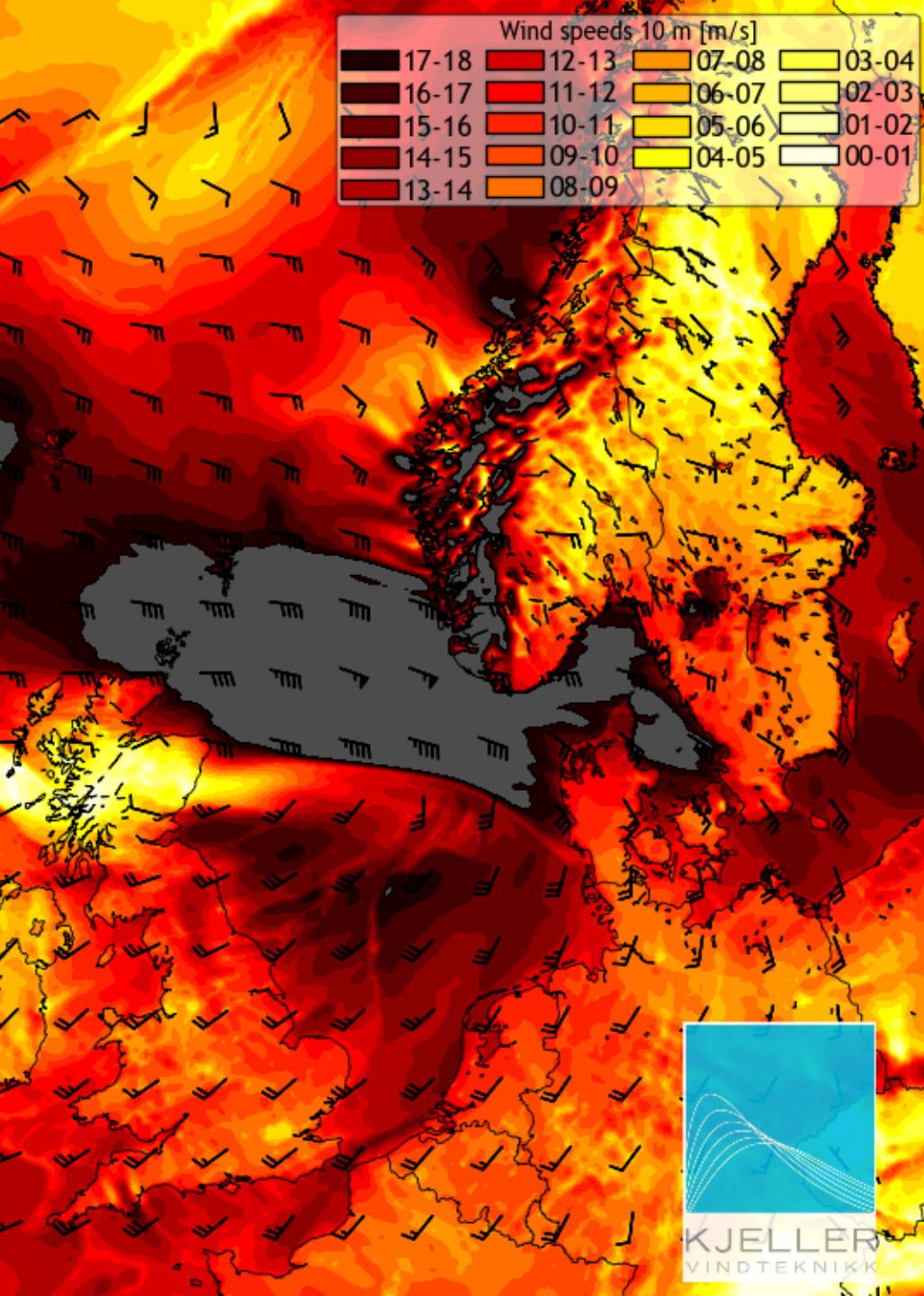




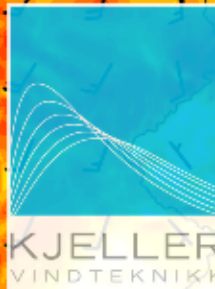
# Operational forecasting of icing and wind power at cold climate sites

Øyvind Byrkjedal, Rolv E. Bredeesen, Anne Line Løvholm  
oyvind.byrkjedal@vindteknikk.no



## Power forecasts

- WRF simulations at 6km x 6km resolution
- 4 times daily
- GFS 48 hour forecasts

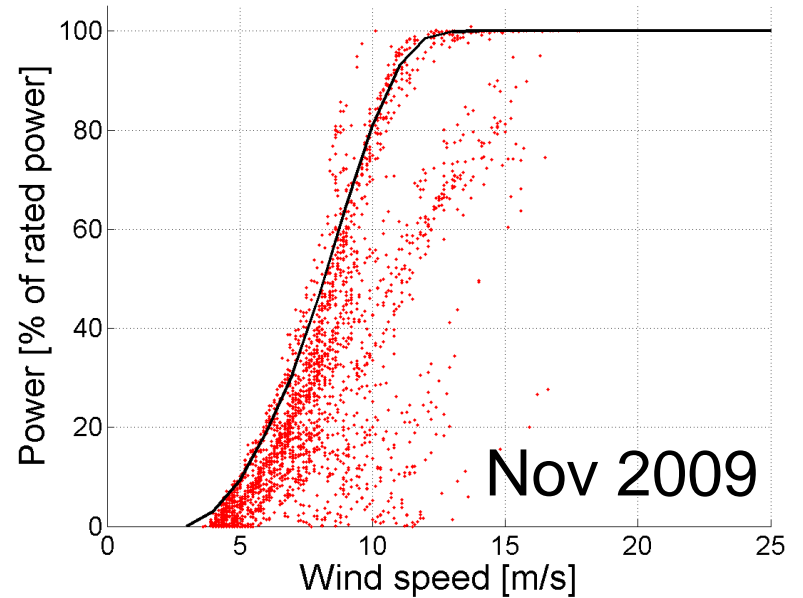
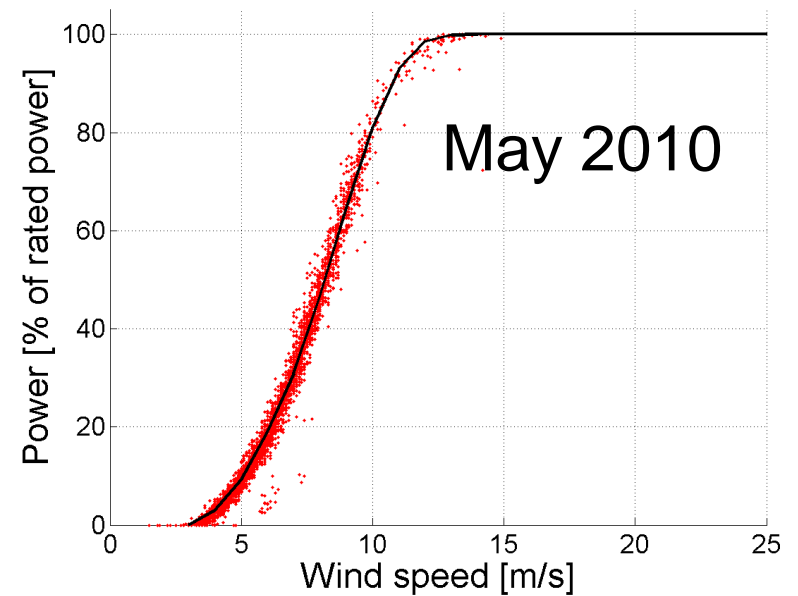




