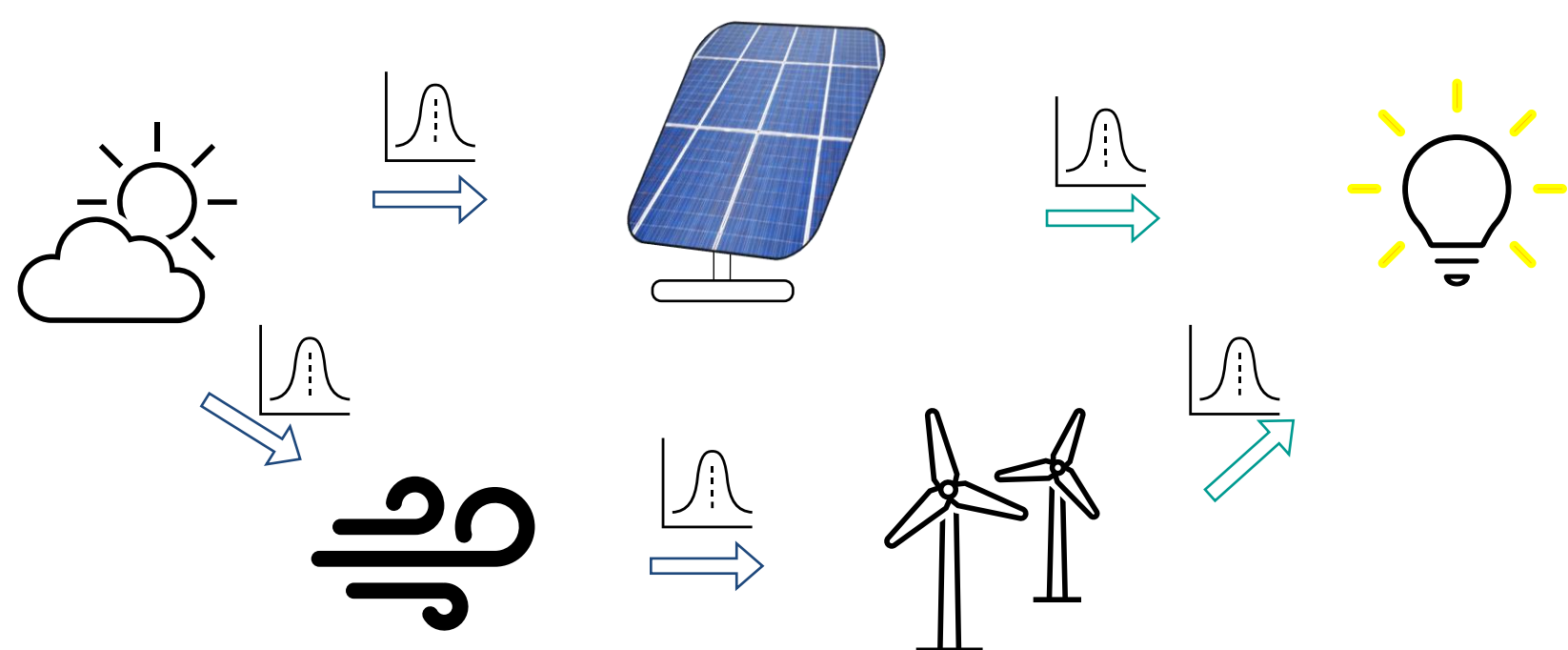




# Deep probabilistic modelling for energy forecasting

