
Wind power forecast in Germany

General approach, practical applications and options for considering effects of wind turbine icing

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Introduction

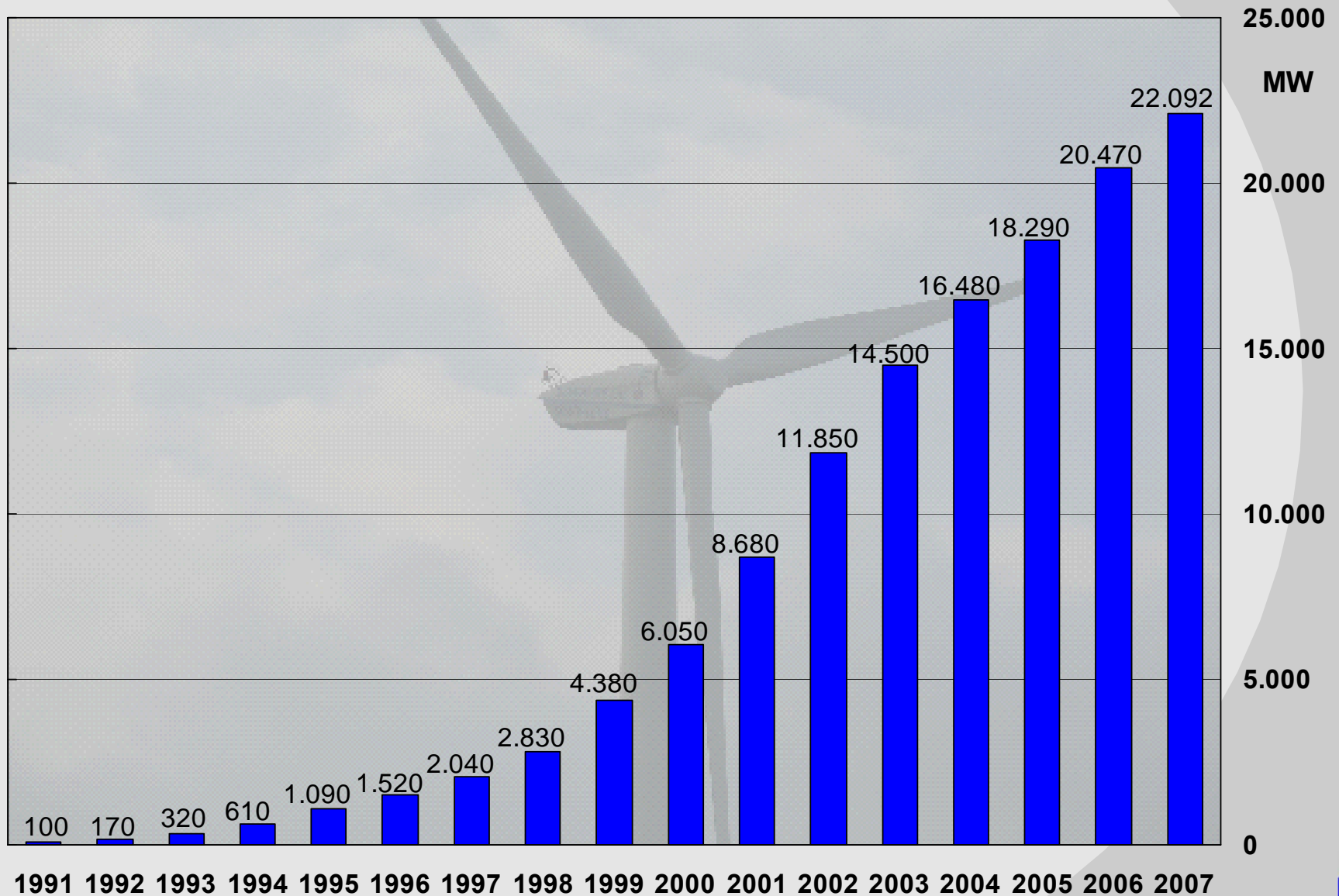
Wind energy development in Germany

Challenges of grid integration

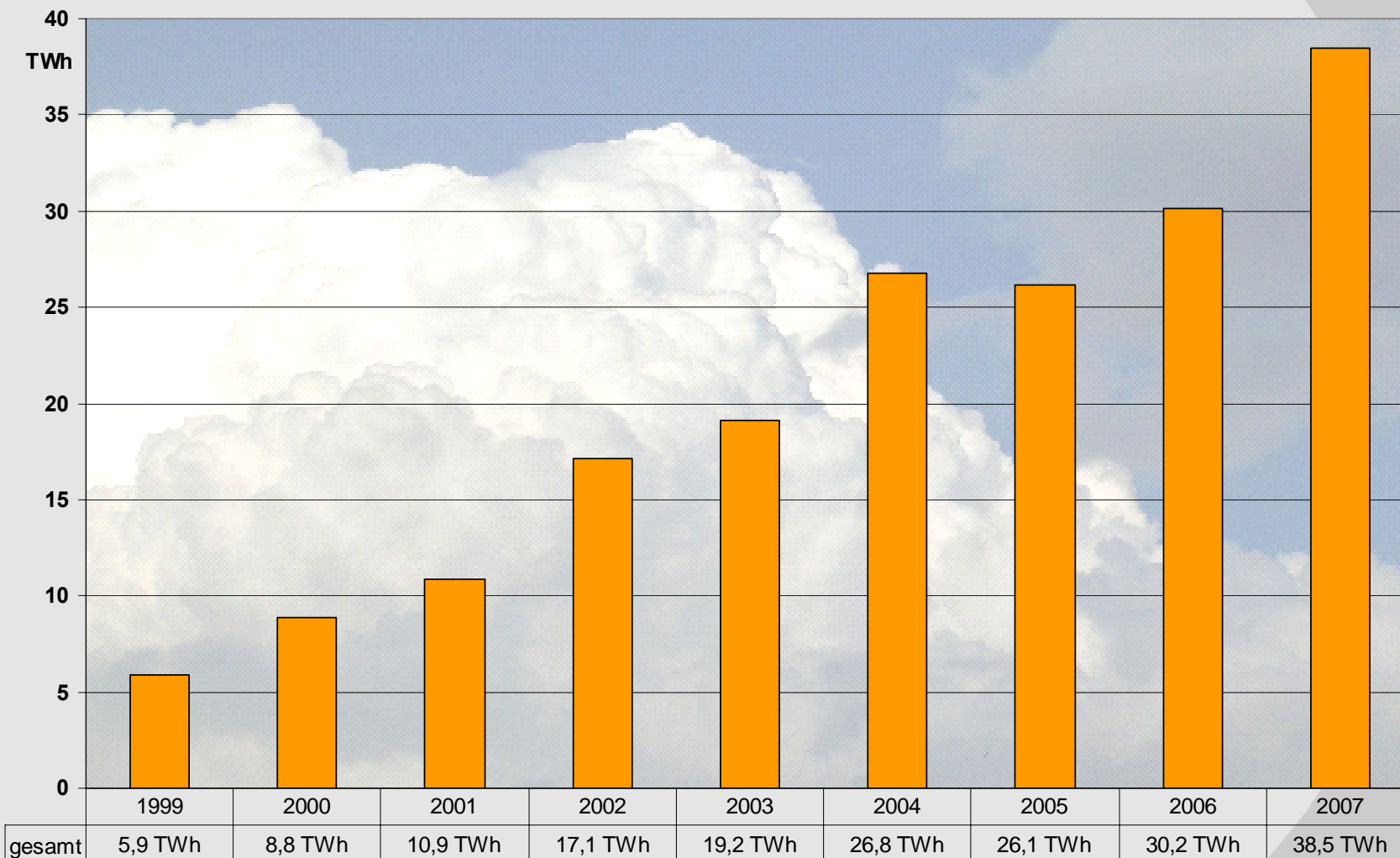
Forecasting of Wind power

Influences of icing situations to forecast quality

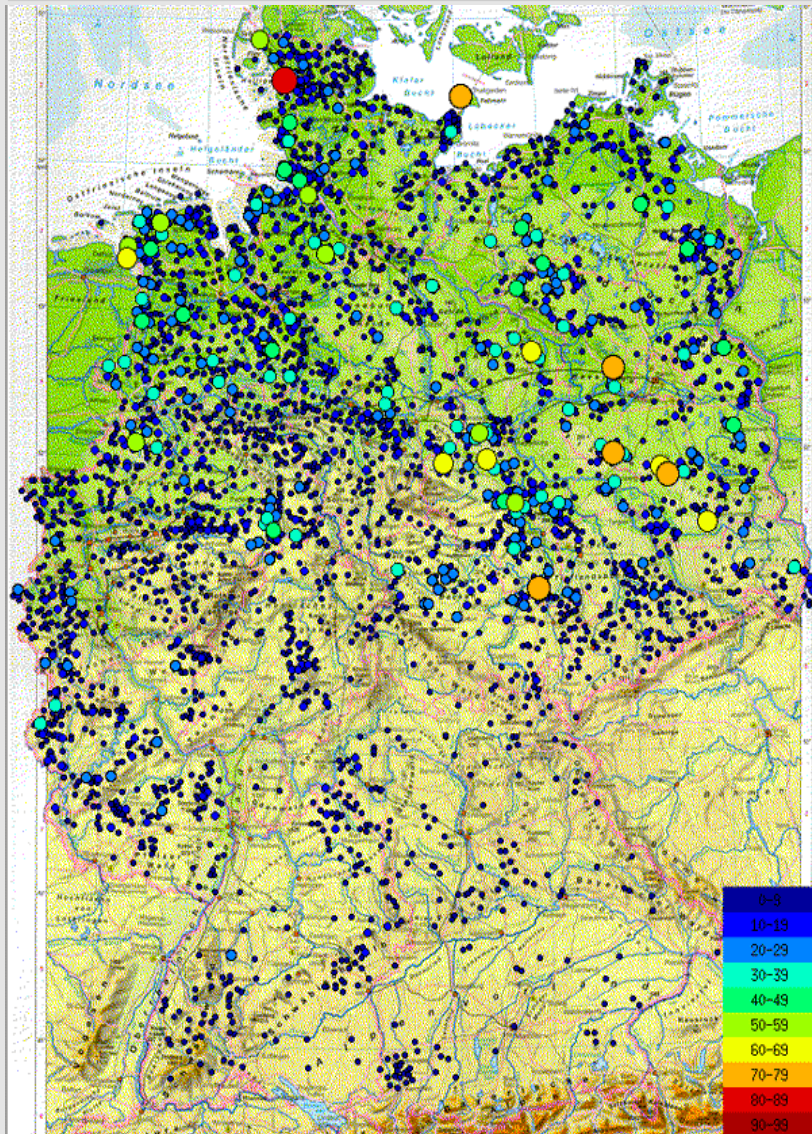
Wind power development in Germany



Electricity production by wind '99 - '07



Introduction



Wind Energy in Germany

Installations

22,100 MW

19,250 WT

as of 12 / 2007

Energy Production

26.4 TWh in 2005

30.3 TWh in 2006

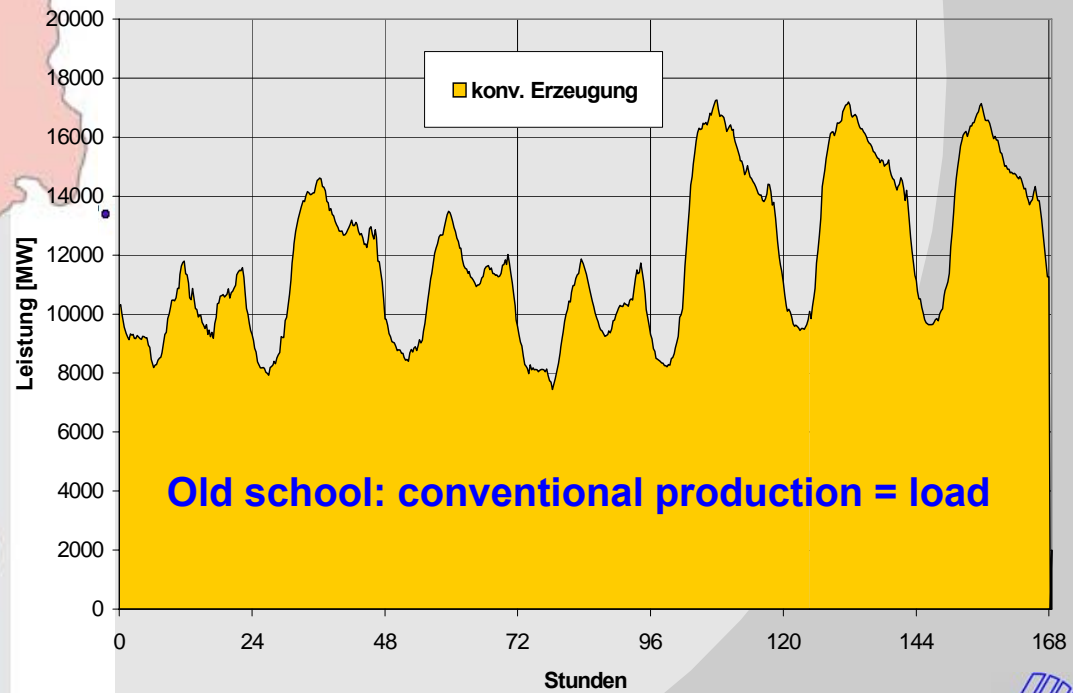
38,5 TWh in 2007

Wind power installations and TSO regions