# Forecasting of icing

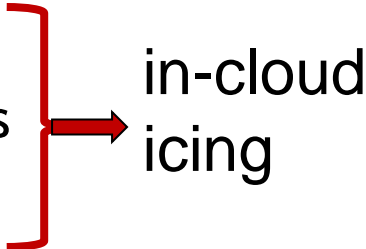
The aim is to know **when** icing will occur:

- Power trading
- Blade heating systems:
  - Start the heating before icing starts
  - Avoid unnecessary stops during heating
- Risks of ice throw / ice fall
  - Planning of maintenance
  - Public safety

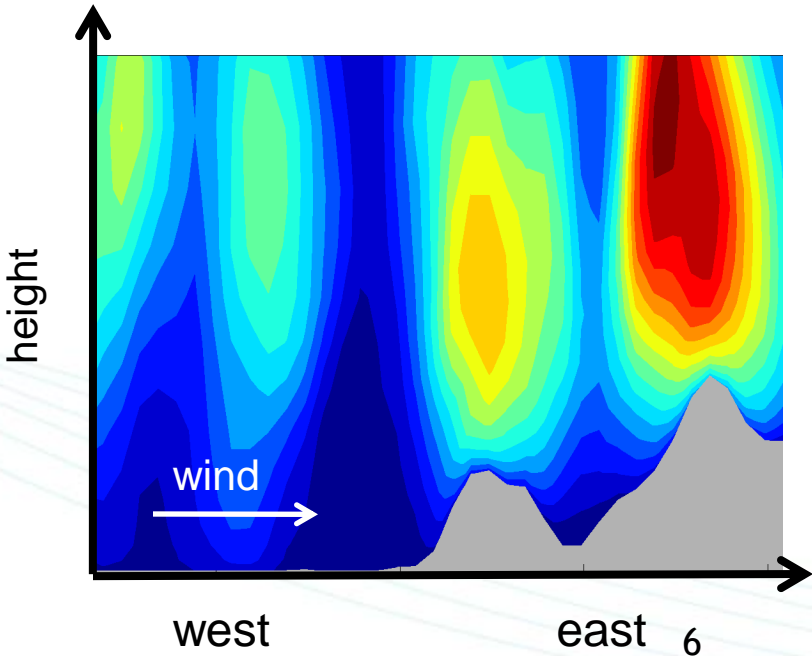


# Icing conditions

- Temperatures below freezing
- cloud or fog containing small water droplets
- Something to freeze to



- Lifting of airmasses  
    → condensation



# Calculation of in-cloud icing

- Icing intensity calculated according to ISO 12494:

