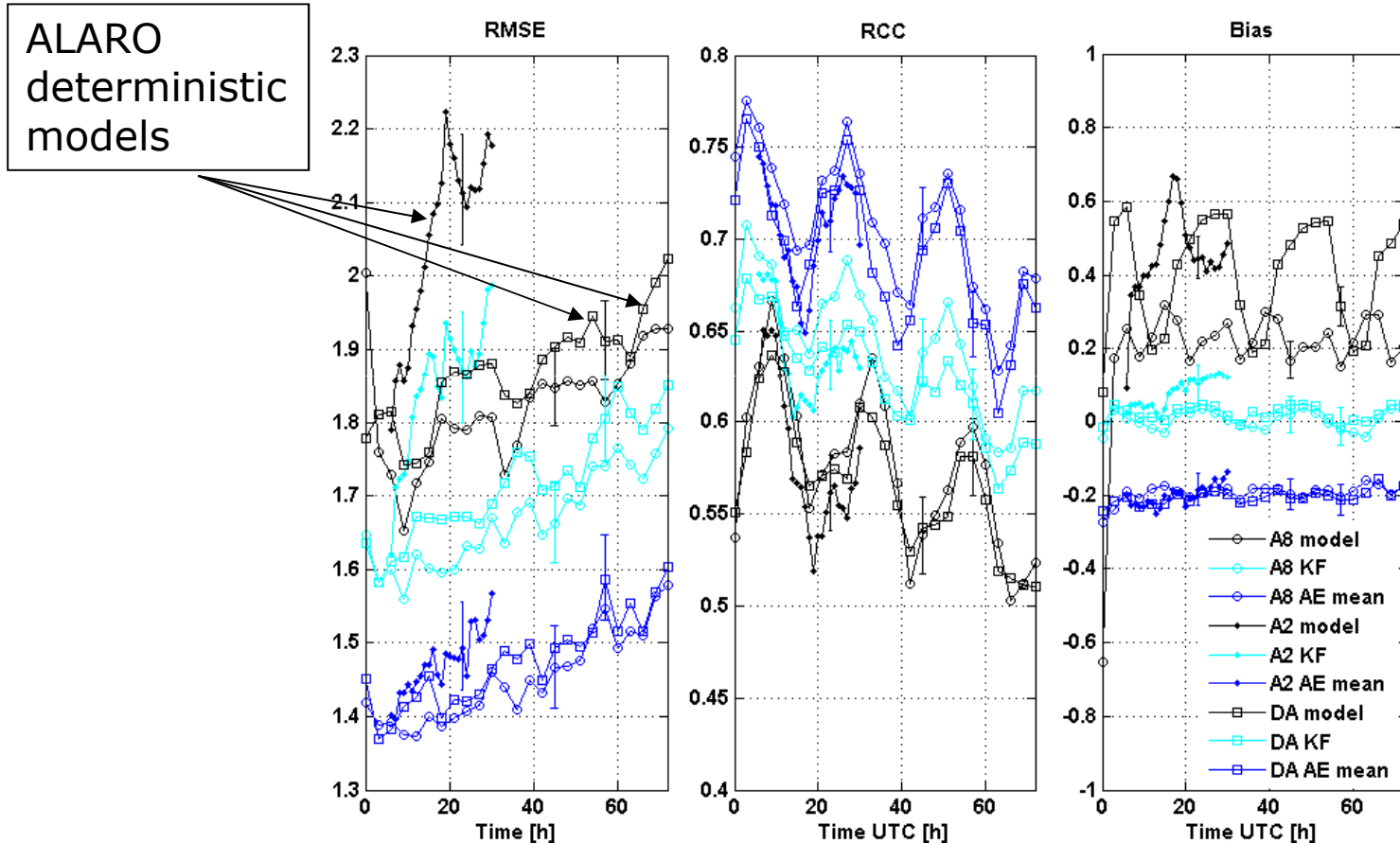


# ALADIN model chain



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## ■ Statistical verification: generally similar results



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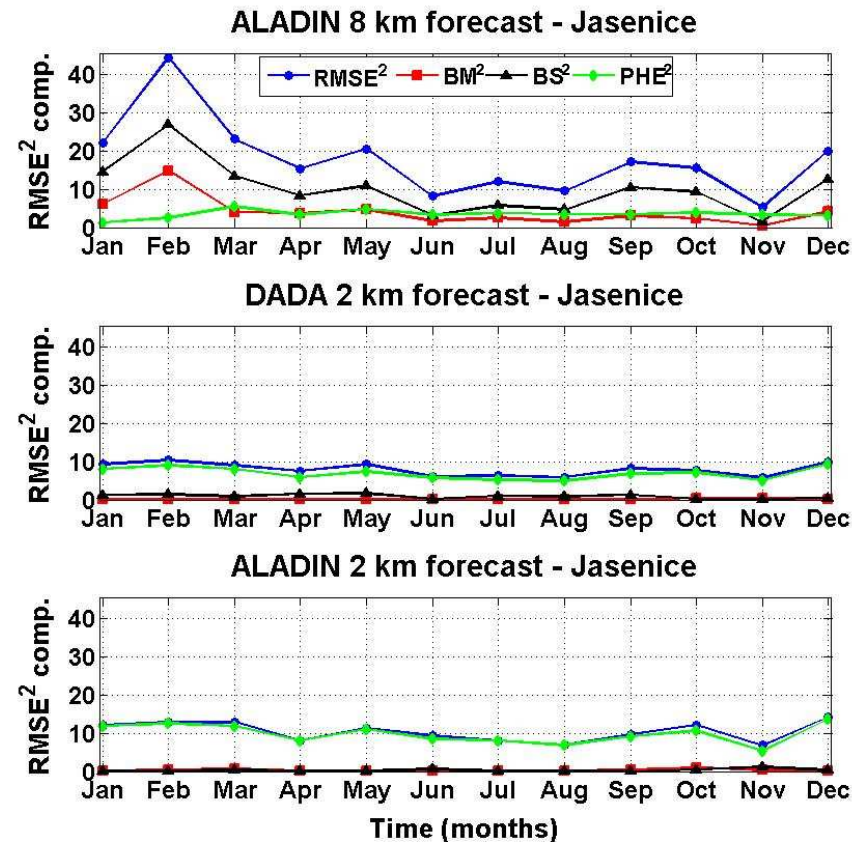