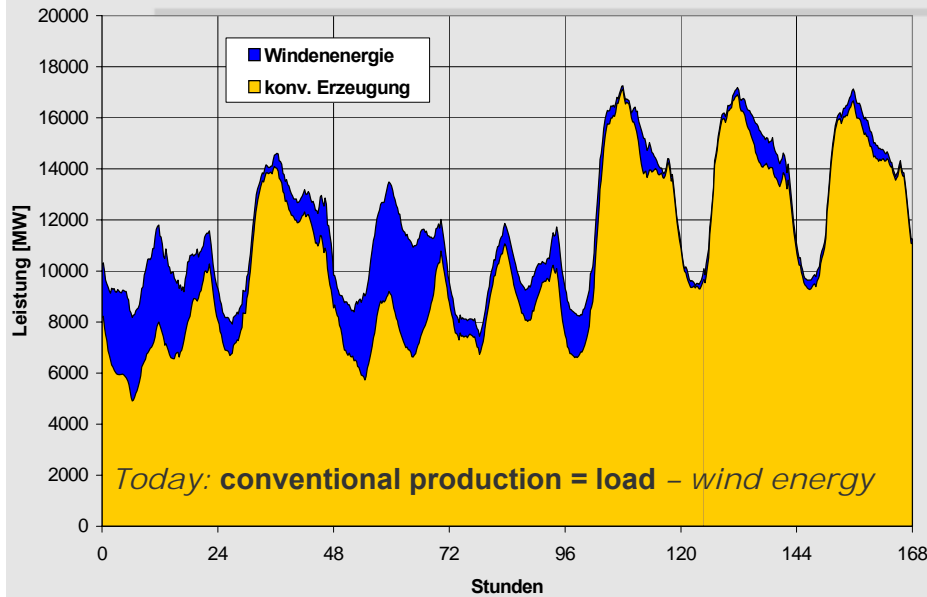


TSO mission

- balancing of power generation and demand
- maintain grid stability voltage, frequency
- provide reserve power
(UCTE: 3000 MW primary control reserve)



Situation today



- Hundreds of wind farms and single turbines
- Fluctuating power generation
- Non-dispatchable generators
- Privileged production of RE
- Purchase commitment by utilities

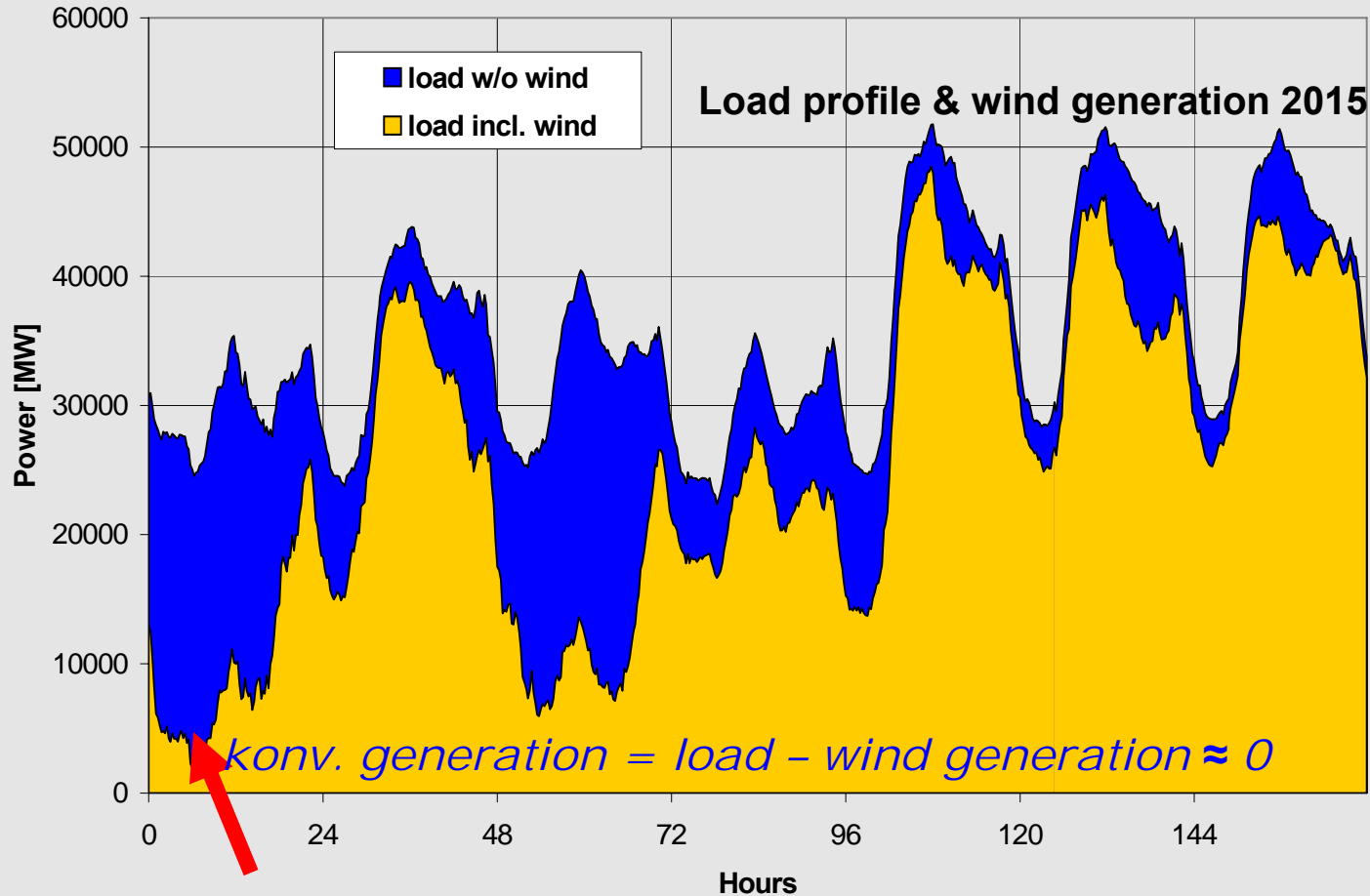
→ consequences for stable and reliable grid operation

Information about
actual state of wind power feed-in
+ short & medium term forecast
is essential



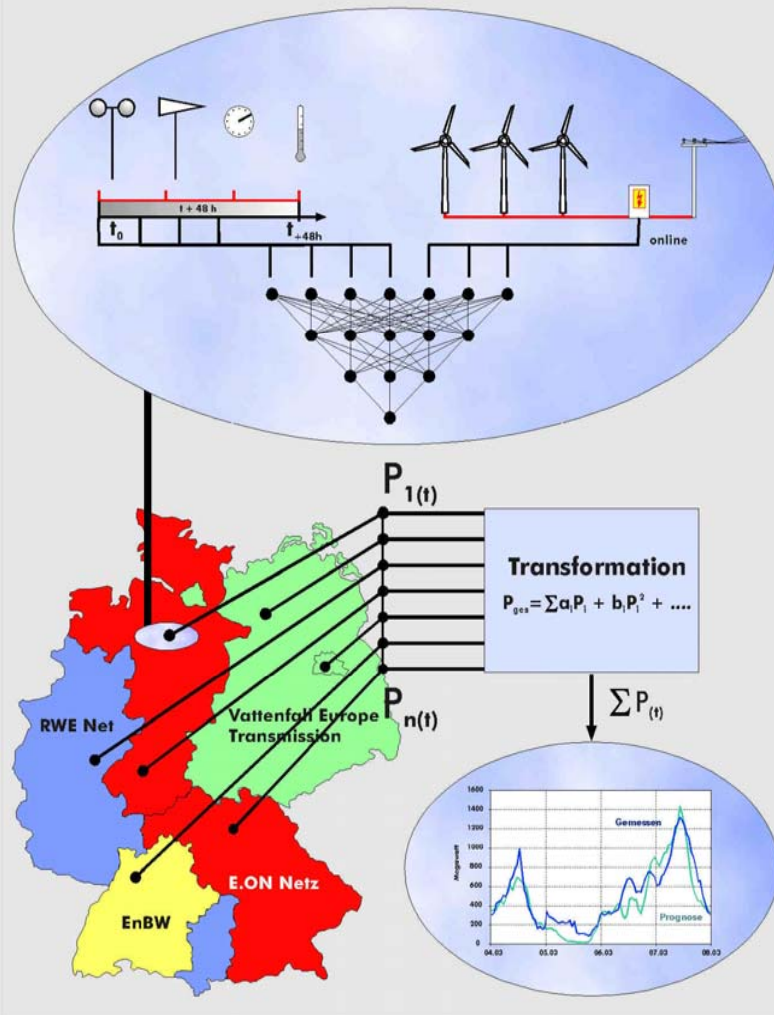
Foto: NEG Micon

Situation tomorrow → results of DENA study



*No conventional generation is running
=> Grid management (frequency, voltage control, ...)
needed*