$$\frac{dM}{dt} = \alpha_1 \alpha_2 \alpha_3 \cdot w \cdot A \cdot V$$

$\alpha_1$ - collision efficiency,  $\alpha_1 = f(V, d, D)$

$\alpha_2$ - sticking efficiency,  $\alpha_2 \approx 1$

$\alpha_3$ - accretion efficiency,  $\alpha_3 = f(V, d, w, T, e, D, \alpha_1)$

$w$  – cloud liquid water content

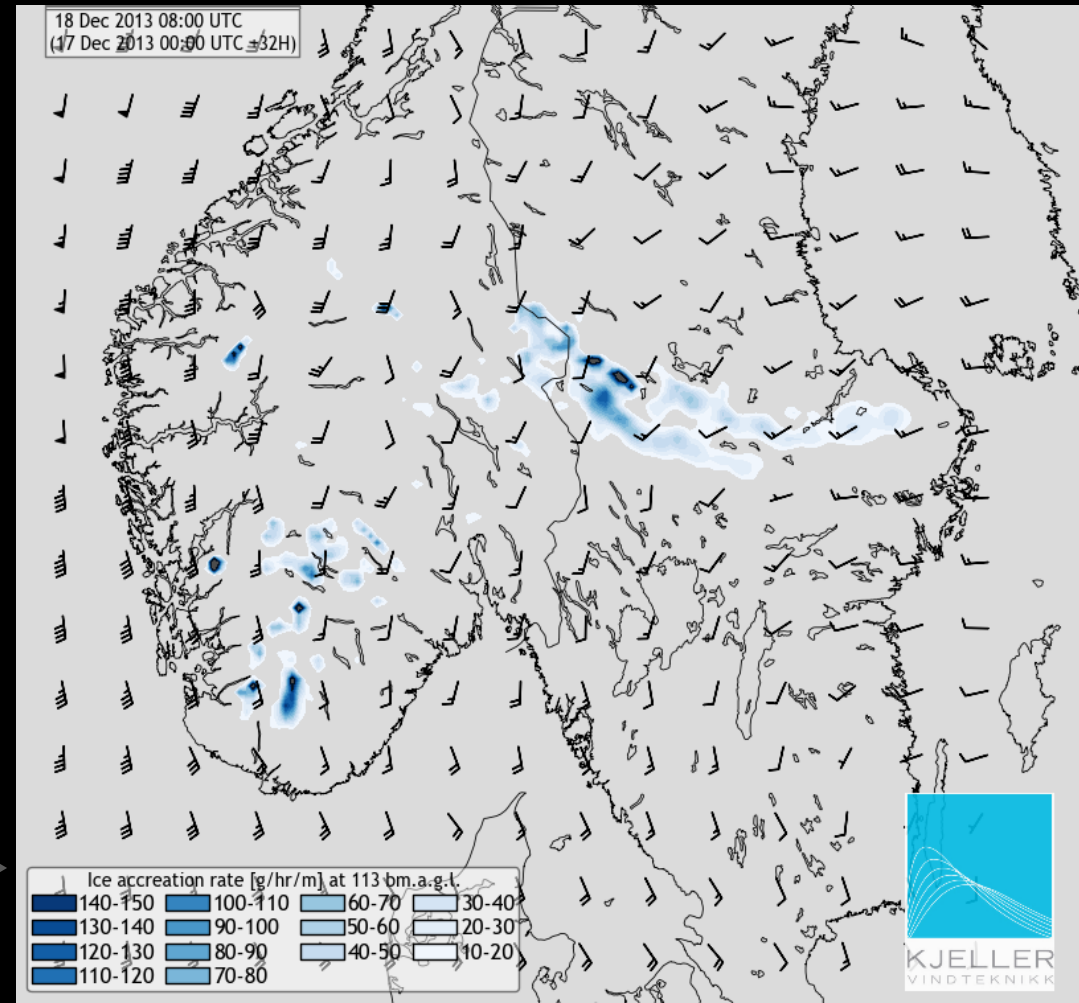
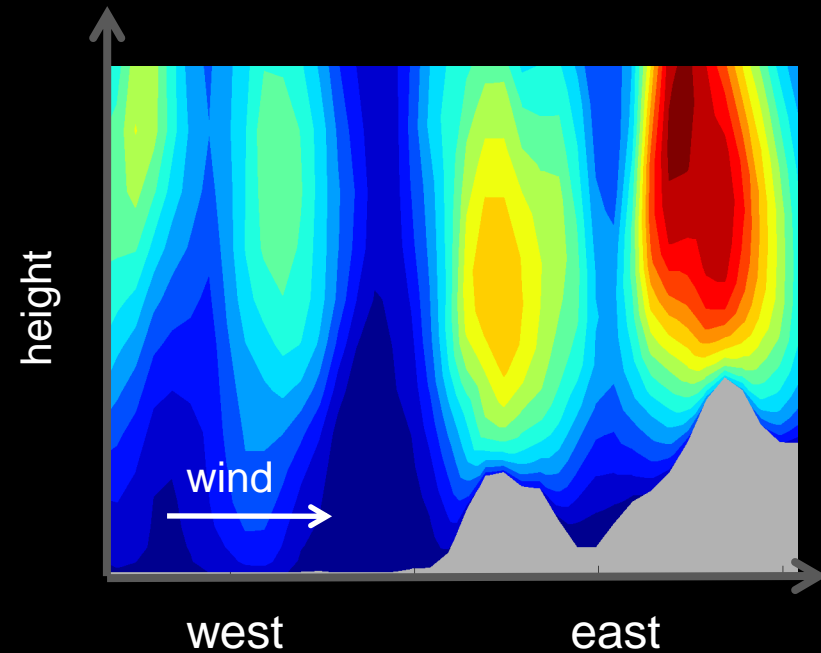
$A$  – collision area, perpendicular to flow

