



IEA Wind Task 51 -**Forecasting for the Weather Driven Energy System**



IEA Wind Task 51 Workshop Results



Largest global discussion forum for renewable energy forecasting

Wind and solar are no longer mere additions to the grid, in the future they are the grid. They are weather dependent, therefore the entire power and energy system needs to be handled according to the weather. IEA Wind Task 51 "Forecasting for the Weather Driven Energy System" takes a broad approach for all sources, and some mitigation options, of the naturally occurring variability. The Task first phase is from 2022 - 2025. The work packages reflect the modelling chain: meteorology (WP1), power conversion (WP2) and application of the forecasts (WP3). Below that we have established 11 work streams that reach across areas and are run in collaboration with many other IEA Wind Tasks, IEA Technology Collaboration Programmes (PVPS), the WMO Energy Group and the IEC SC8A Grid Integration for Renewable Energy.

IEA Wind Task 51Workshops Results



In order to facilitate energy stakeholder's growing interest in subseasonal to seasonal (S2S) forecasting information in their application, the IEA Wind Task 51 organised a workshop to disseminate information about S2S forecasting products, skill, applications, issues, and best practices to members of the electric energy community. The S2S forecasting workshop covered topics on:

- methods used to produce S2S forecasts
- current and planned research activities to improve skill
- types of public and private sector operational S2S forecasting products
- the range of S2S applications in the energy community
- the quantified or perceived value obtained from those applications
- the sensitivity of user's application performance to variations in skill
- the S2S-forecasting-related needs or desires of energy user community **Lessons Learned:**

- Infomation is available: met centers generate many products (e.g. DWD,

Copernicus. ECMWF, UK MetOffice, NOAA, etc.)

- climatic predictions, ensemble predictions, traffic lights inclusive skills
- user workshops and newsletters

- <u>Requirement for more user engagement</u>: user request are unspecific and require adaptation to general data collections, users ask for ease of use (see e.g. free climate data tool of <u>WEMC "Teal Tool"</u>

Past: observation analysis for planning task in energy community **Future**: Maintenance, Energy Management Investment planning need monthly, seasonal and climatic outlooks

As the world's fastest-growing

Work Streams:	WP1 Weather	WP2 Power	WP3 Applications	Deliverable	#, Due	Collaboration
Atmospheric physics and modelling (WP1)	*			List of experiments and data	D1.1, Ongoing	WMO, PVPS T16
Airborne Wind Energy Systems (WP1)	*			Presentations on workshops	Part of D2.1	Task 48 Airborne Wind Energy
Seasonal forecasting (WP1)	*			Workshop / Paper	D1.6 / M19= May 2023, Reading	Hydro TCP, Hydrogen TCP, Biomass TCP
State of the Art for energy system forecasting (WP2)		*		Workshop / Paper <u>RecPract</u> on Forecast Solution Selection v3	D2.1 / M7, M12= Sept '22, Dublin M2.1 / M36	PVPS <u>Task</u> 16, Hydro TCP, Hydrogen TCP,
Minute scale forecasting (WP2)		\star		Workshop / Paper	D2.5 / M31, M36 = April 2024, Risø	Wind Tasks 32 Lidar, 44 Farm Flow Control and 50 Hybrids
Uncertainty / probabilistic forecasting (WP3)			*	Uncertainty propagation paper with data RecPract v3	D 2.6 / M42 M48	PVPS T16
Decision making under uncertainty (WP3)			*	Training course Games	M12 M18	
Extreme power system events (WP3)			*	Workshop	D3.6 / M42= Spring 2025, Boulder	Task 25, ESIG, IEA ISGAN, PVPS T16, G-PST
Data science and artificial intelligence (WP3)			*	Report	D2.3 / M30	
Privacy, data markets and sharing (WP3)			*	Workshop / Paper Data format standard	D3.5 / M15	ESIG IEEE WG Energy Forecasting
Value of forecasting (WP3)			*	Paper	D 3.4 / M33	

The current Work Program:

- 11 work streams
- **Collaboration** with other IEA Wind Tasks (Lidar, Hybrid Power Plants, Wind Farm Flow Control, Large-Scale Integration, Distributed Wind, Airborne Wind, ...) and other IEA TCPs (PVPS, Biomass, Hydrogen, Hydro, ...) as well as WMO
- Collaboration with IEC SC8A WG2 Forecasting of Renewable Energy, on developing the **first standard for real-time forecasting** built on IEA Wind Recommended Practice for:



Workshop

Forecasts of wind and clouds are important inputs for the control and value of renewable power plants. The forecasts on a time resolution of minutes or seconds are typically data driven, looking at upstream plants, all-sky images of clouds or direct measurements of wind by lidars or sodars. Therefore, to facilitate the dissemination of information about minute-scale forecasting products, skill, applications, issues, and best practices to members of the electric energy community, we invited to a Minute-Scale Forecasting workshop with the goal of

- gathering information about methods used to produce the forecasts
- current state-of-the-art skill and uncertainty in forecasting for variables on high temporal resolution
- current and planned research activities intended to improve skill
- types of public and private sector operational forecasting products
- the range of minute scale applications in the energy community and the quantified or perceived value obtained from those applications
- sensitivity of user's application performance to variations in skill
- the unmet minute-scale forecasting-related needs or desires of the energy user community.