# ALADIN model chain



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- However, large differences in coastal areas prone to bora flows
- RMSE decomposition (e.g. Murphy, MWR1988)



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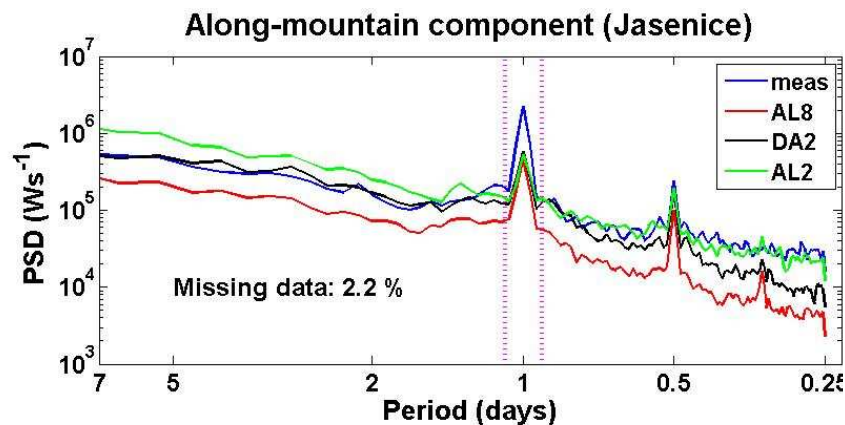
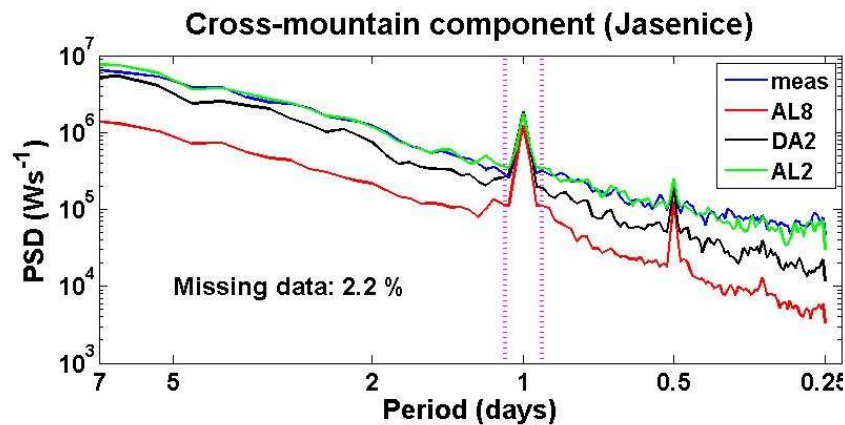




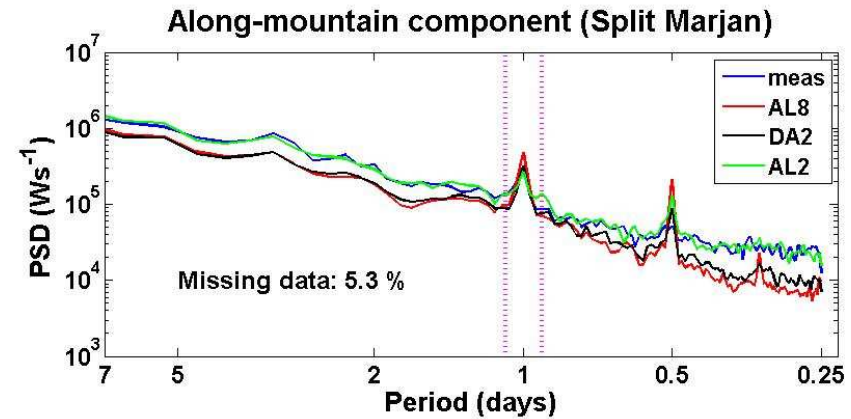
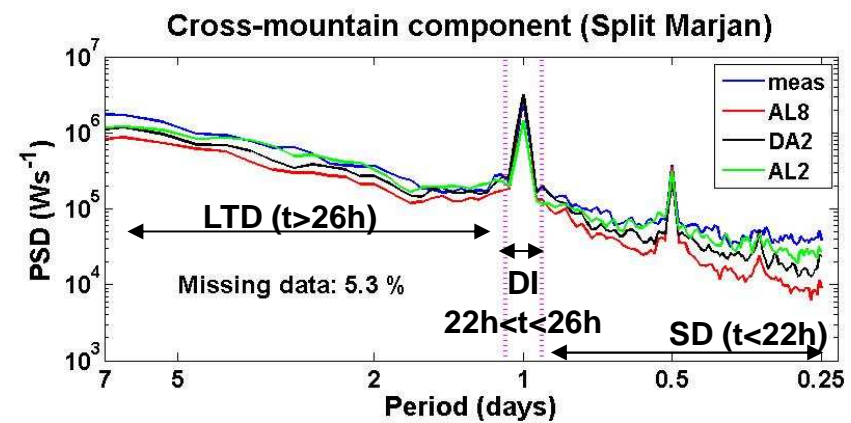
# ALADIN model chain

