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1 **WEATHER AS A DRIVER OF THE ENERGY TRANSITION – PRESENT AND**  
2 **EMERGING PERSPECTIVES OF ENERGY METEOROLOGY**

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13

14 **Abstract**

15 Energy meteorology is an applied research field of meteorology that focuses on the study and  
16 prediction of weather conditions and events that affect energy production and use. This field  
17 has become increasingly important as the energy industry has become more dependent on  
18 weather conditions, especially in the areas of renewable energy sources such as wind energy,  
19 solar energy and hydropower. The following paper has been written by experts of the  
20 Committee on Energy Meteorology of the German Meteorological Society summarizing their more  
21 than 30 years experience and lessons learnt. It gives an overview of activities in energy  
22 meteorology that are already essential for the transformation of energy systems to systems  
23 with high shares of renewable energies. Building on this, the experts have created a vision of  
24 future topics that describes the future research landscape of energy meteorology. The authors  
25 explain that work in energy meteorology in recent years has primarily been concerned with  
26 the physically based modeling of wind and solar power generation and the development of  
27 short-term forecasting systems. In future years, a significant expansion of work in the areas of  
28 energy system modeling, digitalization and climate change is expected This includes the  
29 detailed consideration of regionally specified spatio-temporal variability for system design,  
30 the integration of artificial intelligence skills, the development of weather-related

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31 consumption based on smart meters, and the mapping of the effects of climate change on the  
32 energy system in planning and operating processes.

### 33 **Introduction**

34 Many energy systems worldwide will primarily rely on renewable – and weather-dependent -  
35 energy technologies. Energy meteorology is an applied research field, which facilitates the  
36 operation of such energy systems. Energy meteorology sits at the interface of many  
37 disciplines that are related to energy such as meteorology, physics, ecology, engineering,  
38 computer science, and economics. The collaboration between these fields will allow to  
39 understand the interconnected nature of the energy system. Energy meteorology will be the  
40 enabler of a sustainable, reliable, and economical energy system.

41

### 42 **State-of-the-art in energy meteorology**

43 Energy meteorology is a mature field that has already contributed substantially to different  
44 fields in green energy transition as follows. The following is an overview of the main topics  
45 of energy meteorology to date.

46

47 There are many different established tools to model the production of solar and wind power  
48 plants at different sites in great detail. This detail is the result of R&D in advanced  
49 measurement technologies and advanced modeling techniques many of which have been  
50 commercialized. These models use different methods to convert meteorological parameters  
51 such as solar irradiance and wind speed into power production with great accuracy using  
52 technology-specific models. The combination of technological expertise and meteorology is  
53 of great importance here. Meteorological models and remote sensing systems can provide  
54 relevant parameters such as solar irradiance or solar power production for specific sites or  
55 aggregated over an electric balancing area.

56 Weather forecasting and reanalysis data from several national weather services is available for  
57 energy system analysis and forecasting. Forecasts from numerical weather prediction are  
58 successfully combined with short-term forecasts from satellite and ground-based observation  
59 systems to enhance forecast quality. In the last years a major focus lies on the utilization of  
60 probabilistic forecasting to support probabilistic and risk-based analysis and decision making  
61 in energy systems.

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62 Operational weather services have adapted their forecasts to the requirements of the energy  
63 system operators by increasing temporal resolution and providing more types of parameters.  
64 There are many meteorological service providers and specialized consulting companies who  
65 offer meteorological data related to energy systems. Energy system operators, traders, and  
66 distribution system operators increasingly integrate products from these providers into their  
67 operations. A growing number of universities offer courses and degrees in energy  
68 meteorology and integrate the energy meteorological content into education and practical  
69 training.