Prediction Methods



Models and Tools for TSOs

Step 1:

Online model calculates from few measured windfarms the current power for all plants

Step 2:

Prediction model calculates on the basis of the current power of all plants and the weather forecast the future wind power feed-in

Accuracy in the statistical average

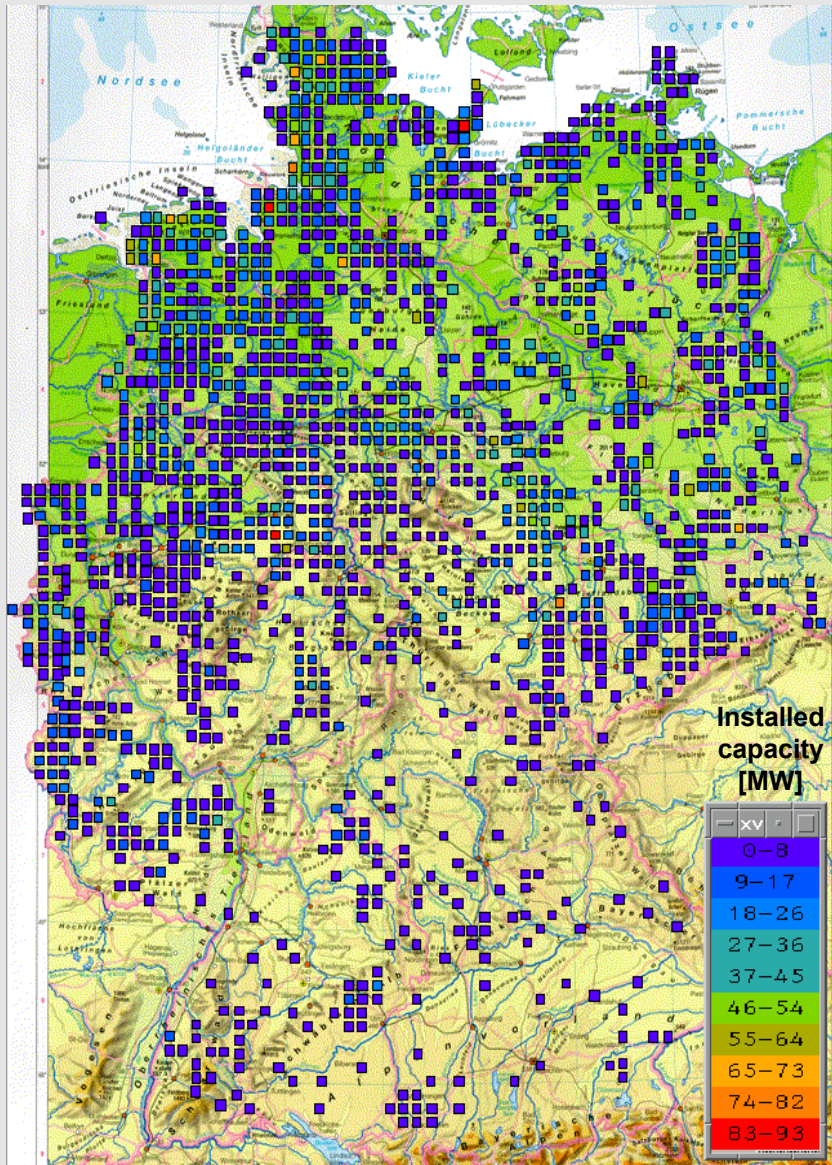
> 94 % for the D+1 forecast

> 96 % for the 4 hours forecast



Wind Power Management System

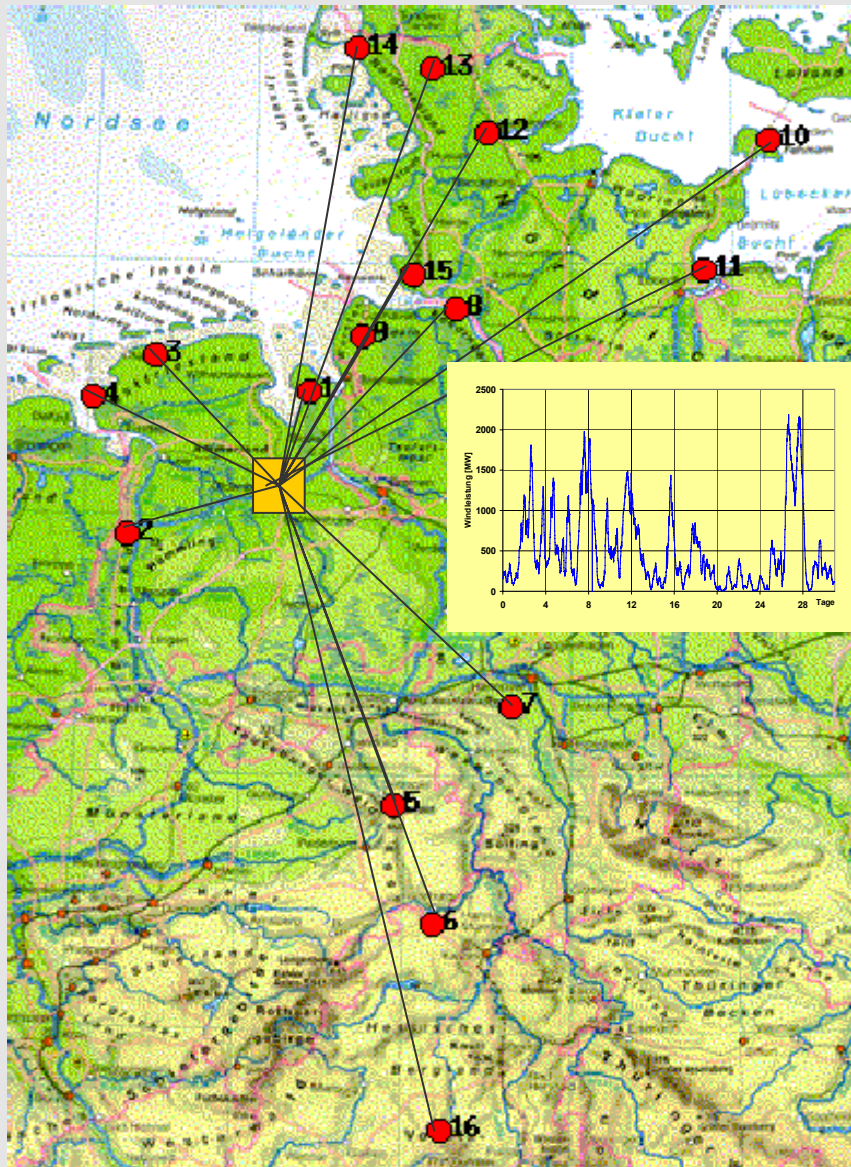
Prediction Methods



Sub-division of the control zones
in small areas (like FEM)

8585 areas (on- and offshore)

Online calculation methods

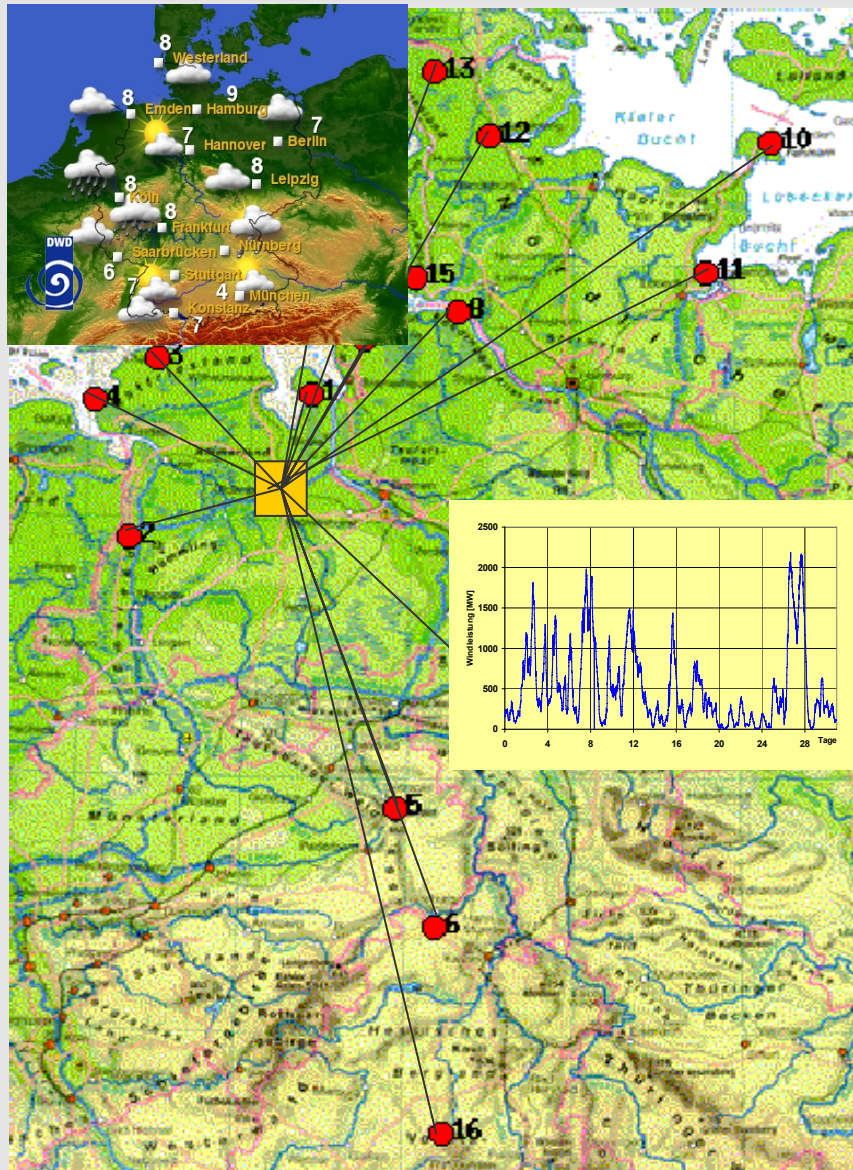


Calculation of **current power output** of each grid square by evaluation of all representative power signals