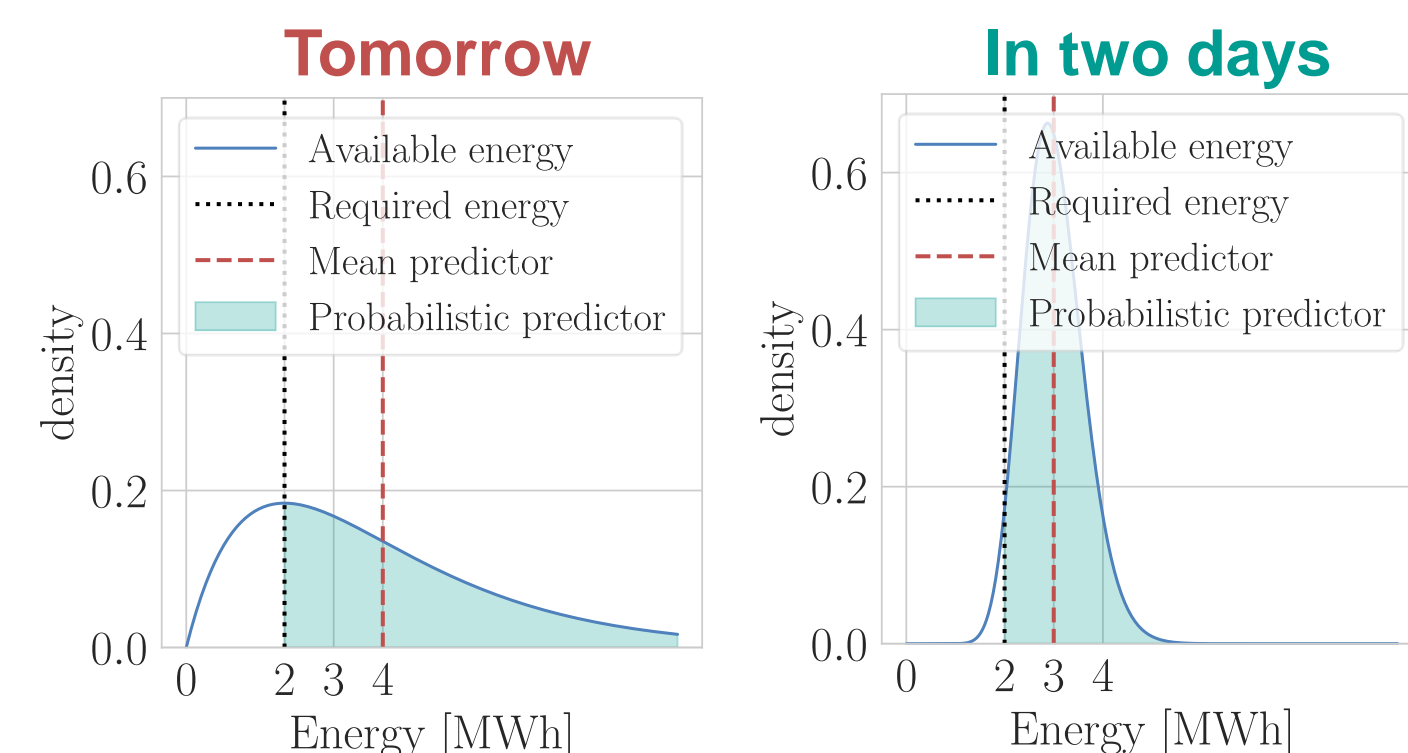
## Why



High uncertainties in renewable energy production (also in demand)