#### 70 **Perspectives of energy meteorology**

71 The developers of the field of energy meteorology have always envisioned an energy system  
72 with high renewable penetration. This vision is now being realized at a breathtaking pace. The  
73 committee on energy meteorology in the German Meteorological Society (DMG) is a forum  
74 for the collaboration between researchers and practitioners from Austria, Germany, and  
75 Switzerland. The expert group relies on a more than 30 years of experience in the energy  
76 transition in Central Europe. Through this collaboration, the committee has developed the  
77 following priorities and challenges for the future research in energy meteorology. In this  
78 perspectives paper, the committee would like to support the world-wide energy transition by  
79 bringing these thoughts into international discussion. Such international discussions are  
80 typically organized within the International Energy Agency (IEA) expert task groups or the  
81 World Meteorological Organization (WMO).

82 Improved data and digitalization promote the modeling of complex processes, which can  
83 reduce the over-reliance on expensive hardware for grid control. Physics-based and AI-based  
84 methods as well as large datasets exist. However, the large potential of energy informatics and  
85 digitalization has yet to be fully embraced by the energy industry. For example, the growing  
86 importance of decentralized operation of distribution system could greatly benefit from  
87 digitalization. The large number of weather-dependent generators and loads require scalable,  
88 standardized, and automated processes that could greatly benefit from energy meteorological  
89 information.

90 AI based modelling shows manifold advantages for different weather dependent use cases in  
91 the energy sector based on large model and measurement data sets. Especially shortest-term  
92 forecast systems will profit from modern AI technologies.

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93 Currently there is a lack of dialog between meteorologists and the energy community. The  
94 energy community consists of a large number of different actors e.g. from industries as  
95 project developers and operators of grids and generation; as energy users, investors or R&D  
96 institutions. The energy community increasingly relies on AI for modeling and control. While  
97 AI leverages energy meteorological data, the energy community often lacks the domain  
98 knowledge for advanced quality control, preprocessing, and further data development. The  
99 lack of knowledge exchange presents a barrier to innovation and technology transfer.

100 In several countries, government officials who regulate and fund energy meteorology are  
101 spread over several departments. This leads to communication challenges and  
102 interdisciplinary activities in energy meteorology then often fall through the cracks. On the  
103 other hand, the European Union and European Space Agency for instance are better set up to  
104 promote interdisciplinary research on energy meteorology.

105 There is a need to better integrate university courses and programs in meteorology, physics,  
106 engineering, computer science, and economics. Especially, programs in control systems and  
107 power systems and courses such as renewable power plant design and distribution system  
108 design and operation should integrate energy meteorology content into their programs.  
109 Likewise, meteorology programs should teach about the basis of energy systems to enable  
110 students to understand the requirements for meteorological data and processes in the industry.

111 There are many research results, e.g. on reducing costs of energy by optimizing energy  
112 storage systems or the spatio-temporal complementarity of renewable generation due to  
113 weather. These research results are very relevant to optimization the operation of electricity  
114 grids. More systematic knowledge transfer of these research results to governments and the  
115 private sector is needed.

116 Processes for weather-dependent capacity assumptions (dynamic line rating) and operations  
117 of transmission lines have to be tested and moved into operation. Improved operation of  
118 transmission lines is critical to reduce congestion of existing lines and avoid the construction  
119 of new transmission lines.

120 Improved methods of load forecasting and demand response should also be transferred to  
121 operators. Consumer and load behavior is affecting the load curve through electric vehicles,  
122 heat pumps, and energy storage. The joint operation of these systems with renewable energy  
123 requires efficient and coupled forecasting and modeling tools.

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124 Reducing energy consumption in the building sector is a centerpiece of the energy transition.  
125 Modeling the effects of the meteorology on energy consumption of buildings is a hot topic.  
126 Building energy management systems for heating and cooling that integrate predictive  
127 information are starting to be commercialized, but they require continued improvements. The  
128 dynamic behavior of buildings, their users, and the effects of distributed optimization of loads  
129 on electricity, heat, and gas networks should be considered.

130 In a world with high penetrations of distributed energy generation, the accuracy and spatial  
131 and temporal resolution of meteorological models and earth observation systems require  
132 further improvement to enable accurate local control. For solar radiation the Meteosat Third  
133 Generation (MTG) satellite system will enable these improvements as well as the new  
134 generation of HIMAWARI and GOES satellites. For wind speed – especially for distant  
135 offshore wind power plants as well as wind power plants at 500 m nacelle heights - LiDAR  
136 technologies could be applied.