$$P_{sum} = \sum_i P_i$$

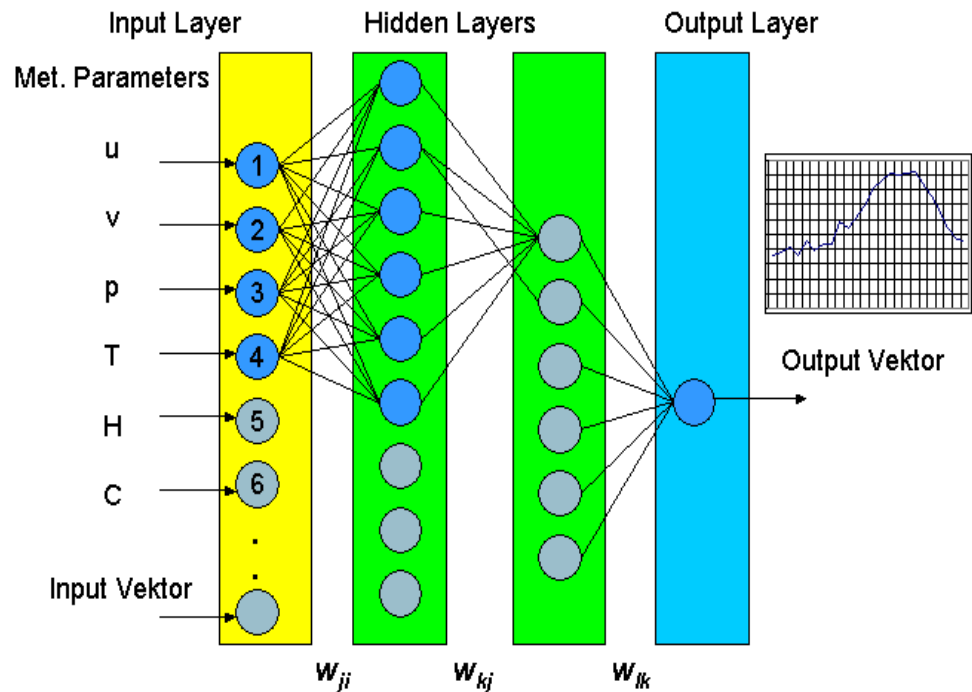
considered parameters:
distance
roughness
control systems

$$P_i = P_{capi} k_i \sum_j s_j * A_{ij} * P_j$$



Calculation of **expected power output** of each grid square by evaluation of all representative wind farm power output predictions using NWP models and **Artificial Neural Networks**

Prediction Methods



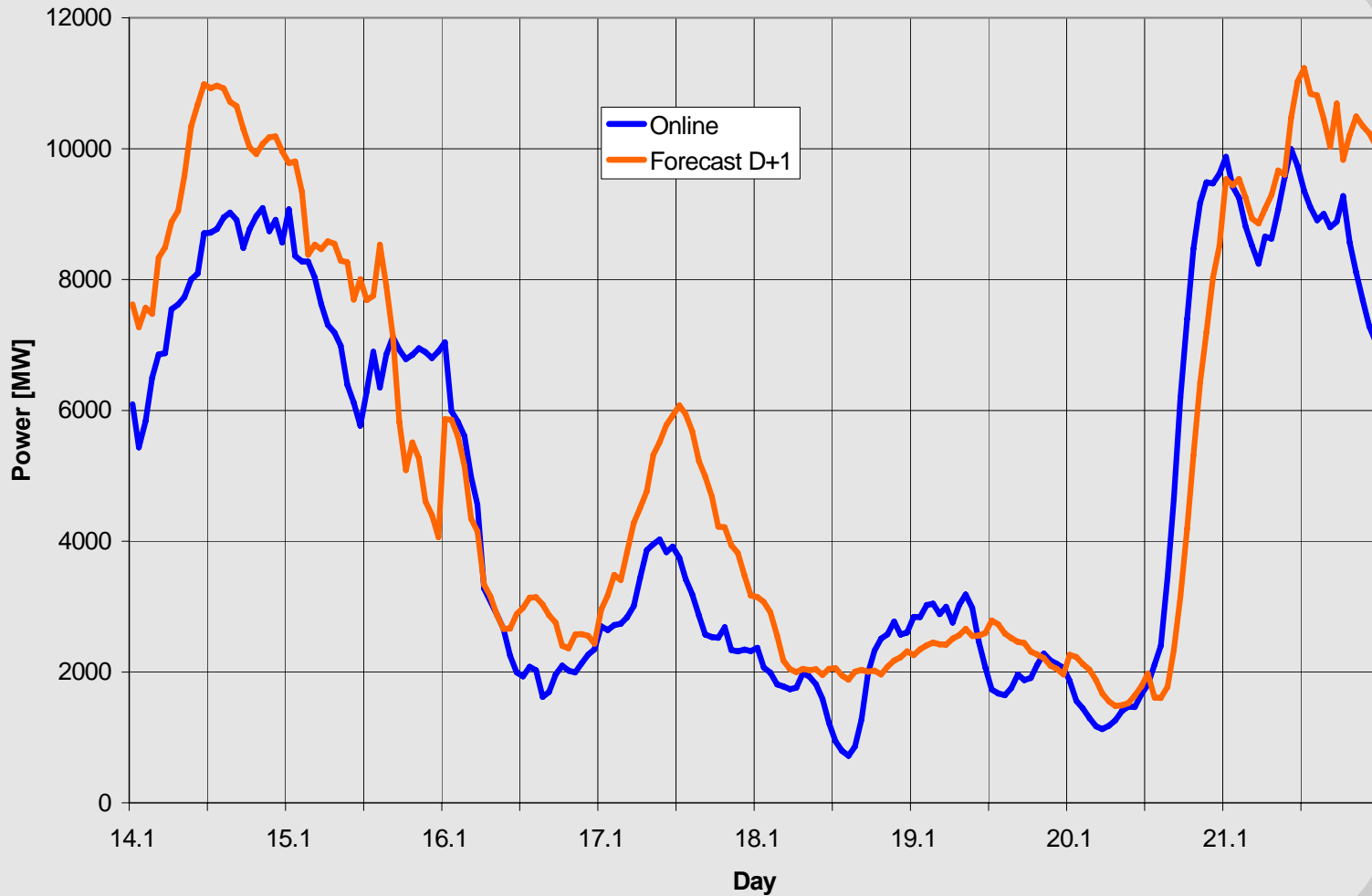
Artificial Neural Networks

$$\hat{P}(t) = g \left[\sum_{j=1}^m A_j g \left(\sum_{k=1}^n w_{jk} x_k(t) \right) \right]$$

Support Vector Machines

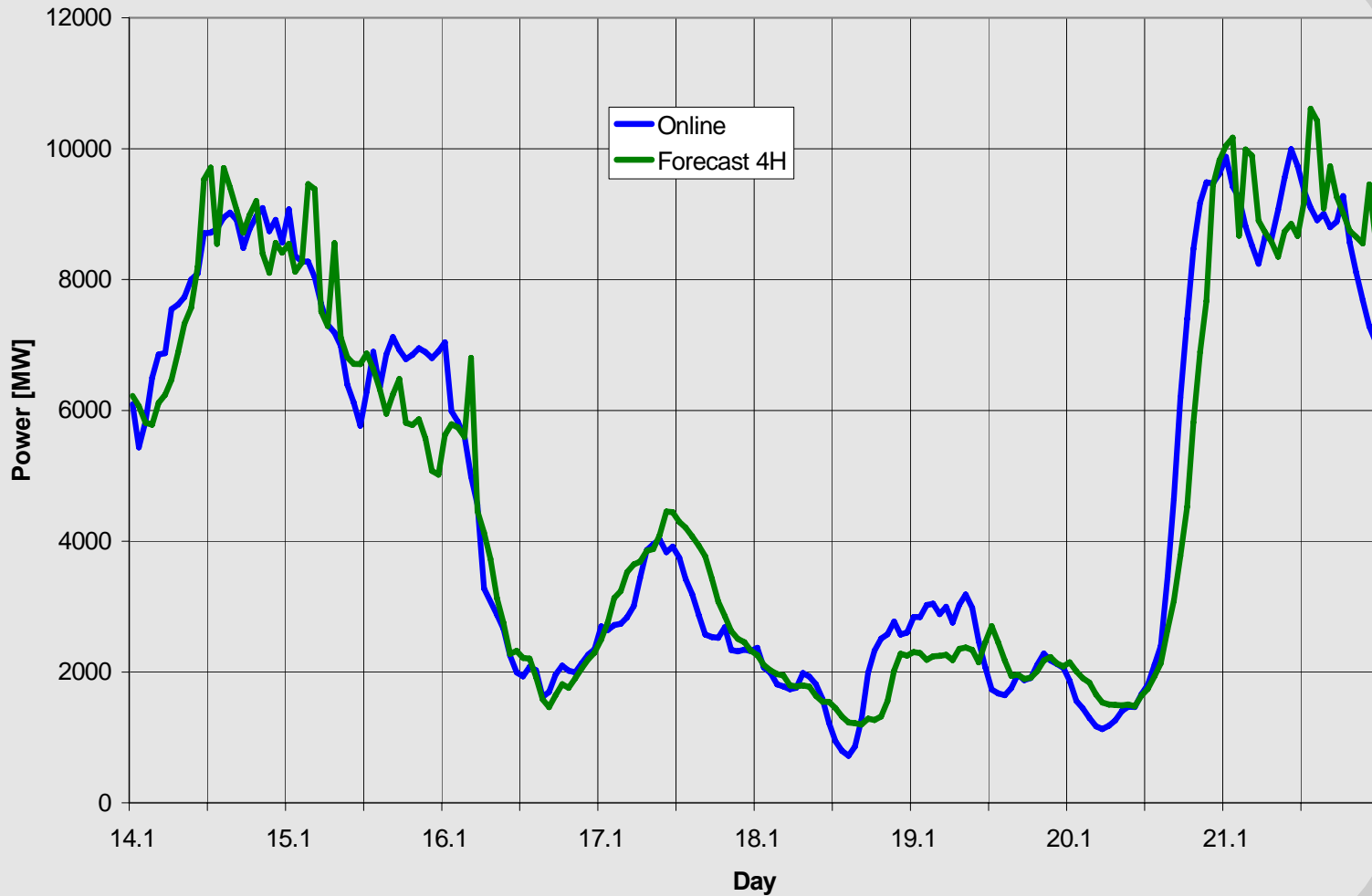
$$f(w_i) = \text{sign} \left[\sum_{\text{support vectors}} P_i \alpha_i K(w_i, w_i) - b \right]$$