## ■ Spectral analysis and phase-error tolerant measure in spectral space

### Coastal station with strong bora



### Regular coastal station



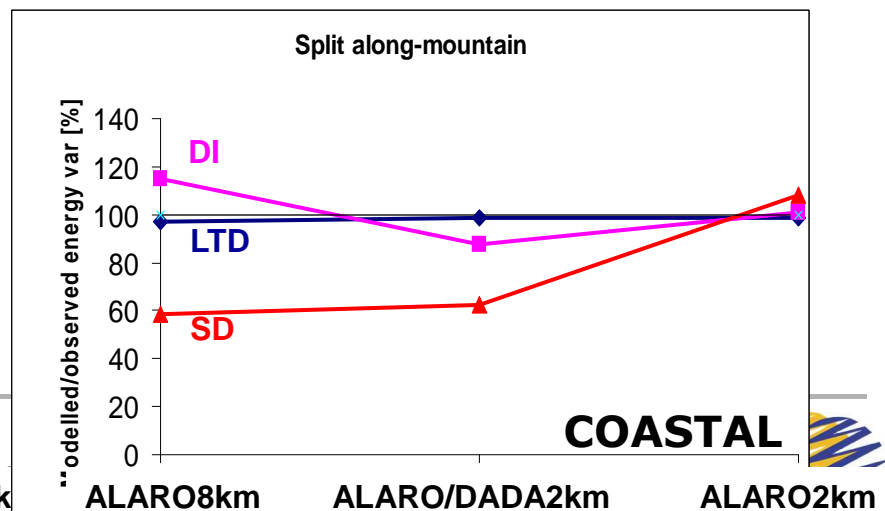
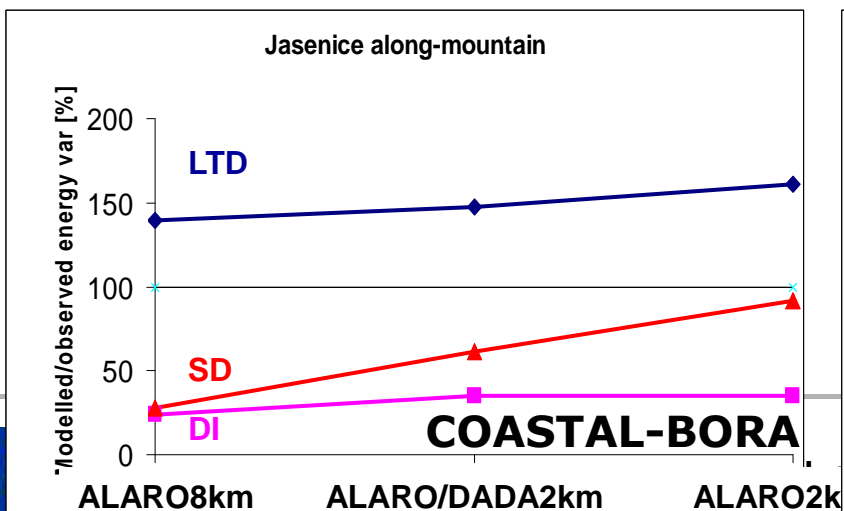
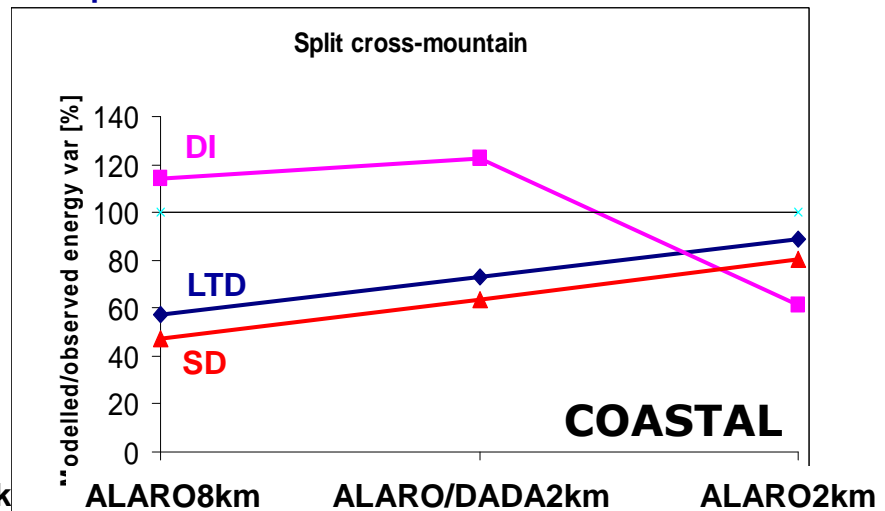
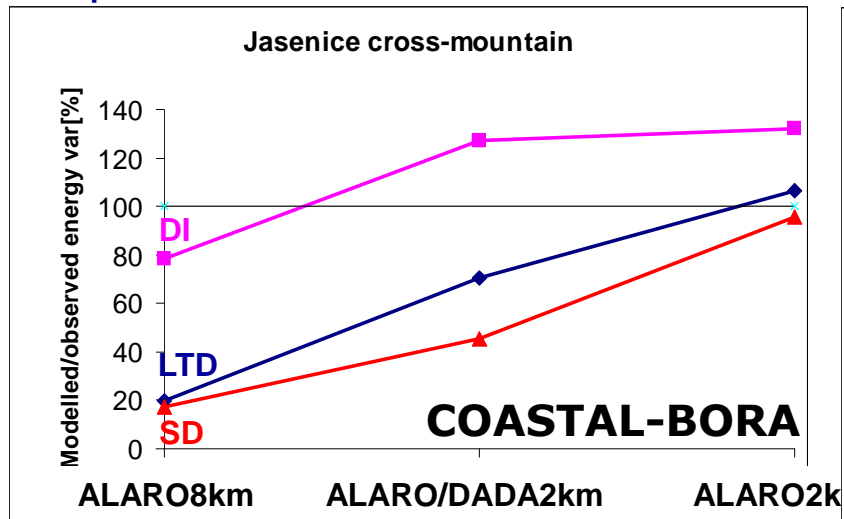
WIND4ALL, Eisenbach, 30 Sept 2014

# ALADIN model chain



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## ■ Spectral measures indicate clear improvement