**Boss:** When do we have the greatest opportunity to produce our product (2MWh) with 100% renewable energy?

**Mr. Meanpredictor:** "Tomorrow we expect to have **4MWh** compared to 3MWh in two days."



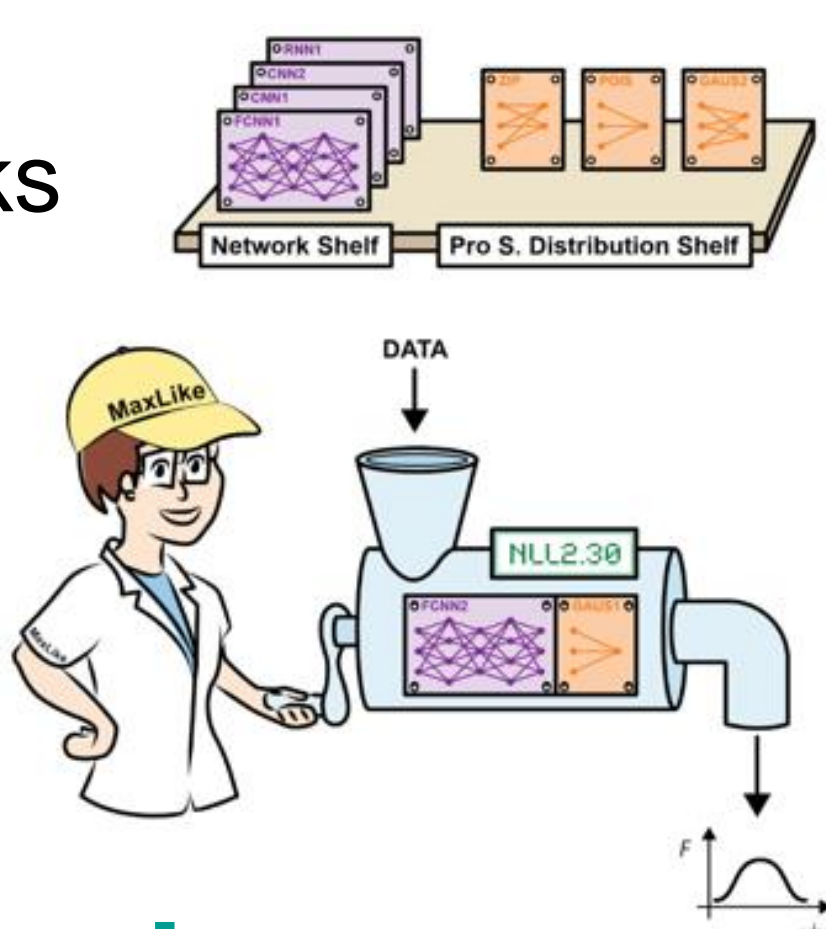
**Mr. Probability:** "Wait, but **in two days** there is a **96% chance** that the energy will be sufficient, compared to the **73% chance** we get tomorrow. We should prefer to produce in two days"

**Probability to rescue.**



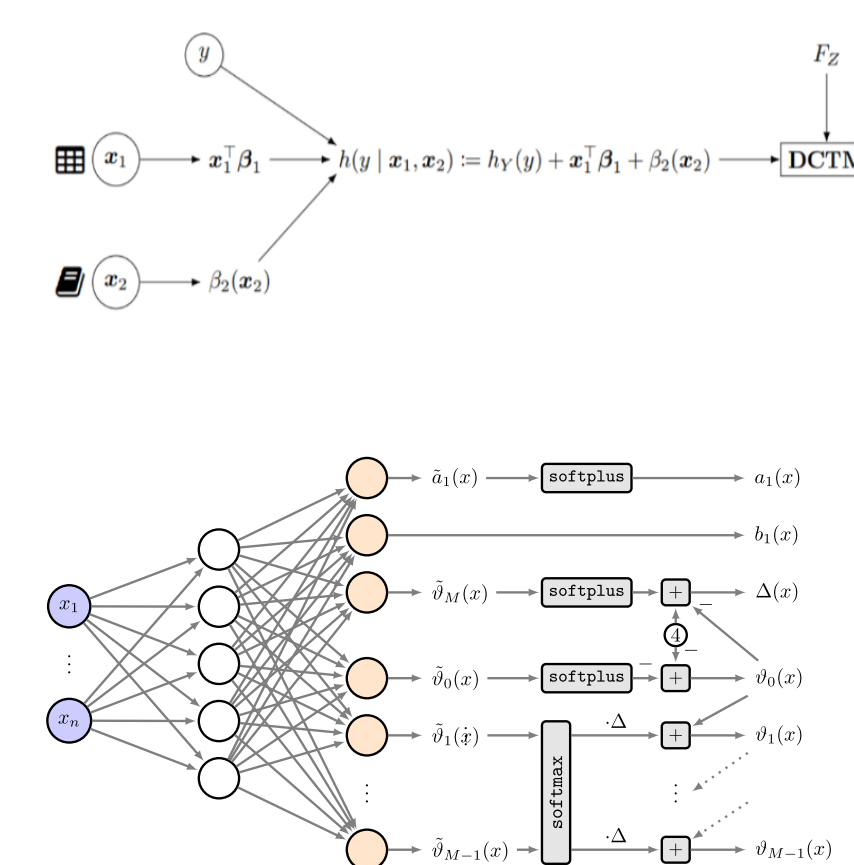
## How

We combine Neural Networks with traditional statistic [1-5]