Prediction Methods



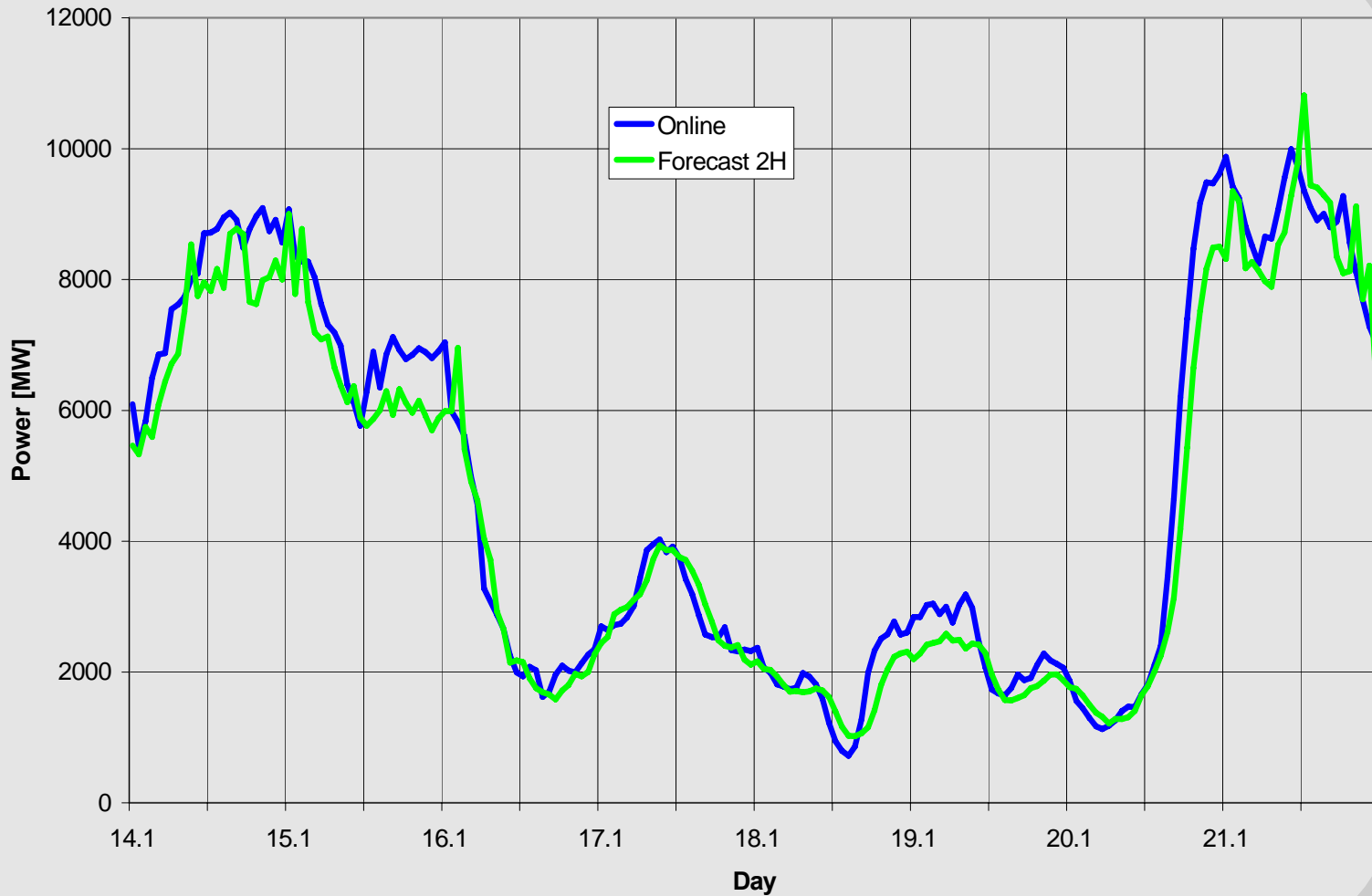
Wind generation – online, day-ahead forecast

Prediction Methods



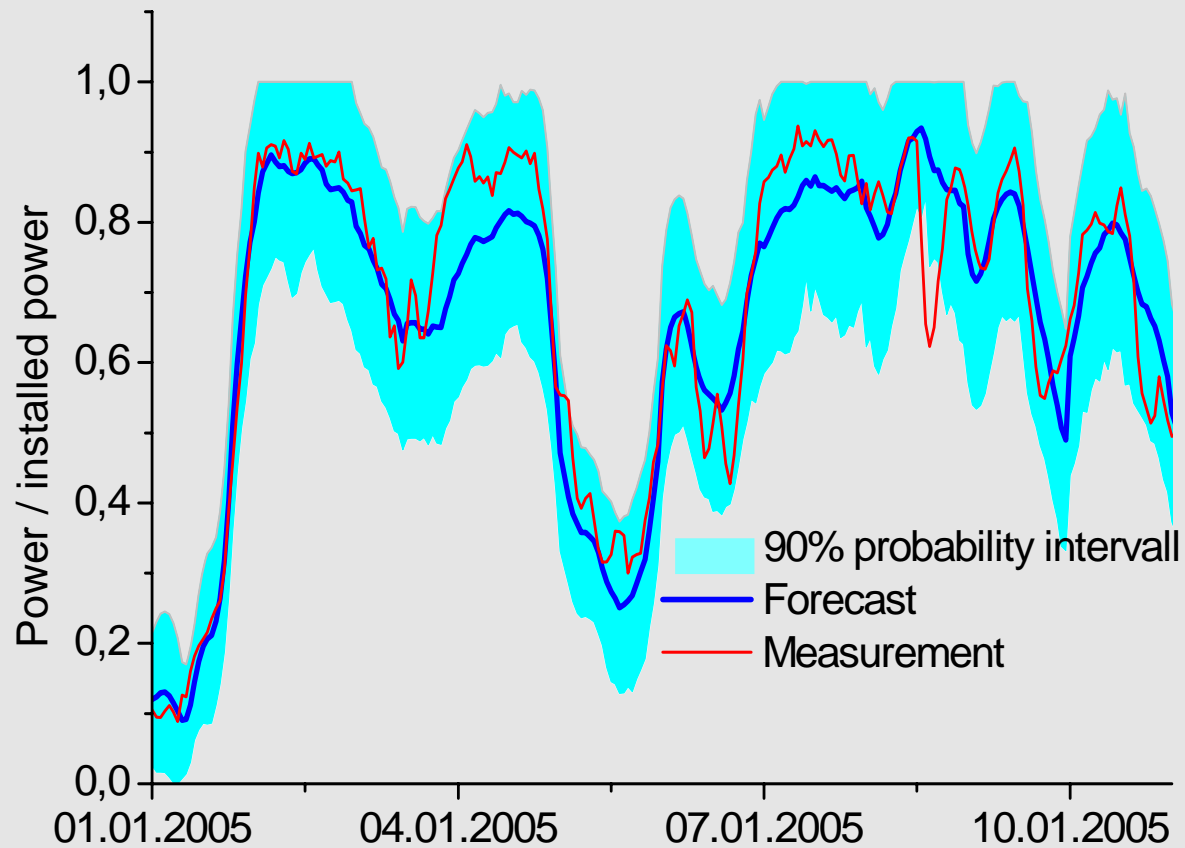
Wind generation – online, 4 hour forecast

Prediction Methods



Wind generation – online, 2 hour forecast

Prediction Methods

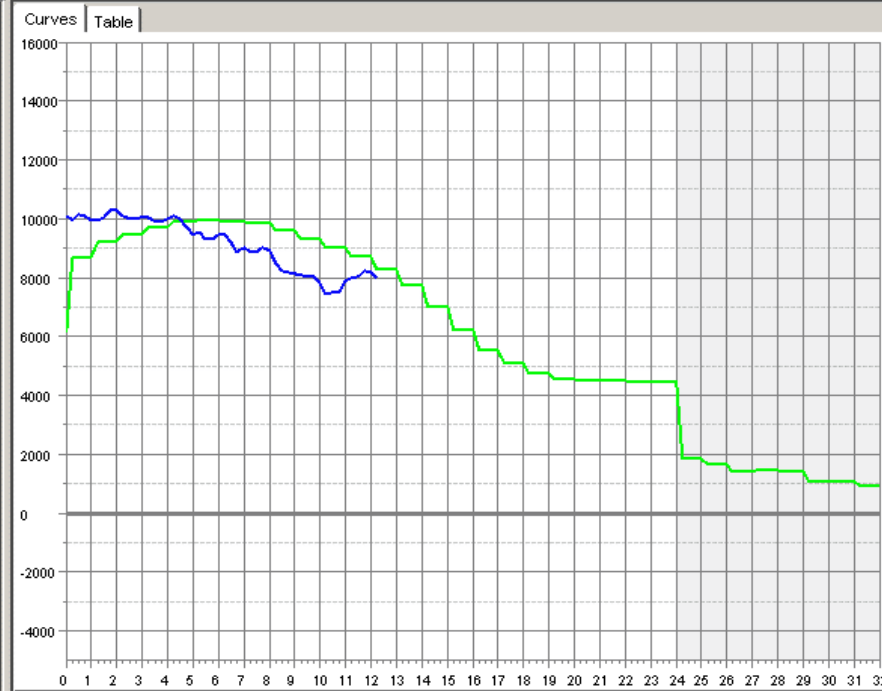
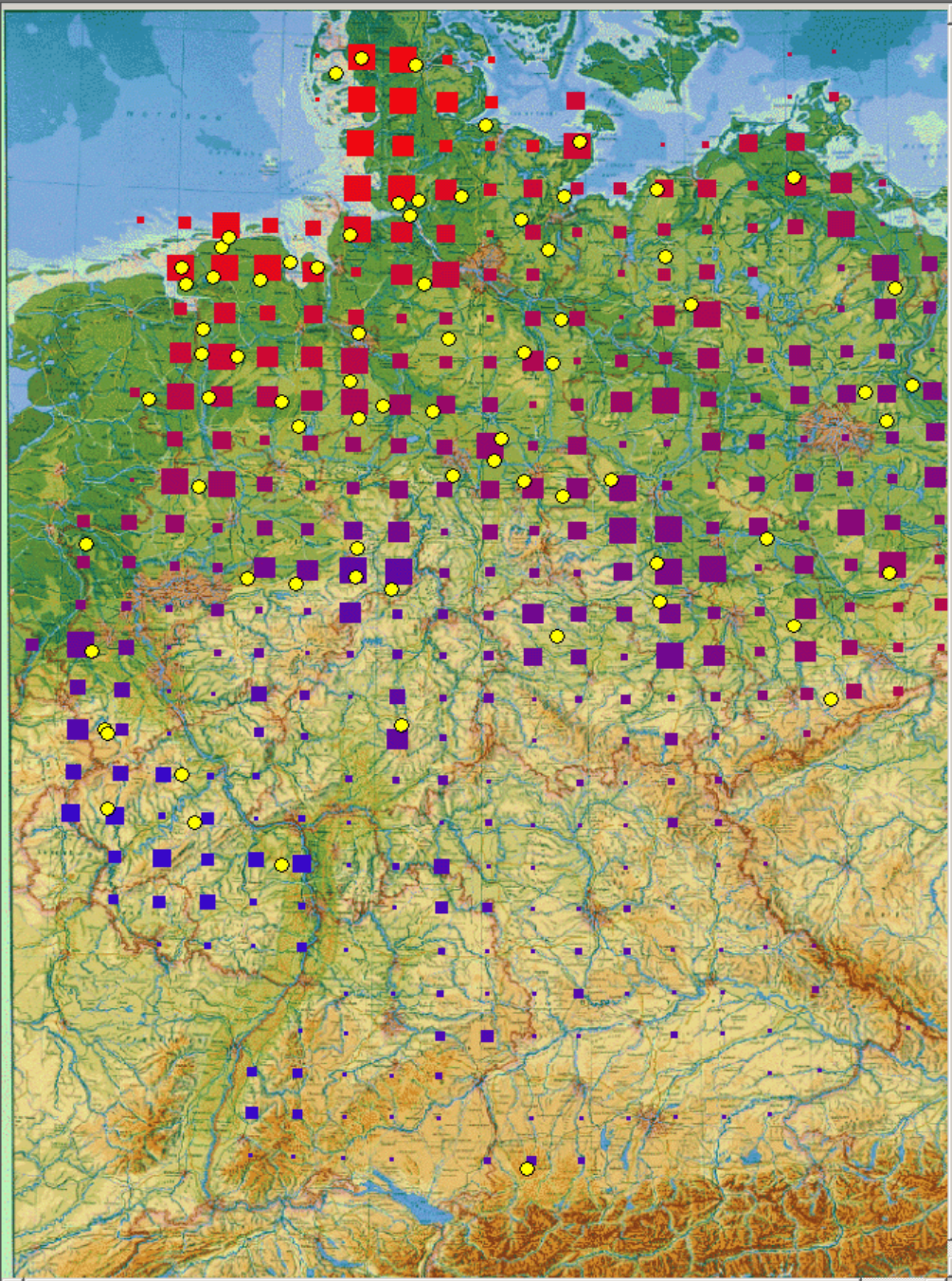