$V$  – Wind speed



# Forecasting - icing intensity

- Hourly values of icing intensity
- Accumulated ice loads

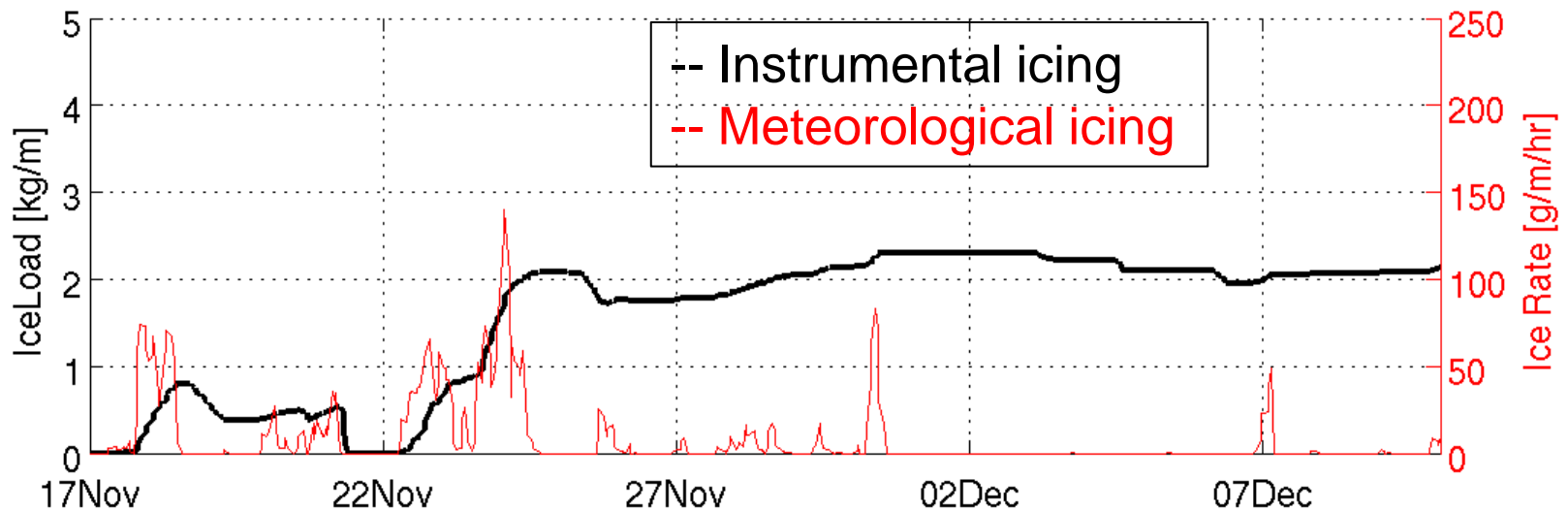
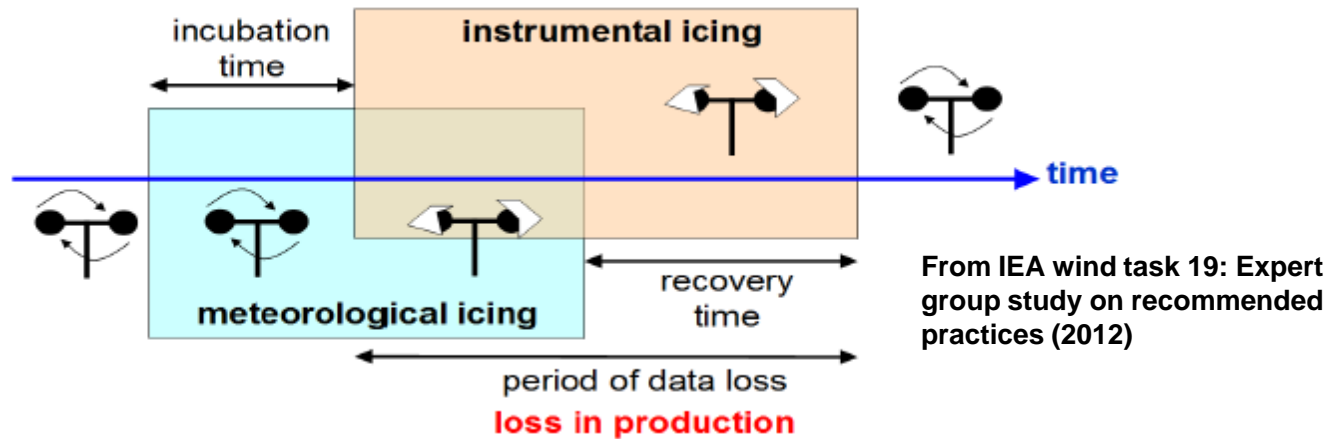