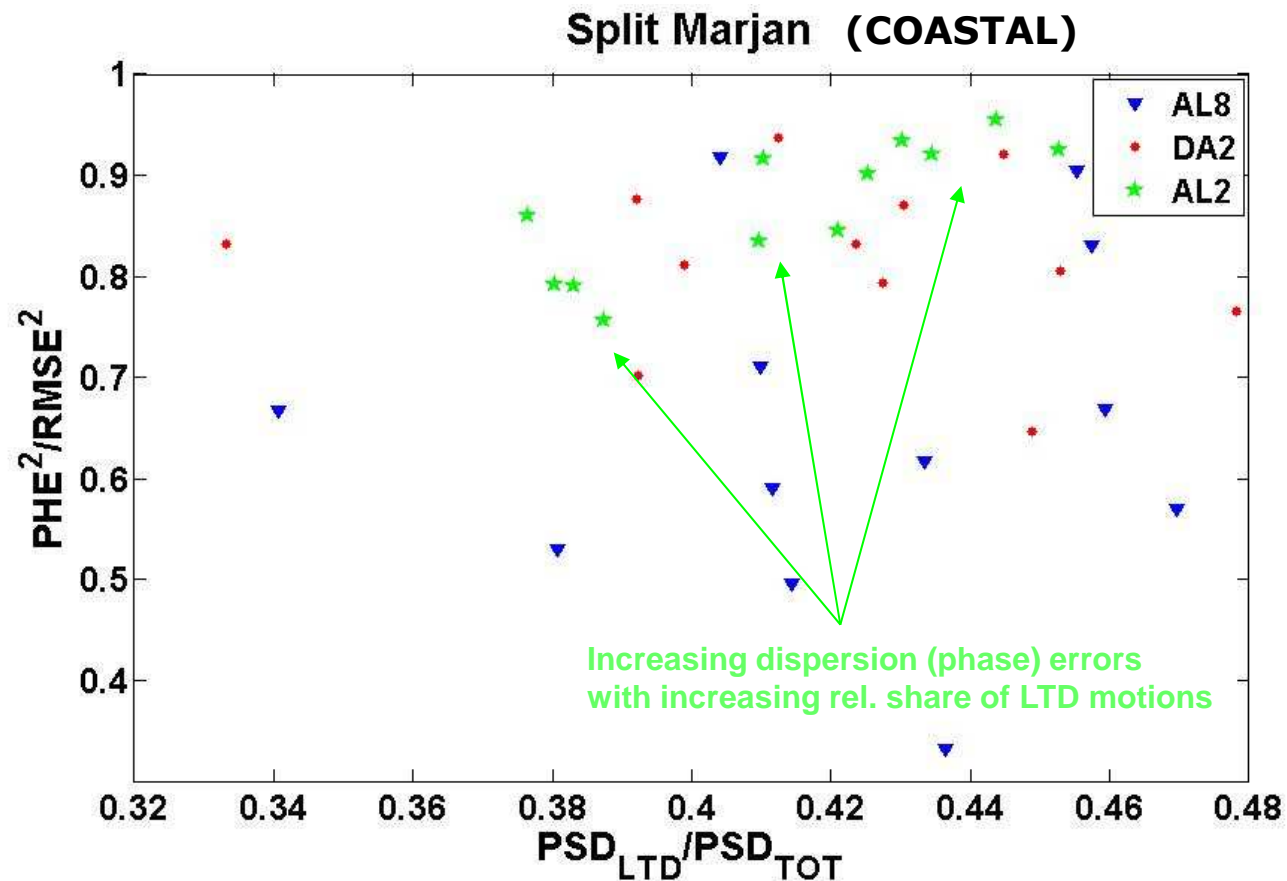


# ALADIN model chain



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- Relating statistical and spectral verification (monthly averages)



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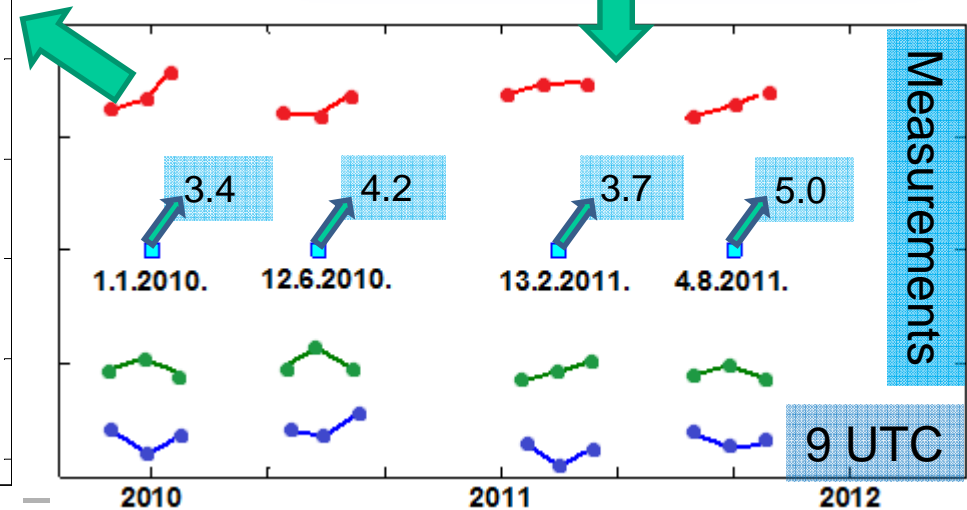
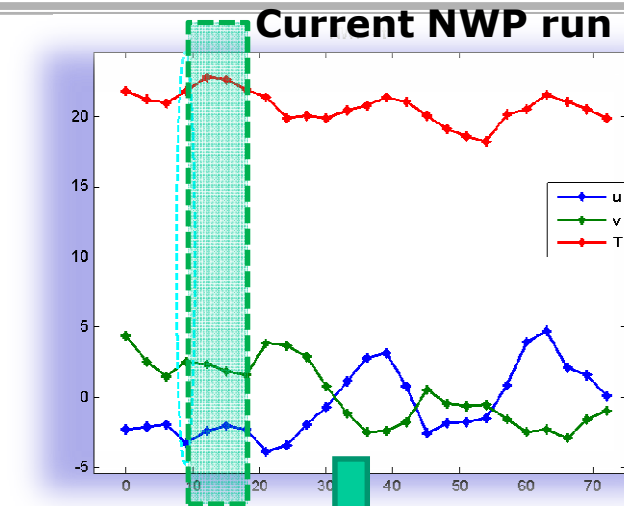
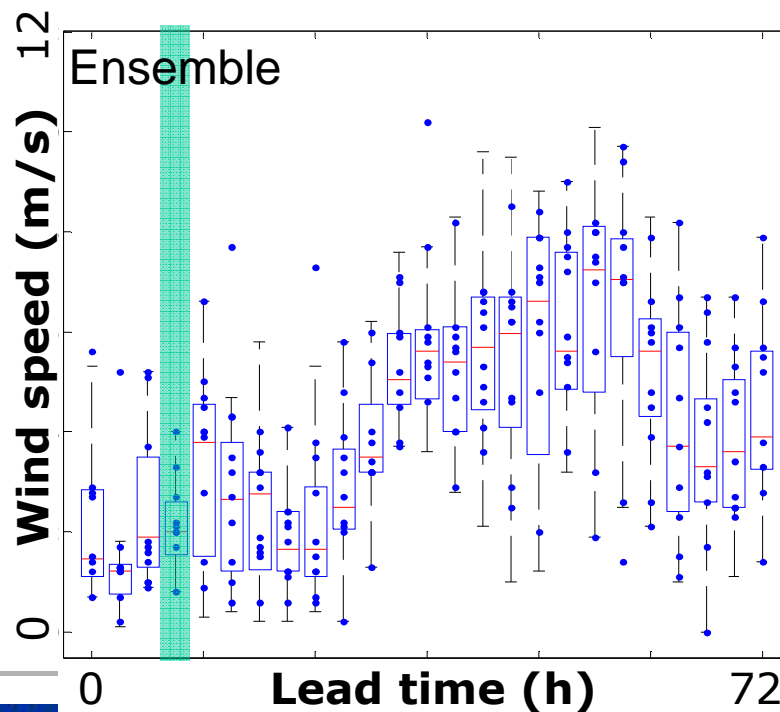