Short-term forecasts with associated confidence areas

Integration of large quantities of wind power into the energy supply



Dispatch
centre TSO



— Measurement
— DWD forecast
— Short-term forecast
— Reference curve
— Deviation reference-measurement

Measurement from 25.12.2004 00:00
 to 25.12.2004 12:15
 DWD forecast of 24.12.2004 07:00

Total instantaneous power output: 7994 MW
 Instantaneous capacity factor: 0,00 %

#	St...	On...	Name	Capacity	ICF	#	State	On...	Name	Capacity	ICF
1	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Nordenham	13.5 MW	83.5 %	2	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Niederlangen	93.0 MW	30.5 %
3	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Holtriem	52.5 MW	70.4 %	4	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Manslagt	29.1 MW	78.0 %
5	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Freiburg	40.6 MW	75.8 %	6	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Krempel	80.8 MW	58.4 %
7	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Travemuende	7.9 MW	45.9 %	8	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Lindewitt	34.0 MW	93.2 %
9	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Niebuell	24.21 MW	80.7 %	10	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Ulrichstein	10.3 MW	33.8 %
11	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Gettorf	13.5 MW	116.5 %	12	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Benhausen	33.275 MW	22.2 %
13	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Daseburg	32.0 MW	8.2 %	14	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Schwicheldt	31.3 MW	48.5 %
15	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Bleckenstedt	27.9 MW	61.4 %	16	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Wedehorn	33.9 MW	59.3 %
17	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Stadorf	38.75 MW	65.6 %	18	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Bueren	46.25 MW	28.5 %
19	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Emern	24.0 MW	76.1 %	20	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Pennigsehl	51.0 MW	36.8 %
21	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Katensen	31.5 MW	13.2 %	22	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Gestorf	16.0 MW	54.6 %
23	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Bentstreek	18.0 MW	80.2 %	24	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Damsum	26.4 MW	64.4 %
25	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Ihlow	49.8 MW	78.2 %	26	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Lorup	37.8 MW	74.3 %
27	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Oersdorf	46.7 MW	56.2 %	28	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Tewel	35.2 MW	31.4 %
29	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Rhede	77.4 MW	64.4 %	30	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Wybelsum	37.5 MW	68.7 %
31	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Wilhelmshav...	8.0 MW	78.7 %	32	<input type="checkbox"/>	<input checked="" type="checkbox"/>	Wulfenau	39.6 MW	0.0 %

Wind Farm Control, Prediction Systems

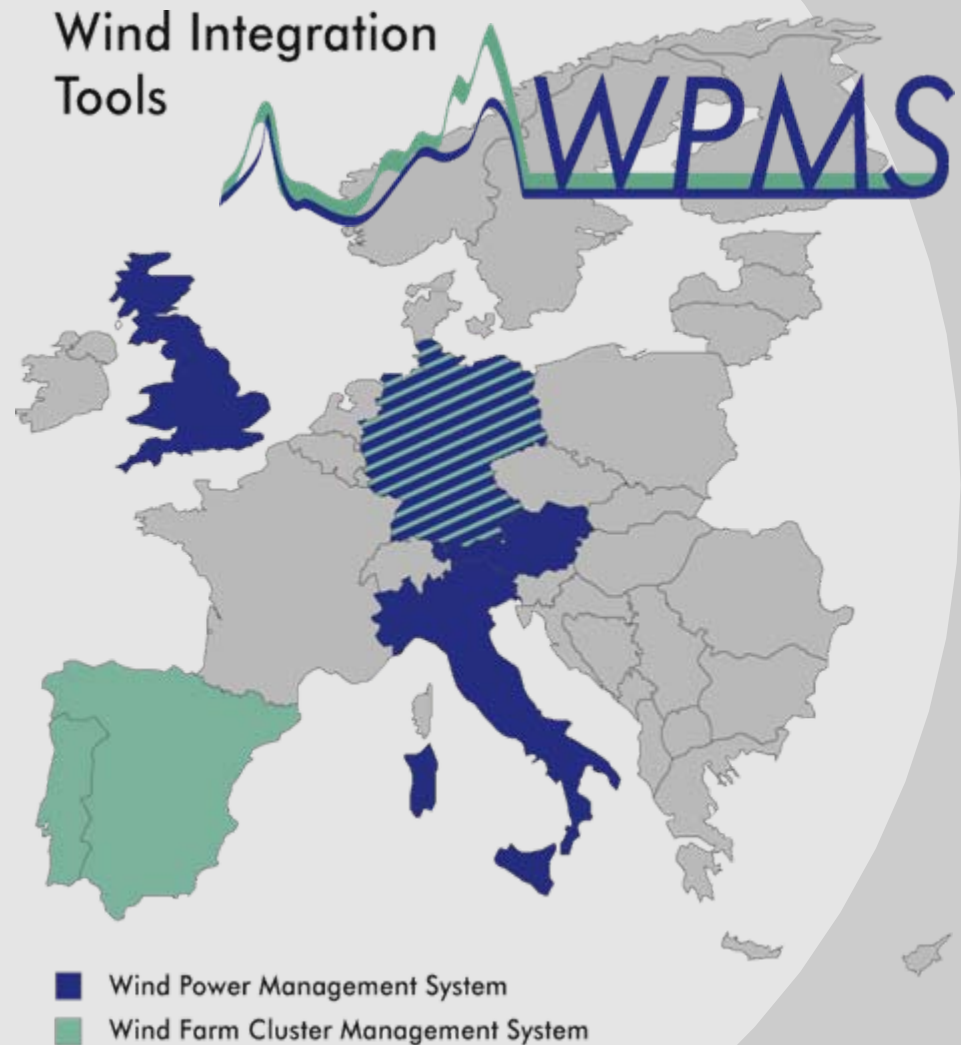
AI-based Prediction System WPMS

E.ON Netz,
Vattenfall Europe Transmission,
RWE Transportnetz Strom,
EnBW Transportnetze

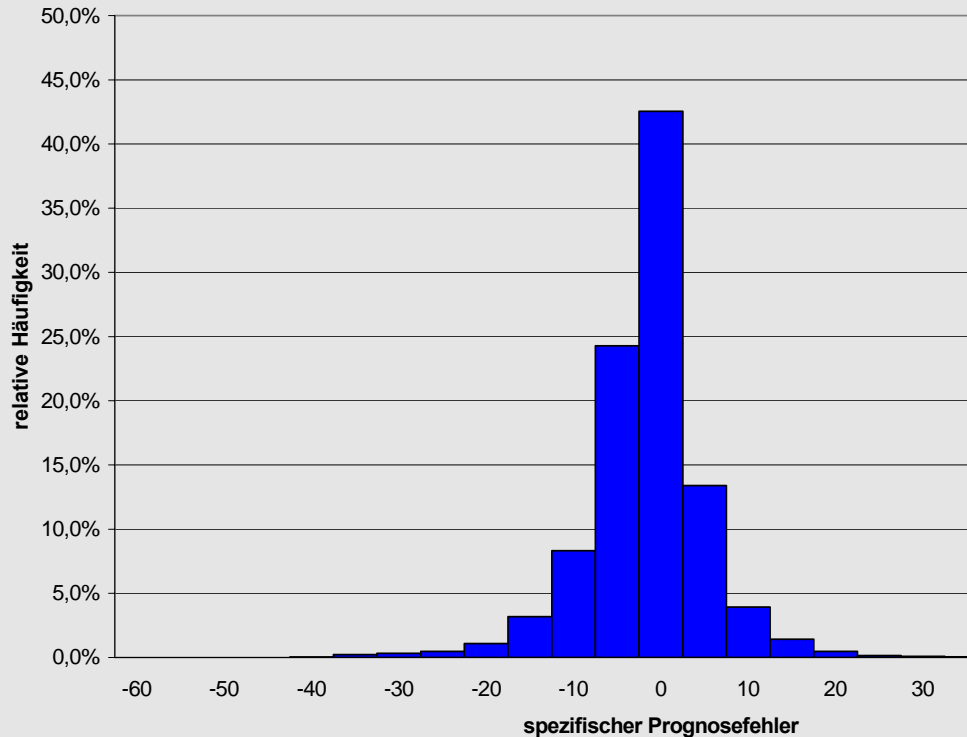
Verbund Austria
TERNA Italien
Egypt, Zafarana
UK, National Grid

