

## INTRODUCTION

Ensuring the reliability of power systems largely based on variable renewable energy sources (VRES) requires addressing periods of prolonged low resource availability, known as renewable energy droughts (REDs). These events, marked by simultaneous low solar and wind generation coinciding with high electricity demand, pose significant challenges to achieving full decarbonization. Key strategies for mitigating REDs include the hybridization of VRES, oversizing the system, meaning the installation of VRES capacity exceeding 100% of the annual mean demand, and the deployment of long-duration energy storage (LDES) technologies to bridge the gap between renewable generation and electricity demand during these critical periods.

### RESEARCH QUESTION:

What effect does the change in: ① Installed power capacity of VRES, ② Ratio between the amount of demand covered by solar PV and by onshore wind turbines (PV : WT ratio), ③ Energy storage capacity of LDES, have on the occurrence of extreme REDs and associated energy shortages?

## ASSUMPTIONS AND DATA

### Energy sources:

- Onshore wind turbines (WT):  $CF_W = 24.7\%$
- Solar photovoltaics (PV):  $CF_S = 12.1\%$
- Long-duration energy storage

CF – mean capacity factor (1980-2019)

### Electrical grid:

- As 'copperplate' inside the country
- No interconnection with neighbouring countries

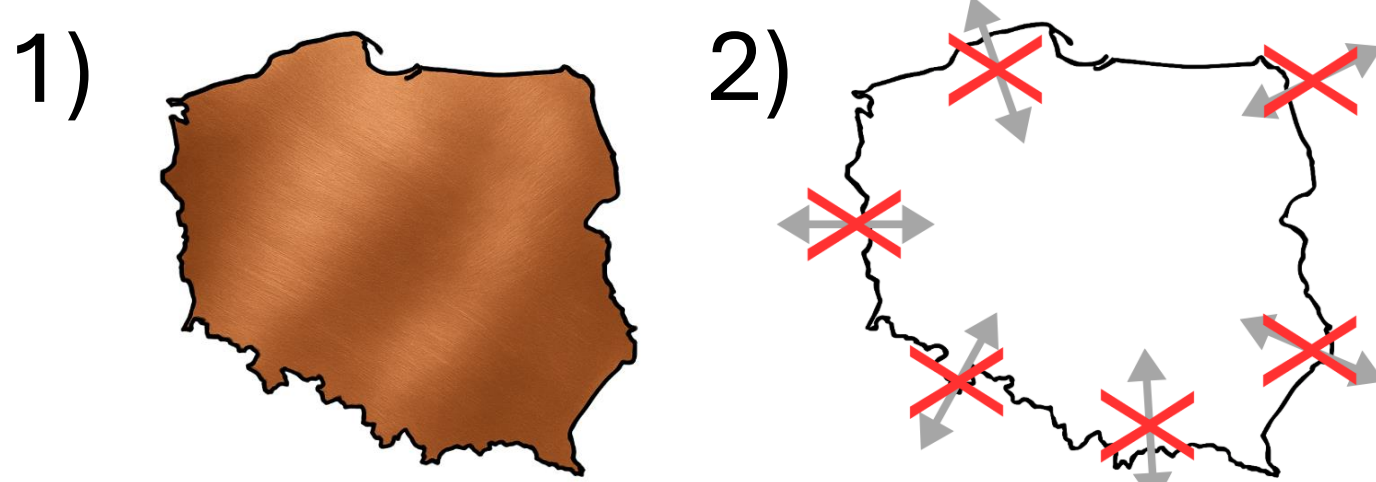
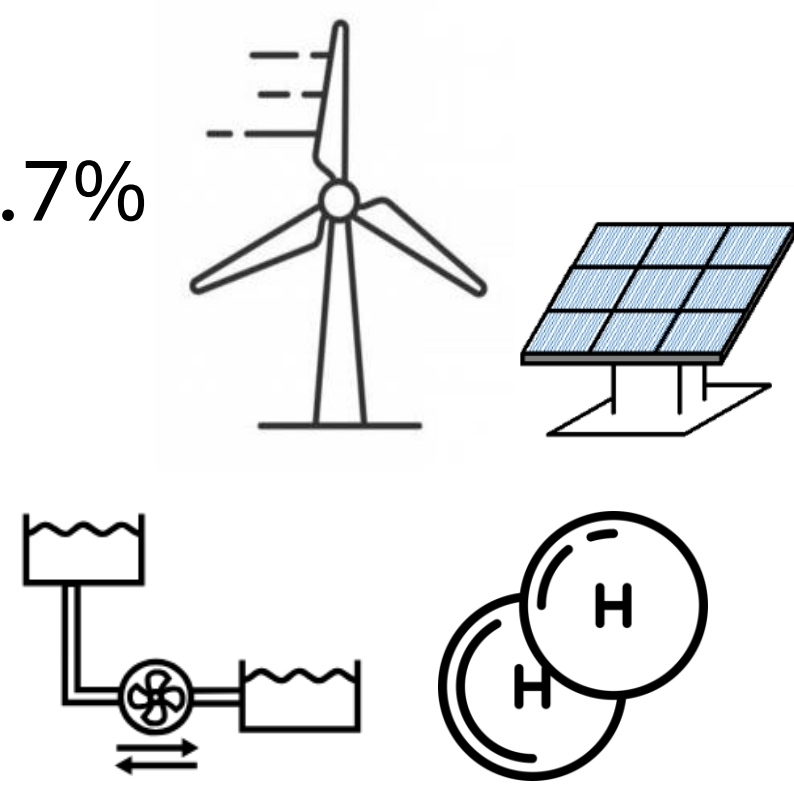
### Data:

- Hourly resolution
- Coverage: 1980-2019

Sources



- PV & WT mean capacity factor: MERRA-2 (renewables.ninja)
- Load: ENTSO-e & MERRA-2

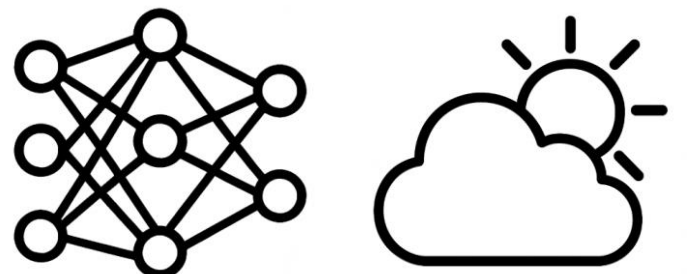


## METHODS

### 40 years of hourly electricity demand time series

**Artificial Neural Network (ANN)** model training: multiple feedforward ANN models in MATLAB trained to simulate hourly electricity demand based on historical inputs and weather variables.

- Historical load data: 2015-2019 (ENTSO-e).
- Weather data: 1980-2019 (MERRA-2, population-weighted).
- Data split: 70% training, 15% validation, 15% testing.
- Hyperparameter tuning: Number of neurons in the hidden layer varied from 1 to 30. Model with minimum MAPE selected.



### Energy drought metric (Boston et al., 2022)

- During periods of **negative residual load** (energy surplus) the algorithm charges the LDES. Charging is constrained by:
  - the available energy storage capacity remaining,
  - the maximum allowable charging power.
- During periods of **positive residual load** (energy deficit) discharges LDES to supply energy to the grid. Discharging is constrained by:
  - the amount of energy available in the storage (accounting for efficiency losses),
  - the maximum allowable discharging power.
- Unservd energy** is defined as the portion of the positive residual load that remains unmet after the storage is fully discharged (empty).