NN to model interpretable distributions [3]

NN to model complex prob. distributions [2, 5]



## Current projects

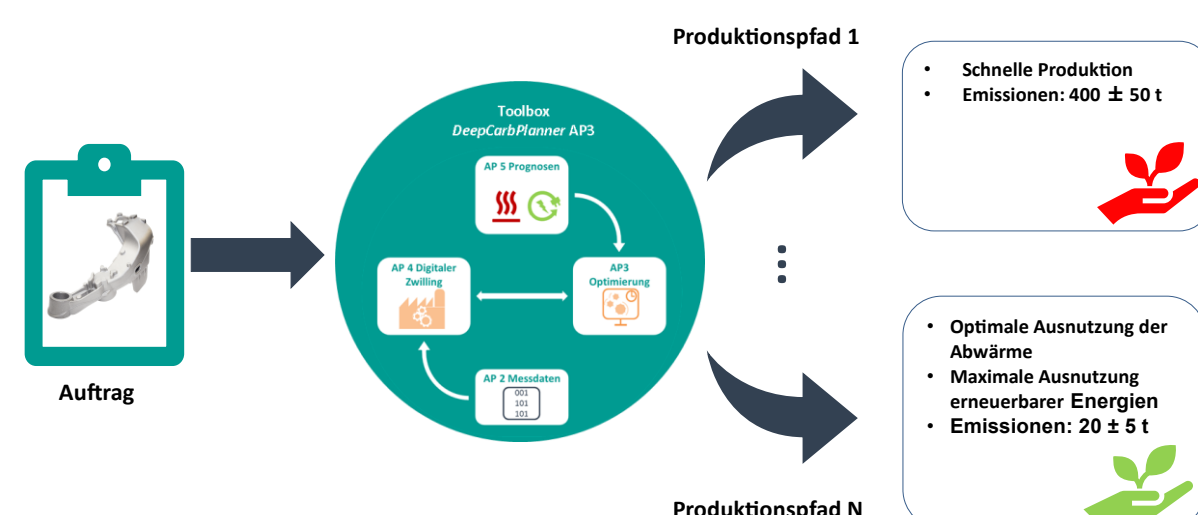
### DeepDoubt



Development of uncertainty measures to increase transparency and traceability in Deep Learning. (BmBF 640k€ Euro 2020 - 2023)