Wind Farm Cluster Management WCMS

E.ON Netz
Vattenfall Europe Transmission
Red Electrica Espana
Redes Energeticias Nacionais



Forecast errors - statistics



Prediction error for TSO control zone

Mean errors (2006)

< 6.0% RMS (24h forecast)

< 3.5% RMS (4h forecast)

Forecast error reasons:

- weather forecasts storm: ATA \neq ETA
- different trajectory of predicted storm
- other systematic errors
- Turbine response is utterly at variance with standard behaviours

? \rightarrow icing

Wind & ice

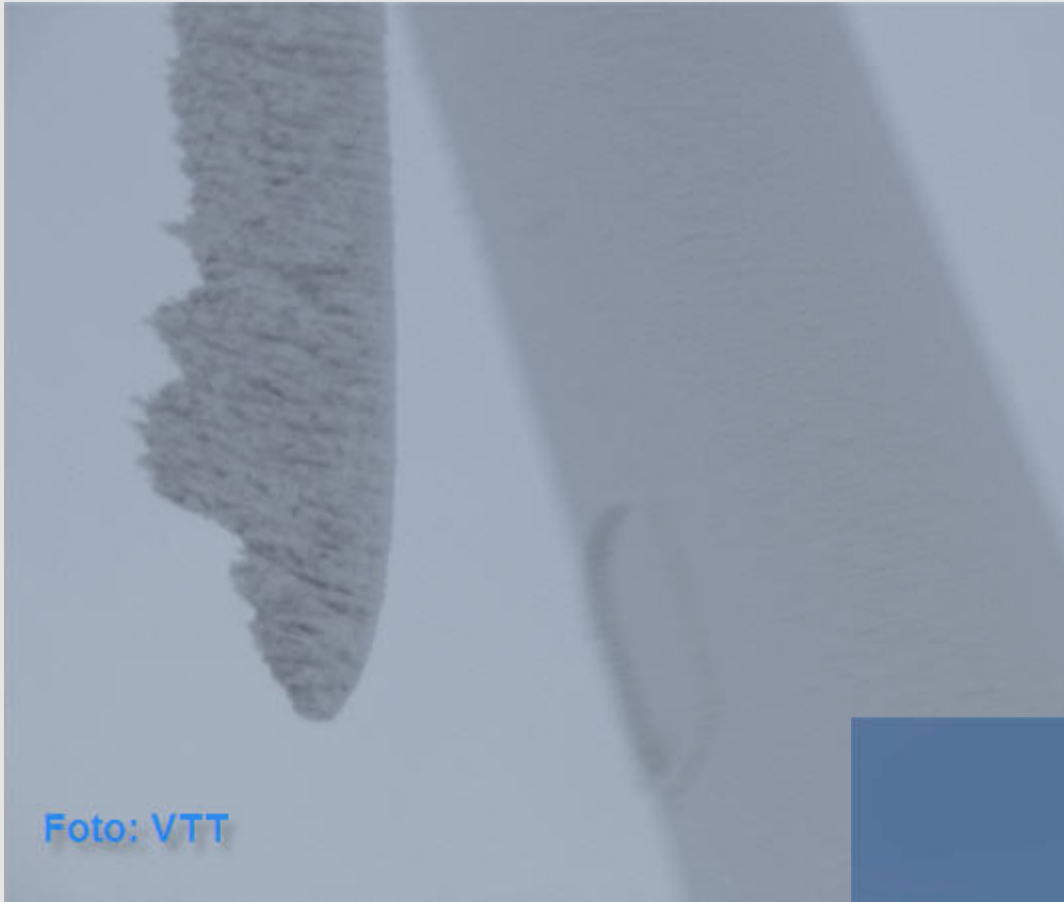


Foto: VTT



Reduced aerodynamic efficiency

Faulty sensor signals

M. Durstewitz, Vintervind 2008, Asele, SE

Forecast errors caused by icing ?????

Task:

Analyse forecast quality
with measured results

Selected sites:

Mountainous regions
Elev. 300 – 700 m asl

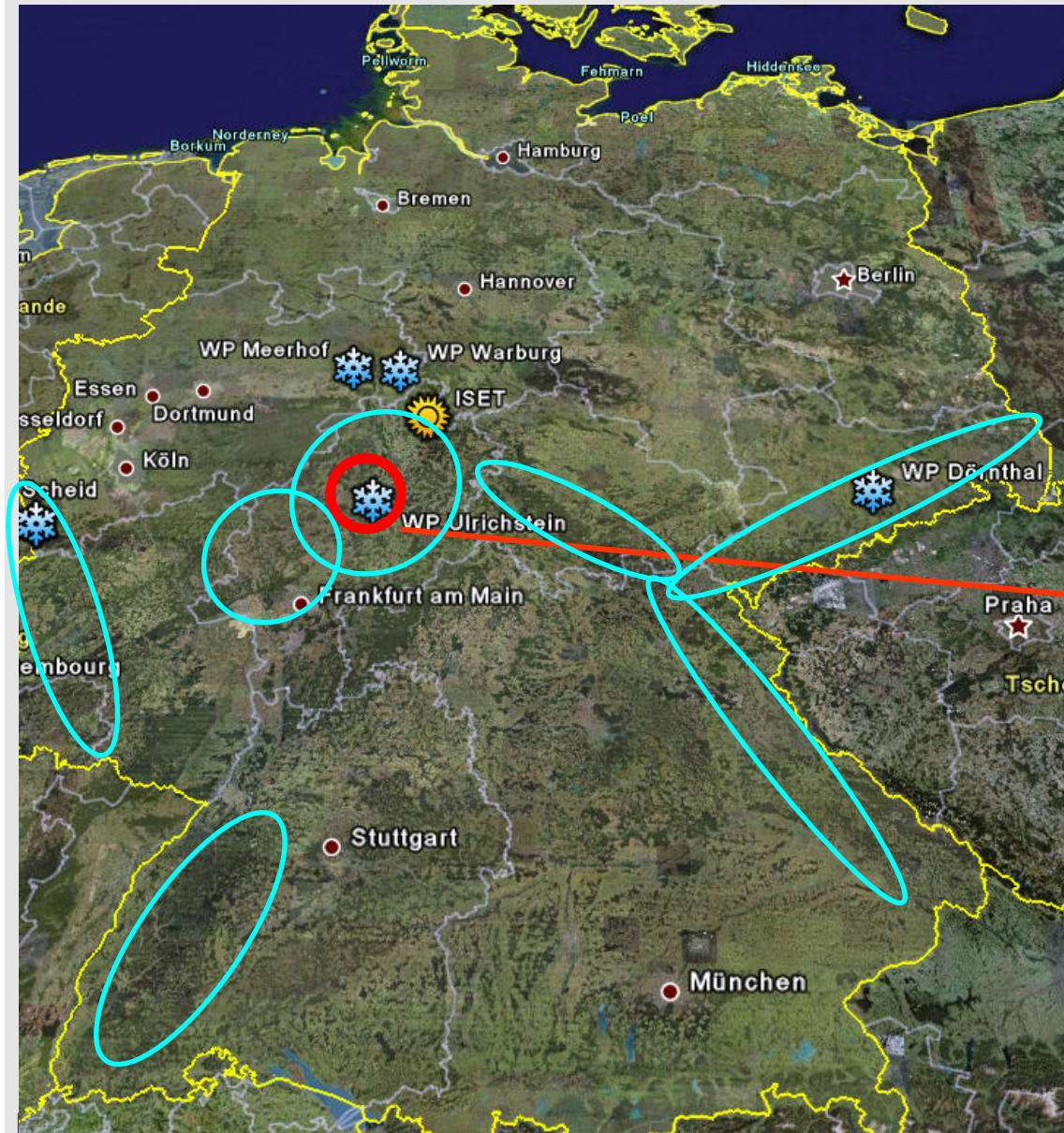
Example:

WP Ulrichstein/Vogelsberg
sev. types / $\sim 11 \text{ MW}_{\text{tot}}$

Elevation $\sim 600 \text{ m asl}$

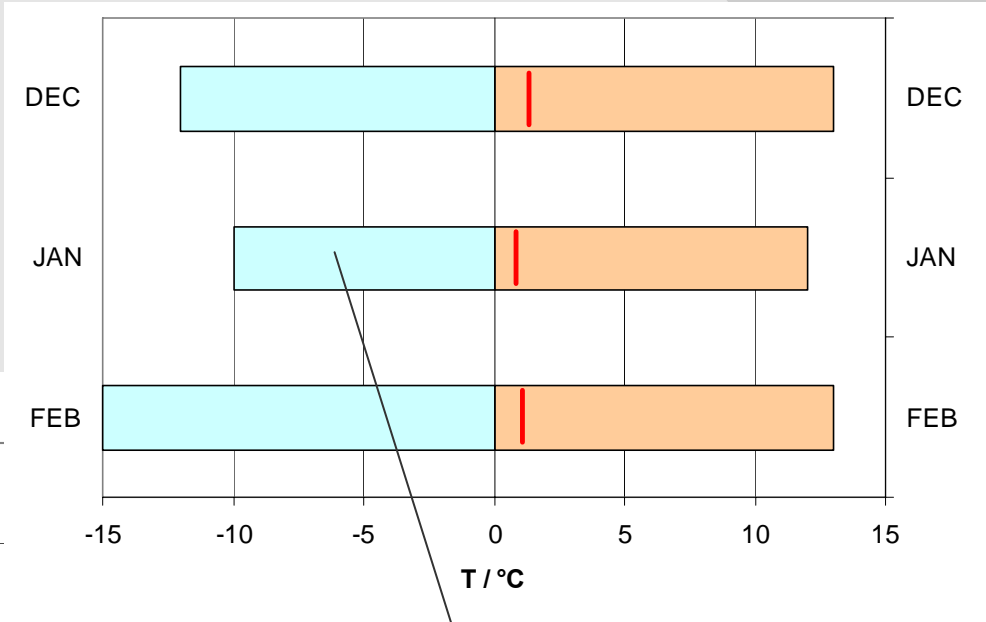
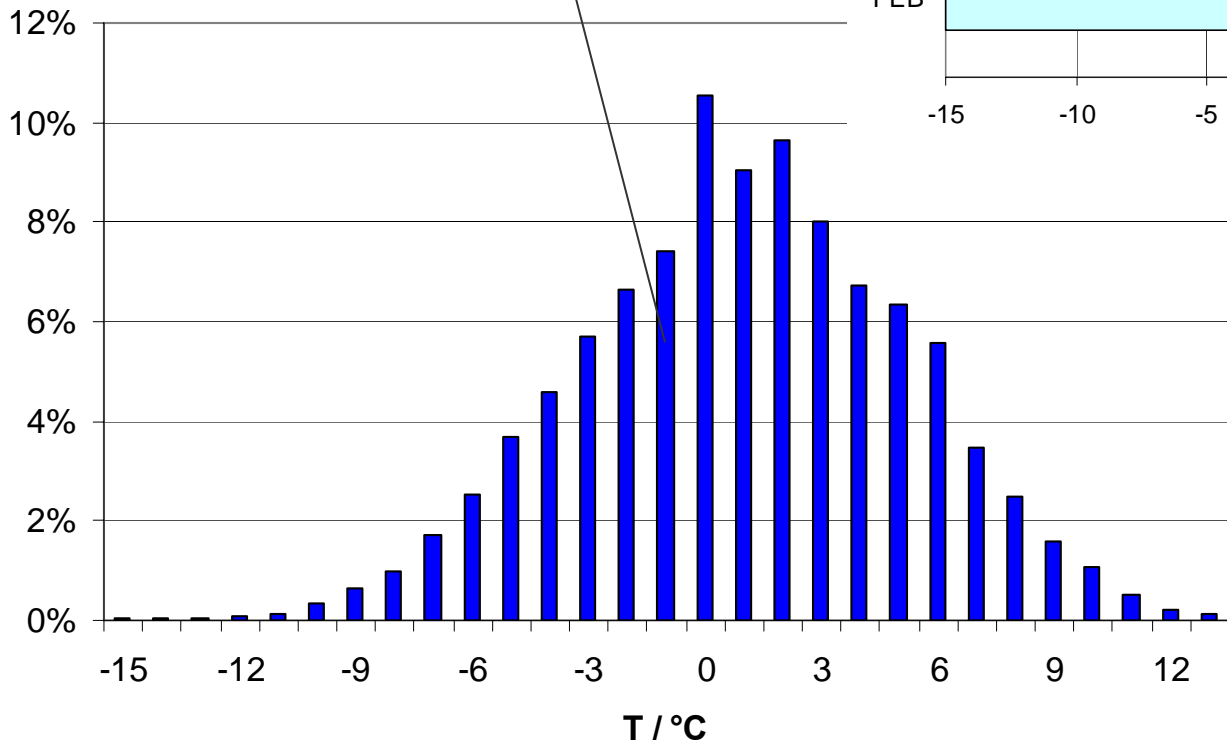
Low mountain range