# Validation of icing forecasts



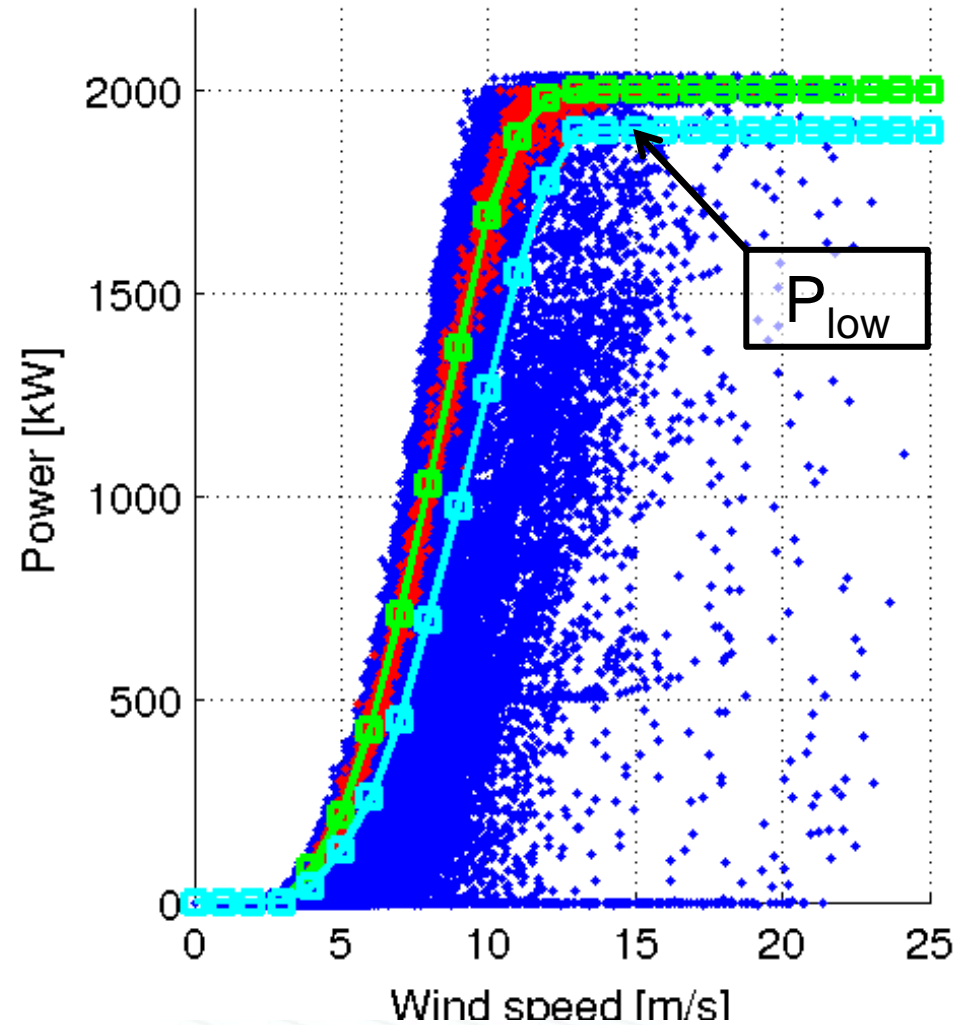


# Meteorological icing vs instrumental icing



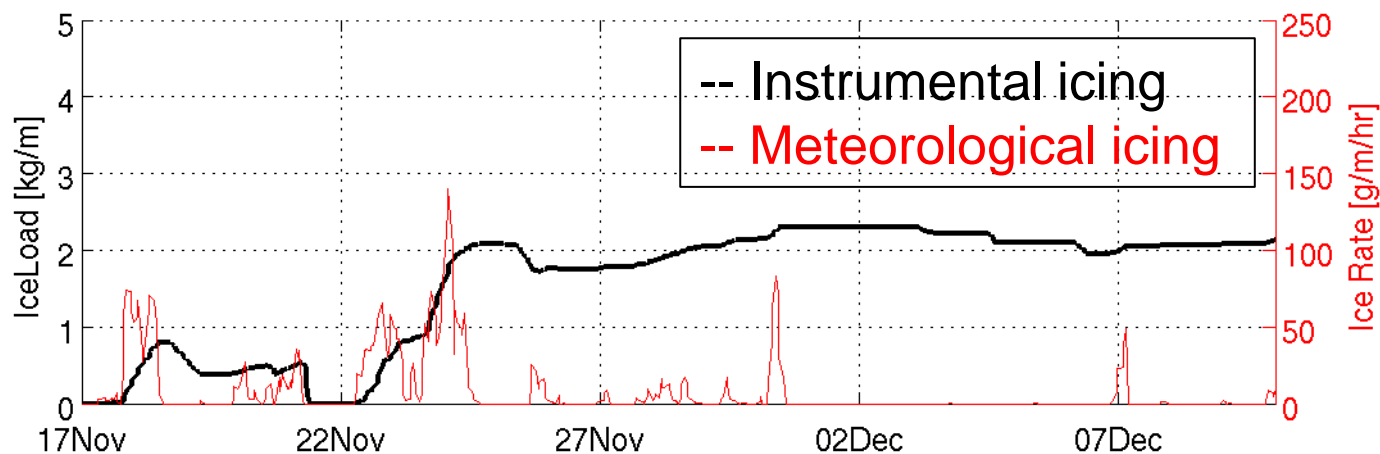
# Observation data

- Data from one wind farm:
  - 10 minute frequency
  - power, nacelle wind speeds, temperature, turbine alarms
- Identification of icing from power data:
  - Temperature treshold:  $T < +2$  °C
  - Power treshold:  $P < P_{low}$
- Definition of icing periods:
  - Icing identified for 3 or more turbines
  - Duration of minimum 12 hrs
  - Aggregated to 20% power loss or more

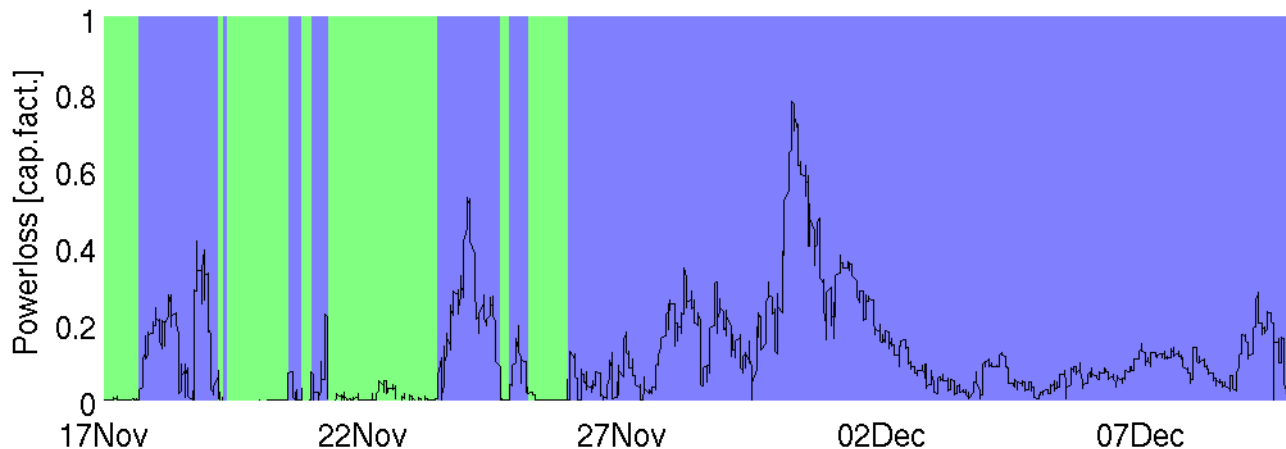


# Power loss during periods with instrumental icing

Modeled icing

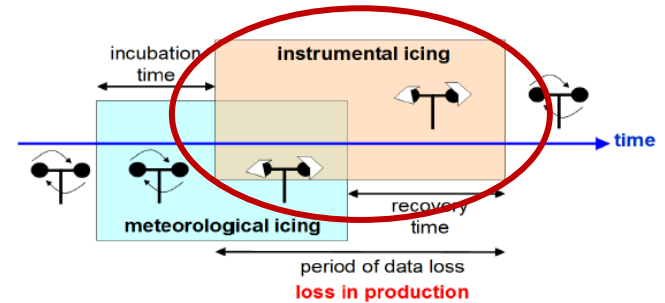


Observed icing and power loss



# Validation of instrumental icing

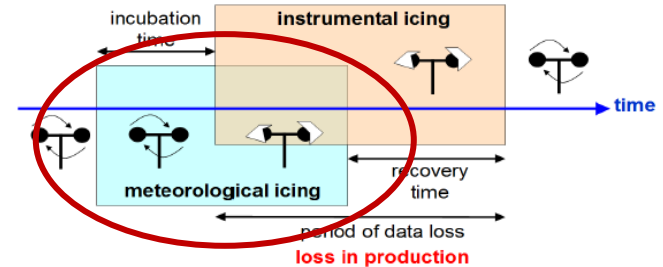
- The periods with observed instrumental icing compared to modelled periods with instrumental icing.
- 75 % of the time when the model indicates instrumental icing ice is also identified from the power data.
- 33% of the cases when icing influences the power, is not identified as icing by the model