# Statistical modelling



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- The “analogue” ensemble method (delle Monache et al., 2011,2014)
- For N the most resembling historical forecasts create an ensemble from corresponding measurements

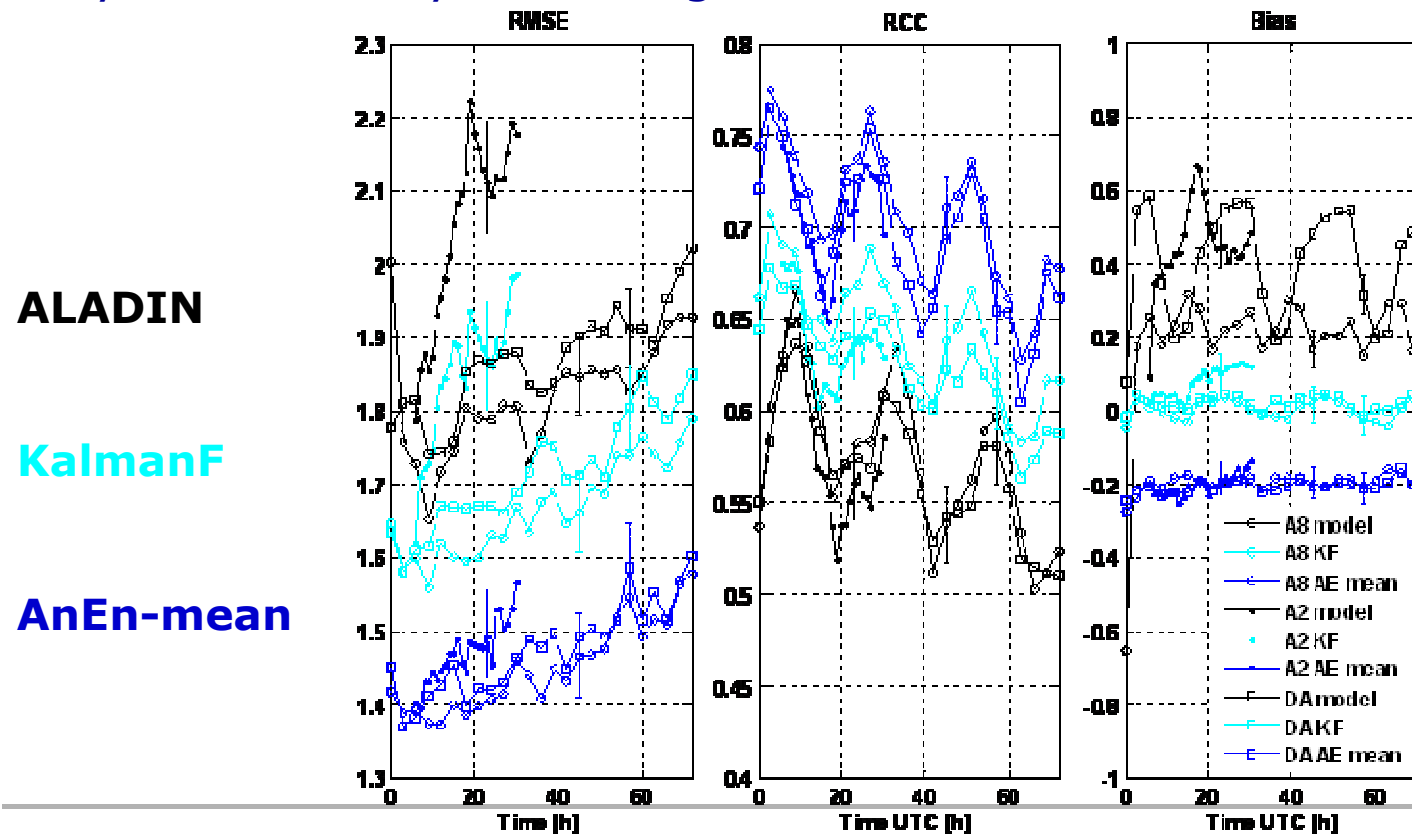


# Statistical deterministic modelling



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- The performance of deterministic (postprocessing) models
- After applying statistical modelling, the resolution of NWP is not a key issue if analyzed through common measures