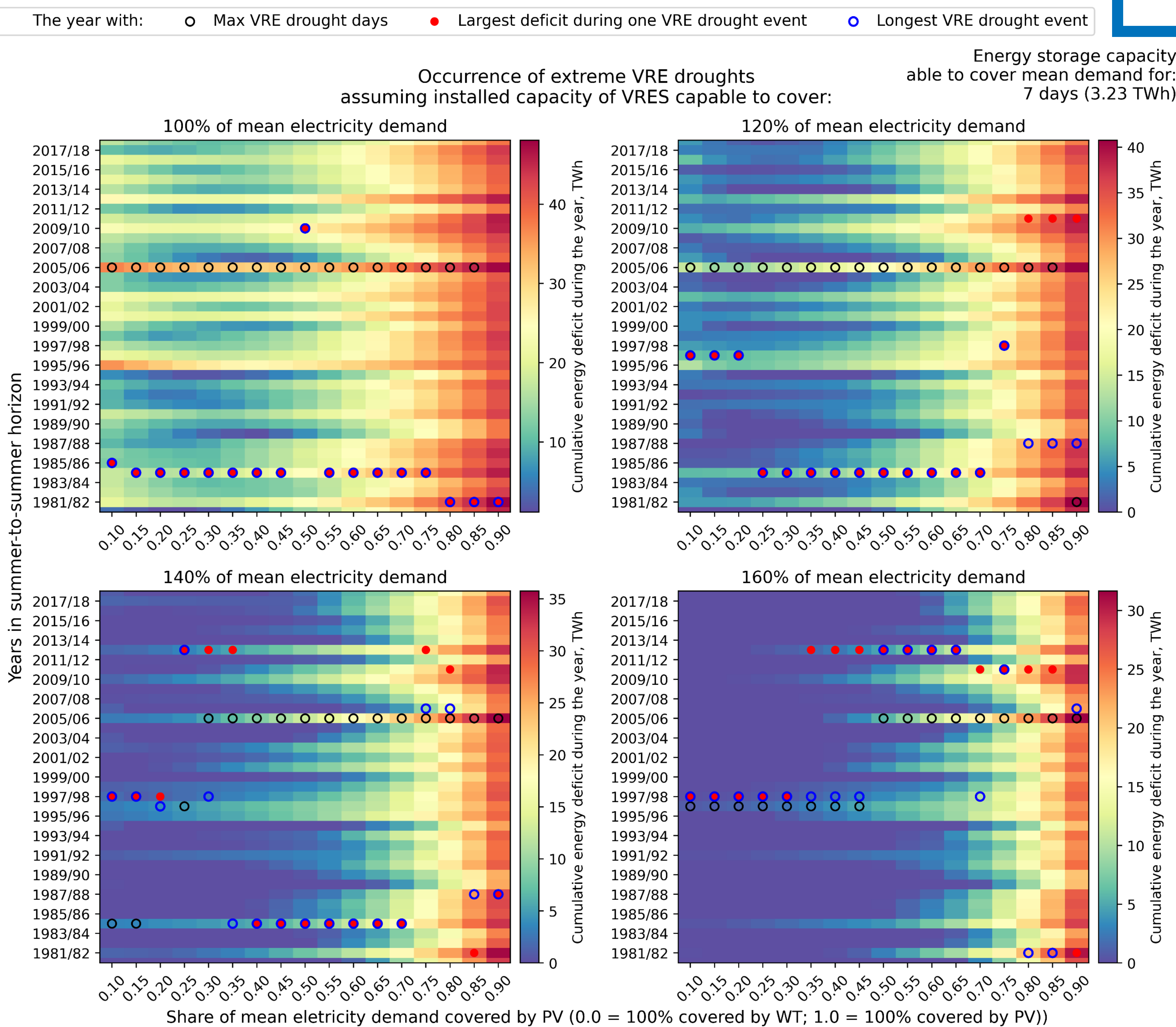
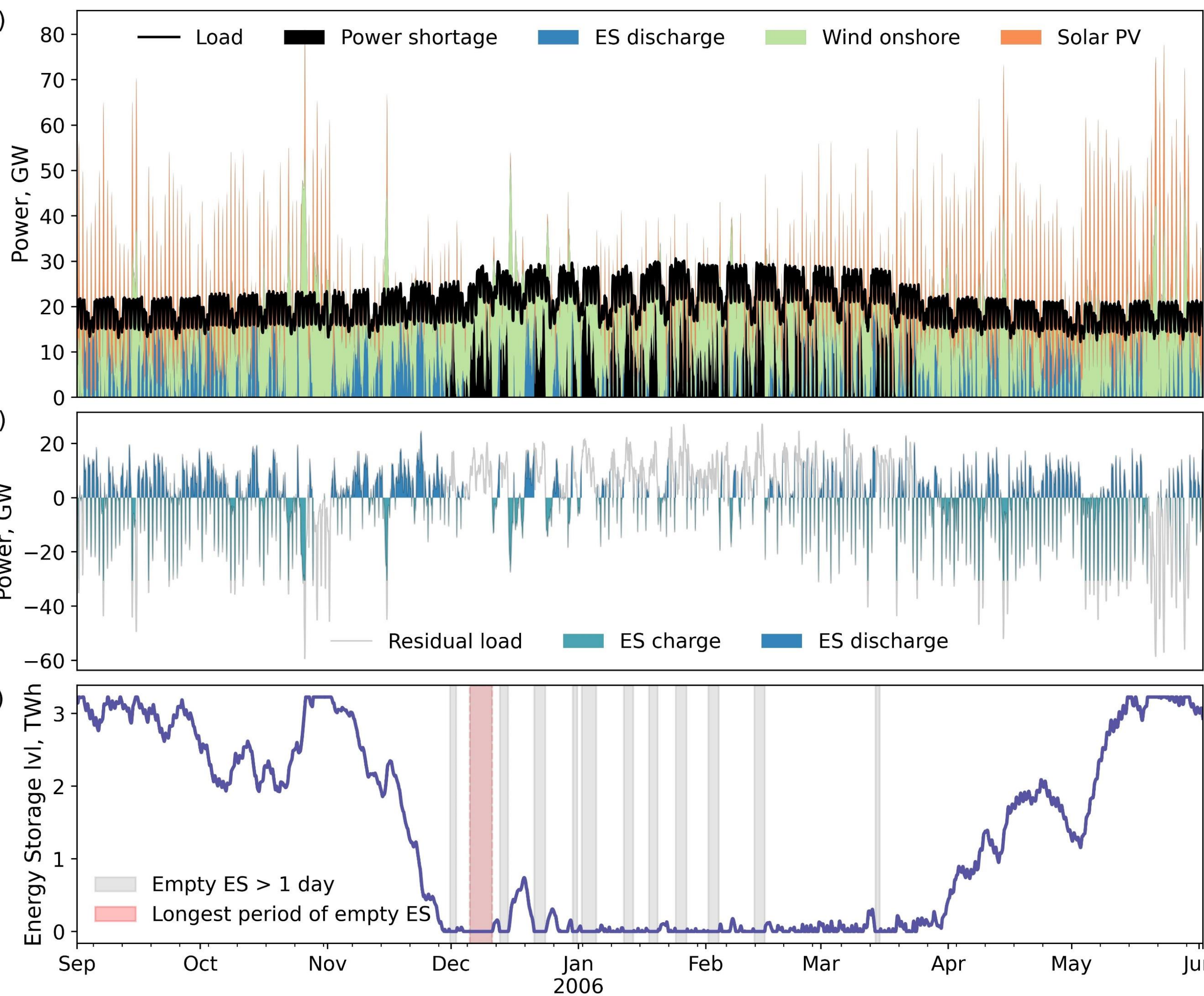
VRE drought event - uninterrupted period of empty ES over 24 hours