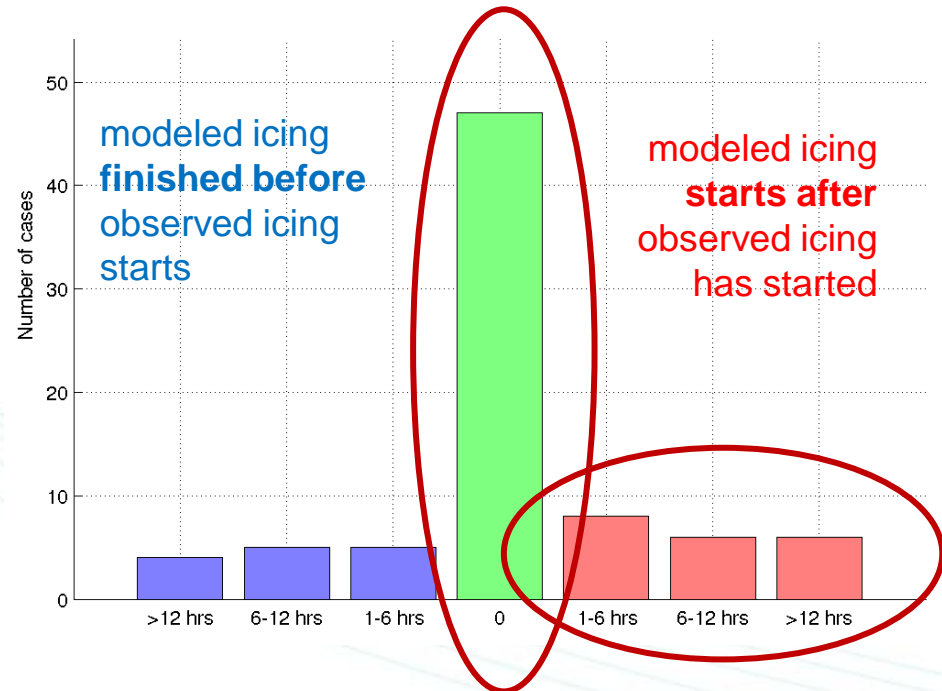
		Observations	
		iced	ice free
Modeled	iced	14 %	5%
	ice free	7 %	74 %

# Validation of meteorological icing - Timing

- 60 % of the observed icing episodes starts when the model indicates meteorological icing



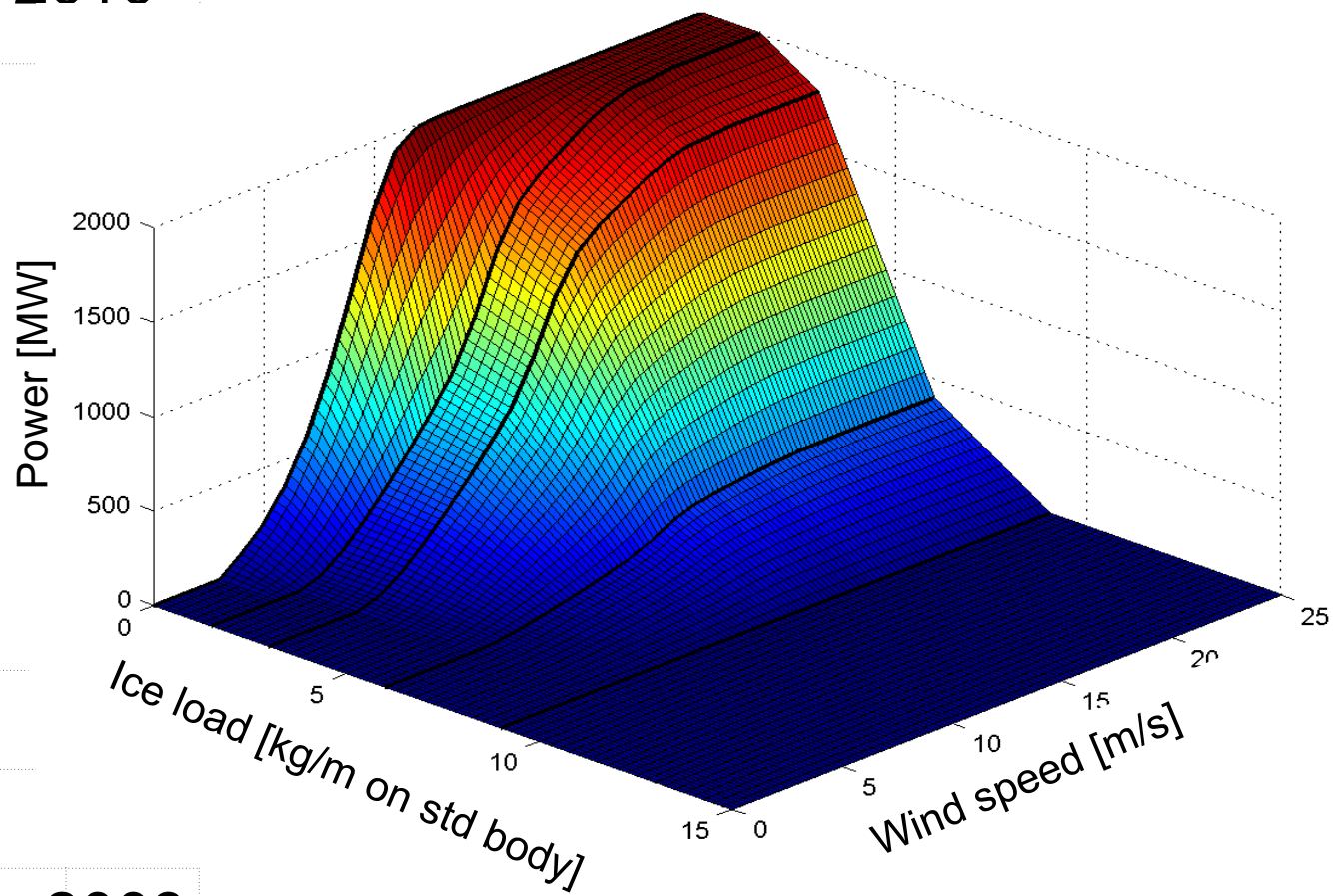