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# Statistical deterministic modelling



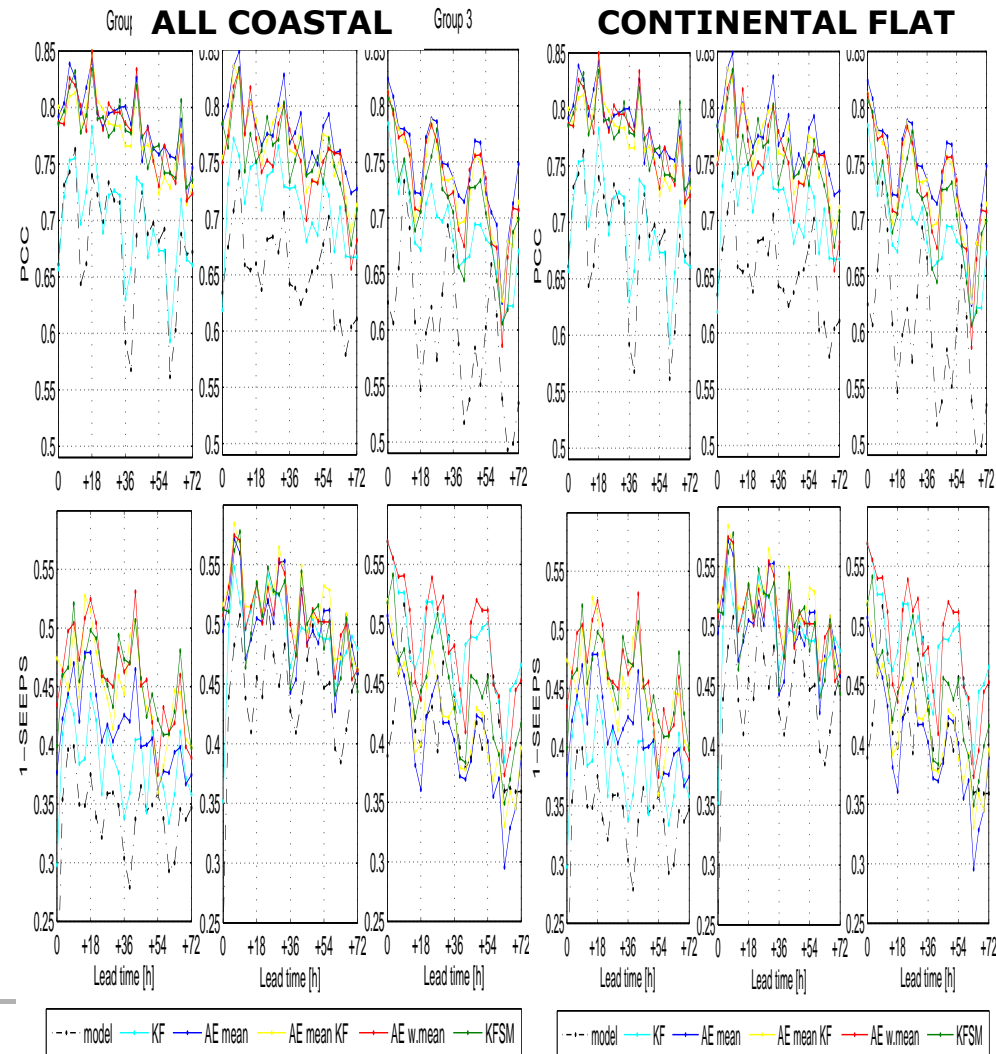
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## Methods

- Kalman filter
- AE-mean
- AE-w.mean
- KF of AE-mean
- KF of sorted AE metrics
- benefit from AE larger in coastal terrain

## Other measures

- PCC – Polyhoric correlation coefficient
- SEEPS – The Stable Equitable Error in Probability Space
- CSI – Critical success index
- FB – Frequency bias