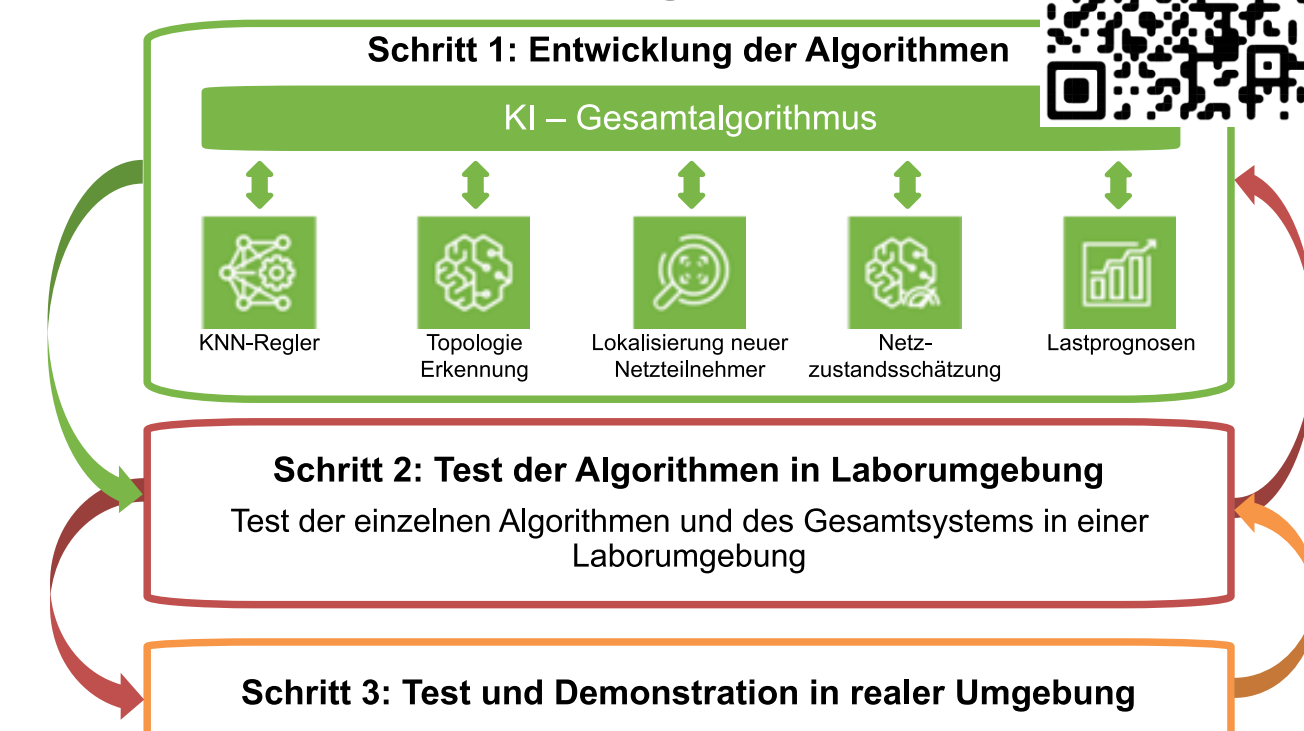
### DeepCarbPlanner

#### Workflow



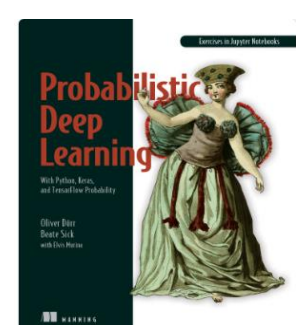
Decarbonization of energy-intensive industry through smart sector coupling with AI-based probabilistic forecasting and operations management. (Carl Zeiss Stiftung 1M€ 2023-2026)

### AI4Grids



AI-based planning and operational management of distribution grids and microgrids for optimal integration of renewable generators and fluctuating loads in the context of the energy transition.

## Our recent work on probabilistic deep learning



- [1] Dürr, Oliver, Beate Sick, and Elvis Murina. Probabilistic Deep Learning: With Python, Keras and TensorFlow Probability. Manning Publications, 2020.
- [2] Sick, Beate, Torsten Hothorn, and Oliver Dürr. "Deep transformation models: Tackling complex regression problems with neural network based transformation models." *2020 25th International Conference on Pattern Recognition (ICPR)*. IEEE, 2021.
- [3] Kook, Lucas, Lisa Herzog, Torsten Hothorn, Oliver Dürr, and Beate Sick "Deep and interpretable regression models for ordinal outcomes." *Pattern Recognition* 122 (2022): 108263.
- [4] Dürr, Oliver, Stephan Hörling, Daniel Dold, Ivonne Kovylov, and Beate Sick "Bernstein flows for flexible posteriors in variational bayes." *arXiv preprint arXiv:2202.05650* (2022).
- [5] Arpogaus, Marcel, Marcus Voß, Beate Sick, Mark Nigge-Uricher, and Oliver Dürr "Short-term density forecasting of low-voltage load using Bernstein-polynomial normalizing flows." *IEEE Transactions on Smart Grid* (2023).