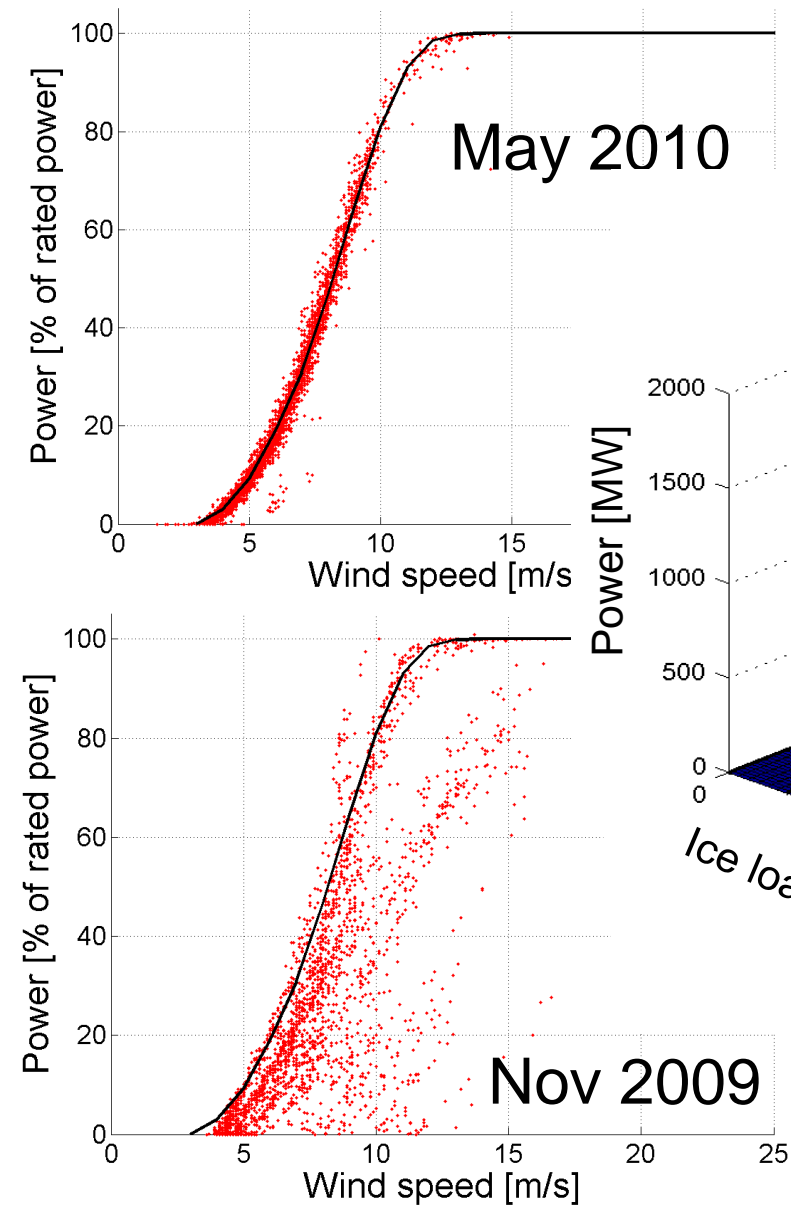
- Timing challenge:
  - In 25 % of the cases the model forecasted the icing too late
  - Time shift of the results gives improved timing of icing for this site
- False alarm rate:
  - 45 % of the modelled meteorological icing events did not show as reduced power output from the wind farm