Several icing reports



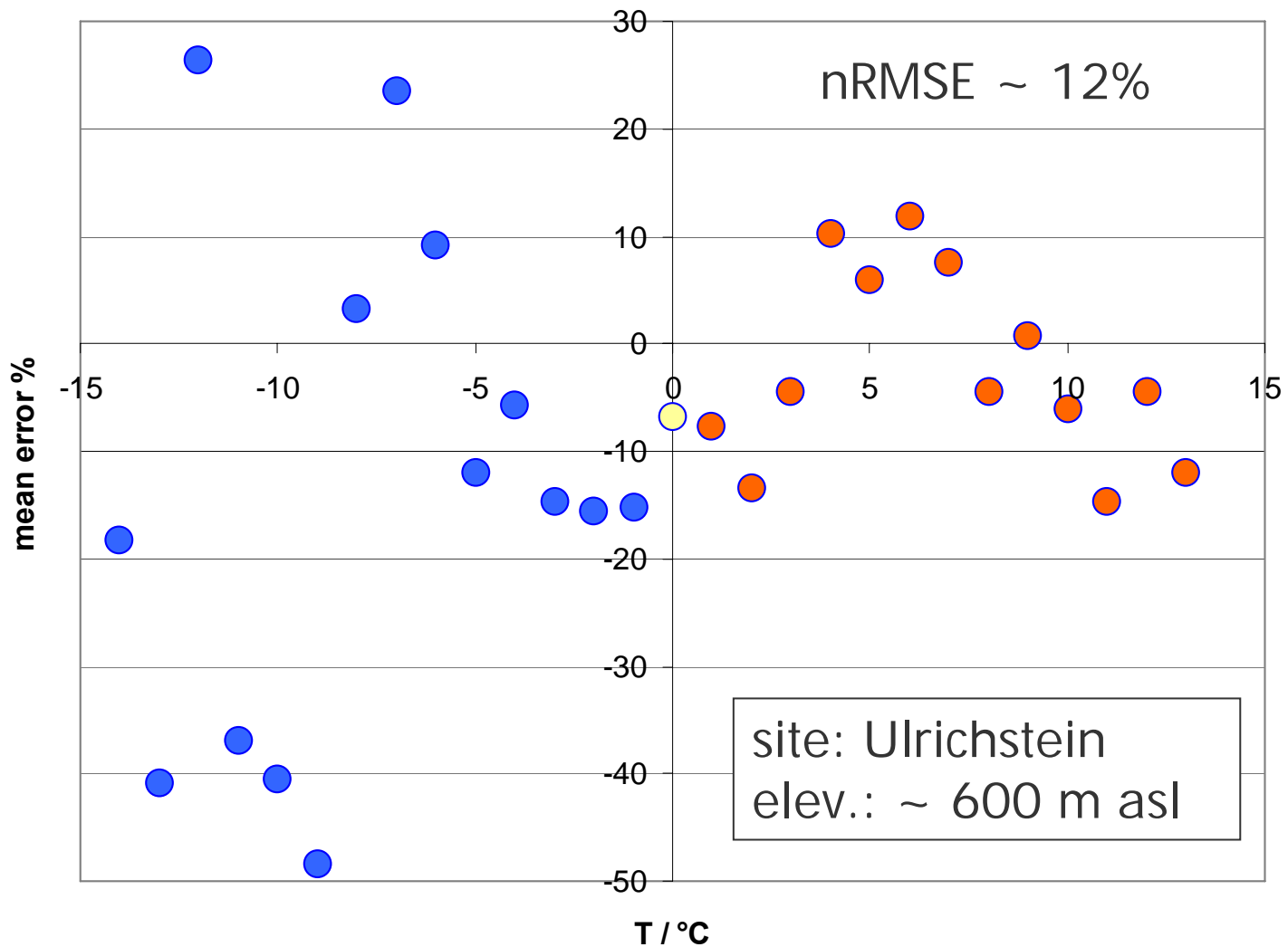
WP Ulrichstein / Temperatur profile (2004 - 2008 JAN, FEB, DEC)

Frequency distribution of ambient temperature

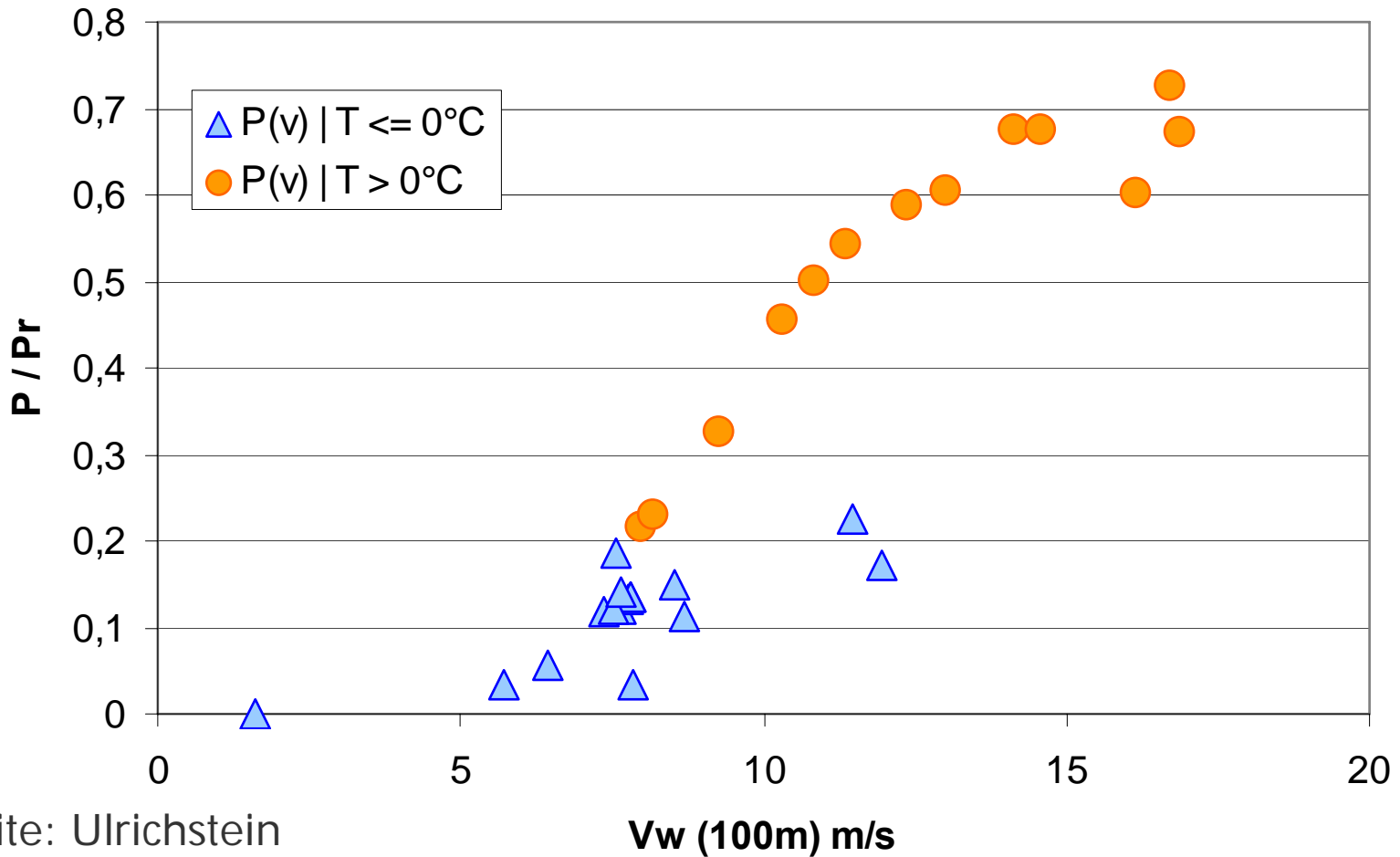


Span of T and avg temp. by months

Distribution of observed forecast errors vs. temperature



Power output vs. wind speed (WP Ulrichstein)



site: Ulrichstein
elev.: ~ 600 m asl

Conclusions / next steps

- *WPMS is a powerful tool for integrating wind power*
- *Reliability of results has to be checked for low temperatures*

Next steps:

- *Analysis of data from other sites*
- *Inclusion of further meteorological parameter*
- *Search for typical footprints*
- *Integration into ANN training procedure*
- *Verification of results*
- *...*
- *Implementation into update WPMS*