The workshop took place as the collaboration of the International Energy Agency's (IEA) <u>Wind Task 51</u>, entitled "Forecasting for the Weather Driven Energy System", IEA Wind Task 52 Lidars, IEA Wind Task 50 Hybrid Power Plants, IEA Wind Task 44 Wind Farm Flow Control and IEA Photovoltaic Power Systems Programme (PVPS) <u>Task 16 Solar Resource</u>. The venue was Risø, Denmark. Some 70+ people attended in person, another 20 followed online.



technology, Artificial Intelligence (AI) is rapidly shaping industries such as Energy and Meteorology.

To help address stakeholders' concerns about the impacts of increasingly incorporating AI and Machine Learning into weather and power prediction models, the IEA Wind Task 51 "Forecasting for the weather-driven Energy System" invited to a **Webinar** in **Deep** Weather-Based Learning for **Power Prediction**.



The Webinar is now also available in our YouTube channel

In the Webinar a number of experts from the Energy Meteorology and Machine Learning / **Deep Learning (ML/DL) communi**ties showcased the latest ML/DL advancements in the weather and energy prediction arena.

https://youtu.be/t6H7diavQdg

IEA Wind Forecasting

Lessons Learned from the webinar

Positive developments:

- 1 The models start to show skill
- 1 The models suggest a new approach to meteorological questions
- **T** Fast hypothesis testing and scope narrowing for
- simulations with physics models
- 1 The models develop fast due to large resources put into new features
- \hat{T} Huge ensembles (>1000 members) are on the horizon 1 There is work underway to start the AI models from measurements alone

- input and observational data handling
- data quality control
- evaluation methods and protocols

- Use-case studies and Evaluation framework development and OpenAccess Publication:
 - WE-validate (Juniper package)
 - WE-validate_prob (R package)
 - Forecast Arbiter (formerly Solar Arbiter, now also for wind, load and net load)
 - NCEPU Evaluation and Uncertainty Quantification Framework

Our first IEA Wind Recommended Practice guideline now includes solar forecasting and how to effectively gather and utilize meteorological data from wind and solar farm locations. The guideline makes recommendations for how to select and maintain optimal forecasting solutions; it is written both from an end-user and vendor perspective. The main message is to carefully analyze your needs S E E before planning for or evaluating

a forecasting solution.



IEA Wind Recommended Practice for the Implementation of Renewable Energy **Forecasting Solutions**



Lessons learned from the Minute-scale workshop

Two aspects of Minute-scale:

- 1) Forecasts for the next minutes ahead
- 2) Forecasting in time-scales of minutes

The first (1) is done with data-driven or hybrid algorithms such as:

Data-driven: Machine Learning, dynamic graph ML, neural networks such as GNN, feature engineering, generator models, graph convolutional long-short-term memory models etc.

Hybrid: can include heterogenous data sources from satellite or NWP images improve predictions, use cloud-scale dependent autoregressive advection or deep learning radiative transfer emulators, Kalman filters

Observational data sources are:

- WIND: scanning LIDARs with scanning heads, or sonic anemometers and sodars for wind applications
- SOLAR: ASI (all sky imaging, fish-eye cameras pointed at the sky) and satellite observations

Learnings from recent research:

- Feature engineering methods need "engineering" in the sense of knowing the atmosphere and its development to be useful
- High-resolution NWP with high-time resolution of the order 5-10min are enabling NWP models to be used for minute-scale forecasting
- Al weather forecasting system 3D-CNN is mapping relationship between global analysis and local measurements and aims to replace the modelling process of NWP with local measurements
- **Evaluation methods:**
- Data Scientist and Physicists/Meteorologist evaluate forecast skill and value different
- Data-driven and NWP-driven methods model/predict different space and time scales of features and this needs to be considered in the comparison process

Challenges to be solved:

- \checkmark Quality control of input data is not yet handled outliers, missing or corrupt data
- High complexity and variety of data to train models is a challenge
- Feature engineering needs features without physics this will be difficult
- Data-driven models require new look upon data sharing which has been a challenge until now

The OpenAccess Recommended Practice guideline is purchasable as paperback book and available for download by Elsevier– for both see QR code

For collaboration/information with the Task or to receive our newsletter, please contact the Task Managers Gregor Giebel (grgi@dtu.dk), Caroline Draxl (CDraxl@epri.com) or Corinna Möhrlen (com@weprog.com) Current member countries are AT, CN, DE, DK, ES, FR, IE, NL, PT, SE, UK and US.



- End-users and applications:
- O&M Wind has changed focus from scanning LIDARS due to costs since last workshop(2018) to data-driven methods with near-by measurements
- System operators are seeing the need for • balancing the grid and ramping reserves
- Traders are seeing the need for :
 - Balancing and ancillary services