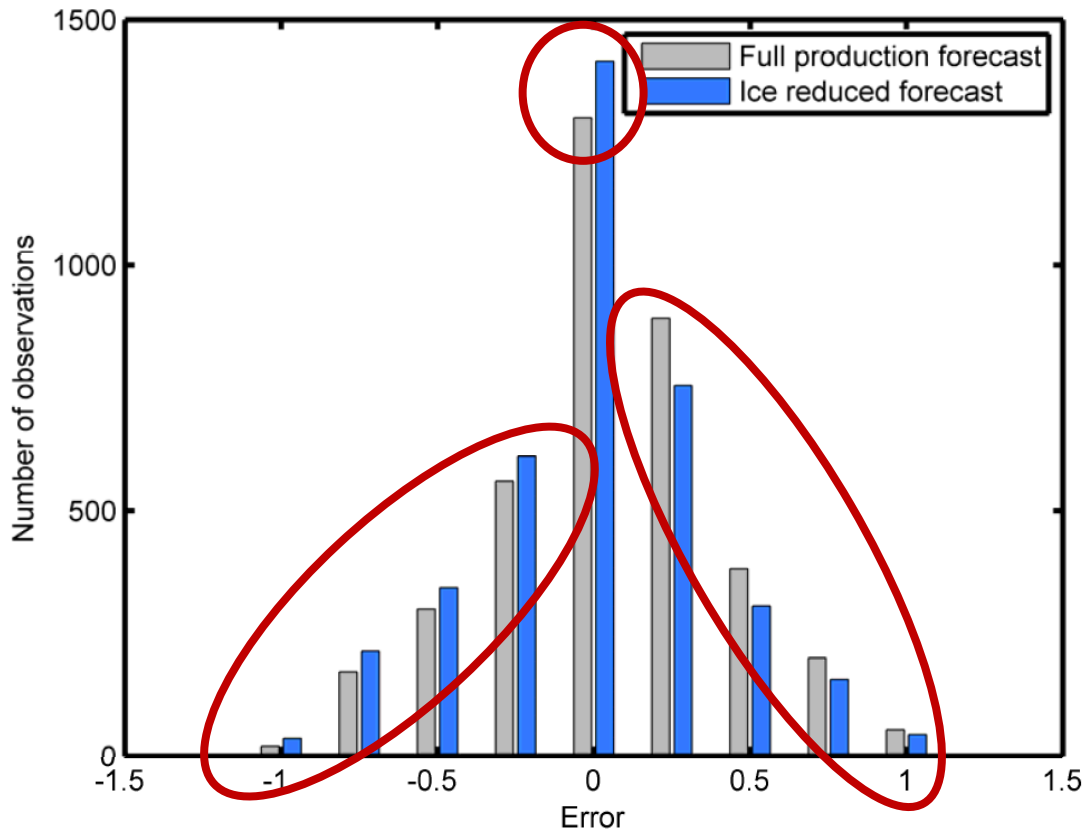
# Energy forecasts



# Forecasting of power losses



# Forecasting of power

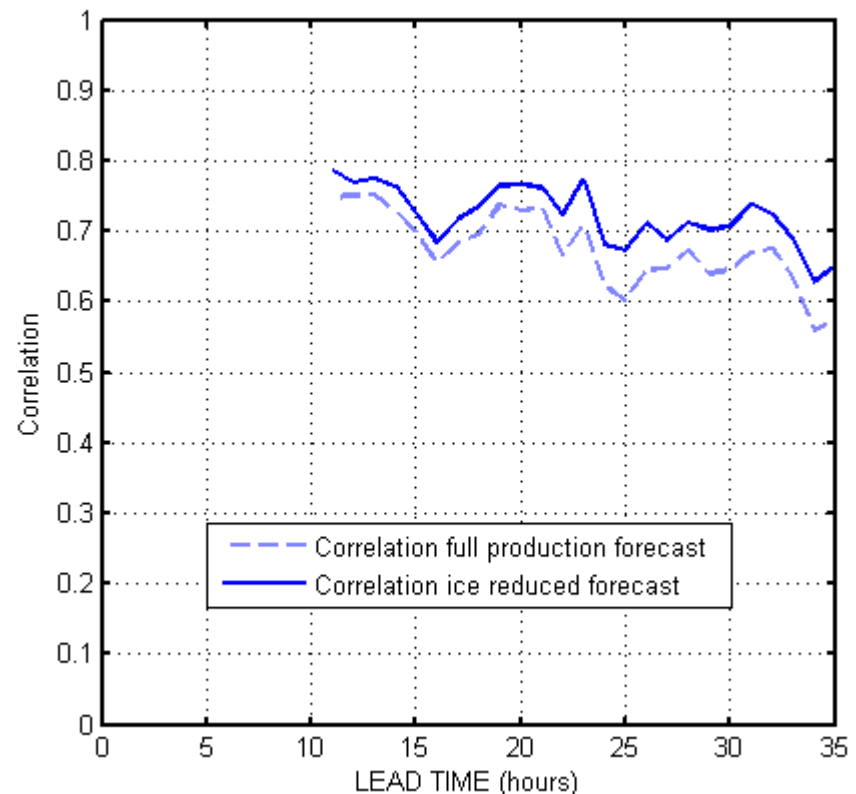
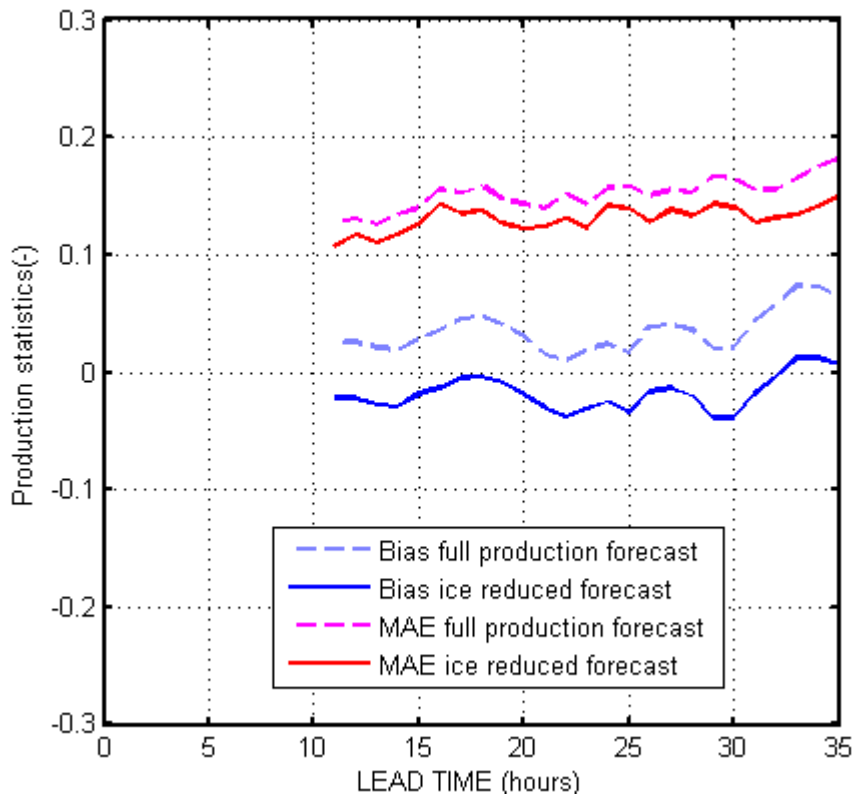


- Reduced number of cases with overprediction of power production in the forecast with icing
- Higher number of cases with error less than 12.5 % in the forecast with icing
- Higher number of cases with underprediction of the power production in the forecast with icing



# Forecasting of power production

- Bias and mean absolute error (MAE) in the forecasts are reduced when we include production losses due to icing (left figure)
- Correlation is increased when including icing in the forecasts (right figure)



# Summary

- Gained experiences from operational forecasting of icing
- Validation of instrumental icing:
  - 75 % of the time when the model indicates instrumental icing ice is also identified from the power data.
  - 33% of the cases when icing influences the power, is not identified as icing by the model
- Validation of meteorological icing:
  - 60 % of the observed icing episodes starts when the model indicates meteorological icing
- Validation of power forecasts:
  - General improvement of the power forecasts when the icing is included.

# Thank you for your attention!

- Øyvind Byrkjedal  
[oyvind.byrkjedal@vindteknikk.no](mailto:oyvind.byrkjedal@vindteknikk.no)
- Rolv Erlend Bredeesen  
[rolv.bredeesen@vindteknikk.no](mailto:rolv.bredeesen@vindteknikk.no)
- Anne Line Løvholm  
[anne.line.lovholm@vindteknikk.no](mailto:anne.line.lovholm@vindteknikk.no)