## RESULTS AND INSIGHTS

Hourly power system operation from 09.2005 to 06.2006

- Power production by source, load, and deficit
- Energy storage operation and residual load
- Energy storage state of charge and REDs

PV / WT ratio: 35% / 65%  
VRES cap. able to supply: 120% of MAL  
Energy storage capacity: 3.23 TWh  
(ES cap. able to supply MAL for 7 days)



### Characteristic data of

#### power system operation assuming:

- VRES demand coverage: 120%;
  - PV / WT ratio: 35 / 65%;
- LDES capacity: 3.23 (7 days).

Parameter	Value	Date
$Load_{max}$	30.61 GW	2006-01-24 16:00
$RL_{max}$	28.53 GW	2010-02-08 17:00
$RL_{min}$	-77.85 GW	1994-06-23 10:00
$E_{def,sum}$	15.7 TWh	2005/2006
$E_{def,sum} / E_{mean\ annual\ demand}$	9.33%	2005/2006

### KEY OBSERVATIONS:

- ✓ In terms of the number of renewable energy drought (RED) hours per year, the most extreme was 2005/06 and 1996/97 in the scenarios studied.
- ✓ The most extreme year or event, in terms of the RED duration or energy deficit, varies depending on the energy system assumptions.
- ✓ With a high share of VRES in demand coverage (>80%), a larger share of the energy produced by wind turbines (>65%), helps to minimize the RED hours per year.
- ✓ With unlimited maximum LDES charging capacity, reducing the occurrence of REDs to 0 would require VRES to cover 160% of long-term mean demand (LTMD), with a 30:70 of PV:WT ratio and LDES capacity able to supply 9 days of LTMD.
- ✓ With limited maximum charging and discharging power to a value equal to the maximum hourly load, it would require VRES to cover 170% of long-term mean demand (LTMD), with a 25:75 of PV:WT ratio and the same LDES capacity.

### Acknowledgments & Affiliations

This work documents the results of research project no. 2022/47/B/ST8/01113 funded by the Polish National Science Centre (Narodowe Centrum Nauki).

<sup>1</sup>Faculty of Environmental Engineering,  
Wroclaw University of Science and Technology, 50-377 Wroclaw, Poland