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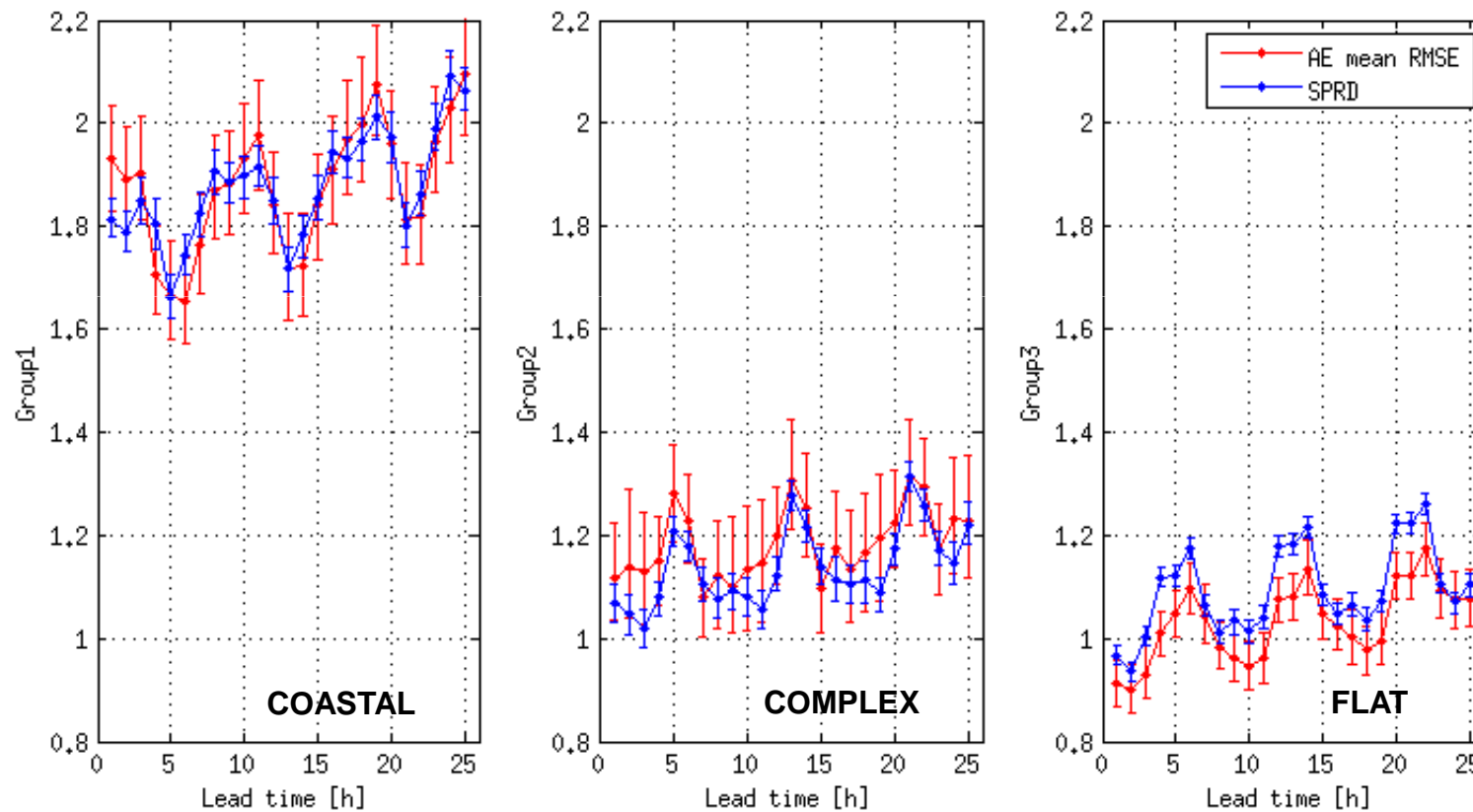
DHMZ

# Statistical probabilistic modelling



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## ■ Comparison of spread and RMSE for AE



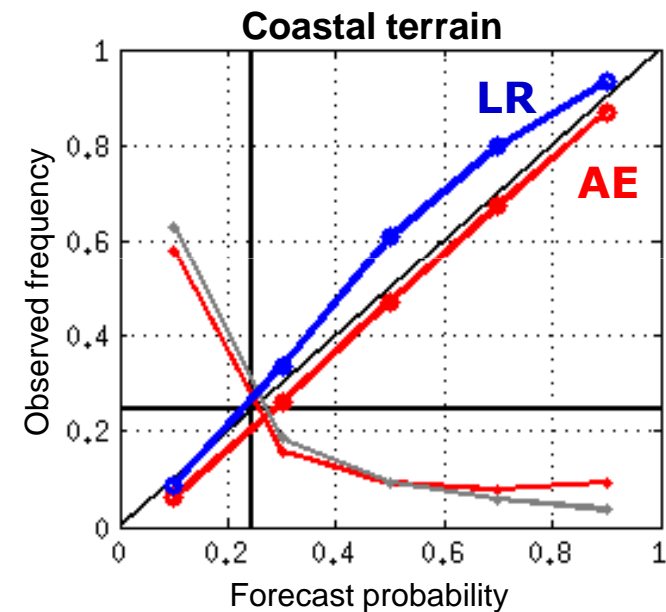
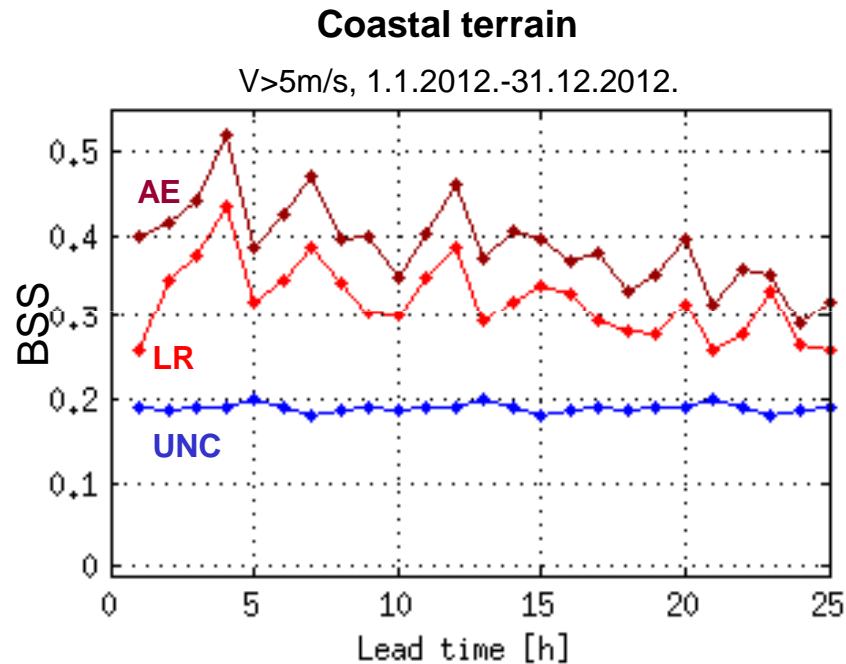
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## ■ Comparison of logistic regression and analogue ensemble