137 The design of renewable power plants should be adapted to the climatic conditions and their  
138 changes in response to global warming. Of particular concern are extreme conditions during  
139 heat and cold waves as well as variability e.g. due to atmospheric turbulence, soiling, or the  
140 spectral composition of solar radiation. The impact of largely extended wind energy usage on  
141 local and regional climate needs to be monitored for environmental as well as economic  
142 reasons e.g. between neighboring wind parks.

143 There is a renewed interest in the performance of materials and technologies for energy  
144 systems in different climate zones and in regions with different spatio-temporal  
145 meteorological variability. In specific, do different energy storage and power-to-X  
146 technologies perform differently in different regions?

147 Seasonal forecasts of up to 6 months ahead are of growing importance especially to identify  
148 periods of prolonged low solar radiation, winds (dunkelflaute), or water levels. Early  
149 warnings of such conditions will contribute to reducing risks and costs for reliable energy  
150 supply.

151 So far climate models have focused primarily on temperature, wind speed in 10m height, and  
152 precipitation. The modeling of clouds, solar radiation and wind speeds in heights of more than  
153 100m in climate models needs to be further improved. Climate models should be evaluated  
154 from the perspective of their fitness for modeling energy systems. Moreover, standards for  
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155 pre-processing and utilization of climate model data for energy system modeling are needed.  
156 These evaluations and standards would build the confidence for energy systems modelers to  
157 leverage `big data` from climate models.

158 There are several open questions as to how energy systems will need to adapt to climate  
159 change. How will solar and wind resources change? How will conventional generators be  
160 affected? How will the cooling demand change? How will the global generation distribution  
161 change? How will change in spatio-temporal generation affect European transmission lines?  
162 Which infrastructure needs to be adapted to climate change and how? How does climate  
163 change affect the design of new infrastructure?

#### 164 **Conclusion**

165 After more than 30 years of R&D, energy meteorology has established itself in recent years as  
166 an independent field of research. Within energy systems based on high shares of weather-  
167 dependent energy sources models for determining the feed-in of such volatile energy sources  
168 are indispensable for planning and operational management processes. However, a wide range  
169 of issues and challenges are also expected in the future, for which the expertise of energy  
170 meteorology will be required. In summary, the following key aspects can be mentioned as  
171 lessons learnt, which will have an overriding relevance in energy meteorology in the future

- 172 • Energy meteorology will have to rapidly expand its interdisciplinarity, in order to be  
173 able to answer increasingly important weather-related questions. On the one hand, this  
174 includes fundamental expertise in the areas of digitalization, AI, and climate research,  
175 but on the other hand also application-specific knowledge that extend across the  
176 electricity, heating and transport sectors including energy storage and sector coupling  
177 technologies.
- 178 • The aforementioned aspect puts emphasis on the need for cross-domain thinking. This  
179 includes not only a general understanding but also - and especially in the context of  
180 advancing digitalization - the ability to correctly interpret, process and make use of  
181 new and unknown data.
- 182 • Deterministic short-term forecasts of wind and solar are already established. The  
183 upcoming need lies primarily in the development of 1) small-scale, cross-sectoral  
184 forecasts of consumption and flexible services, 2) longer-term to seasonal forecasts for  
185 issues of security of supply and 3) fundamental probabilistic modelling to estimate  
186 uncertainties and extreme scenarios.

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187 There are many open questions. While some answers exist, there are and will be additional  
188 challenges in modern energy meteorology. Increased collaboration from all parties in the  
189 energy system is an urgent necessity. Energy meteorology will remain a critical enabler of the  
190 success of the energy transition worldwide.

191

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195 **Conflict of interest statement**

196 The authors have no conflicts to disclose.

197 **Author contributions:**

198 M. Schroedter-Homscheidt wrote the initial version and is responsible for the  
199 conceptualization, Jan Dobschinski, Stefan Emeis, Detlev Heinemann, and Stefanie Meilinger  
200 contributed in editing and completing the manuscript writing.

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