# Nowcasing (0-3h lead time)



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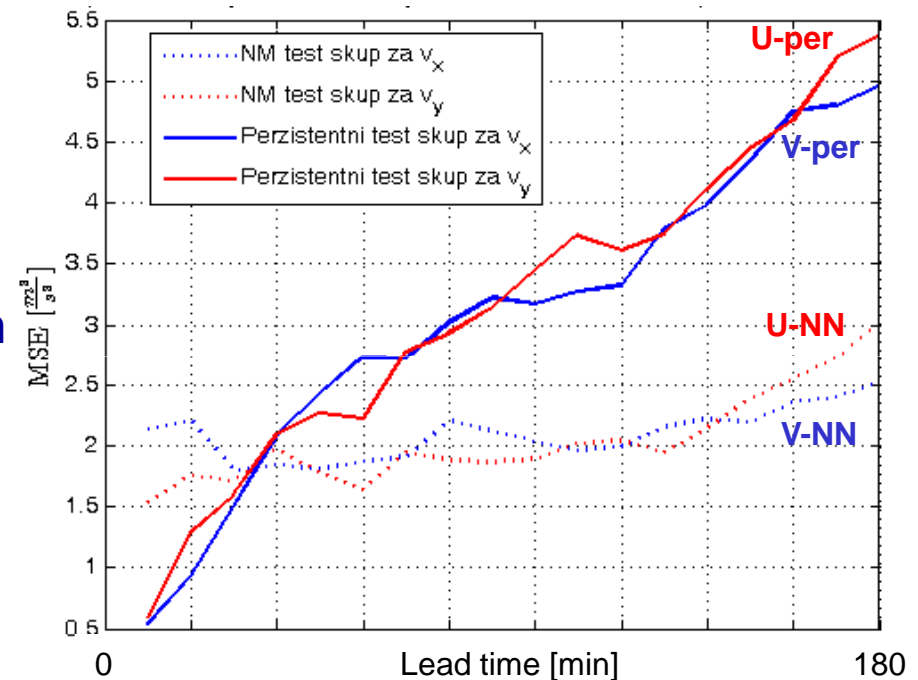
## Challenge

- Due to secondary regulation, the greatest technical constraint for TSO is on 10-30min ahead predictions

## Methodology

- Neural network-based approach
- Forecast refreshed every 10 minutes for forecast range 3 hours
- Preliminary results reduce MSE for lead times +2hr by 40% (vs persistence)

Neural network (36 outputs) w. Persistence



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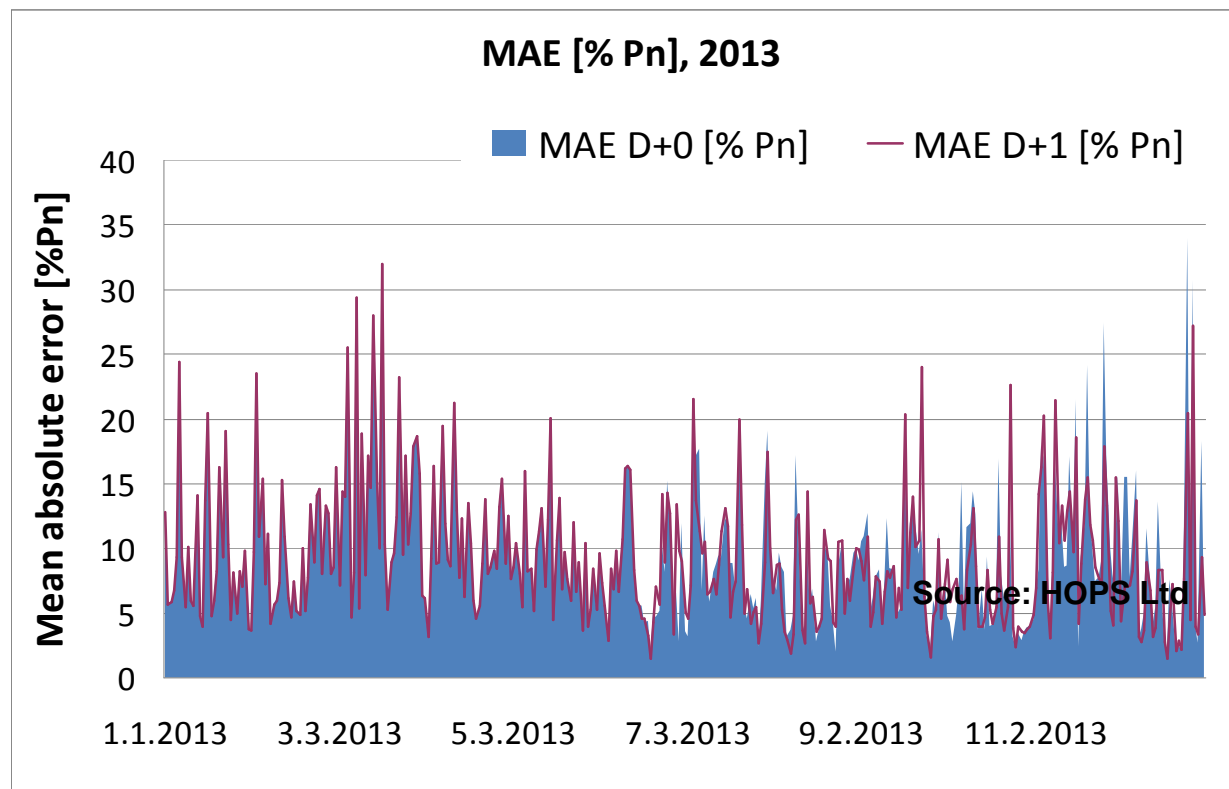


# In the end of the day



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- Croatian TSO uses ALADIN weather forecast in WPPT wind energy production software
- MAE in 2013 was 9% of installed capacity for day-ahead planning



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# Instead of conclusions...



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- The uptake of RES is an opportunity to strengthen collaboration between meteorology, ICT and energy sectors
- Meteorological aspects of wind energy are important, but are only one piece of a puzzle
- Meteorologists need to showcase their technologies are useful, and better understand the real needs of the wind energy sector
- Croatian wind climate is a good testbed for:
  - Demonstrating the value of high-resolution modelling
  - Studying different aspects related to severe winds



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# Thanks for your attention!



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