

National Technical
University of Athens
School of Civil Engineering



Stochastic Investigation of Solar and Wind Processes for Renewable Energy Storage in Greece

Pagoulatou, P., Mandilaki, E., Iliopoulou, T., Sargentis, G.-F., Ioannidis, R.

6 May 2026



Contents

- Research Question
- Climatic Patterns in Greece
- Energy Production & Consumption Timeseries in Greece
- Correlation between Climate and Generation CF
- Energy Droughts
- Storage demand
- Conclusions

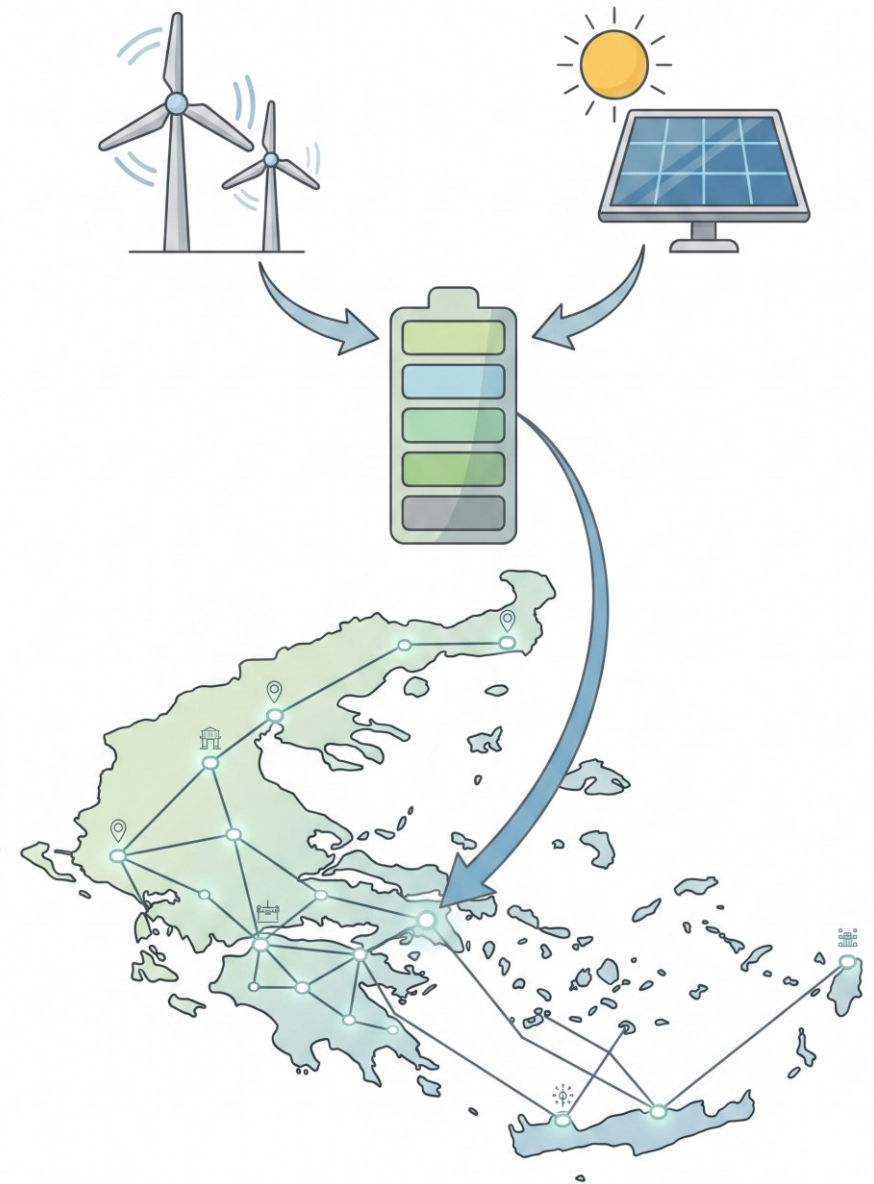
Research Question

Over the past decade, Greece has significantly expanded its installed renewable capacity. However, the stochastic nature of Renewable Energy Sources (RES) creates a critical dual challenge:

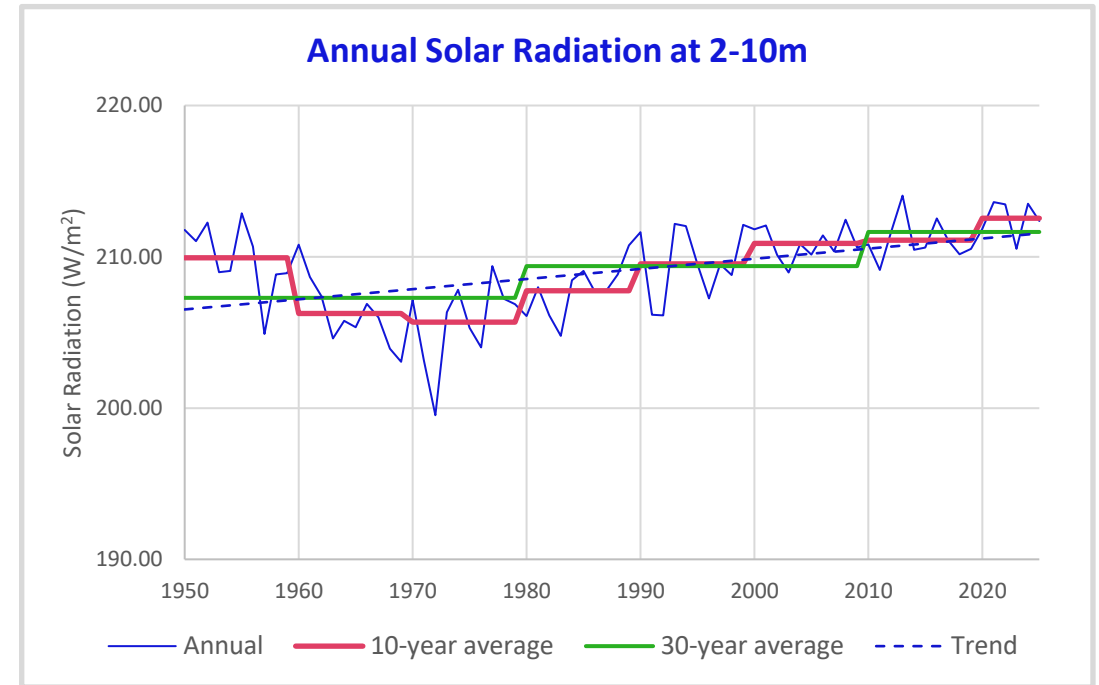
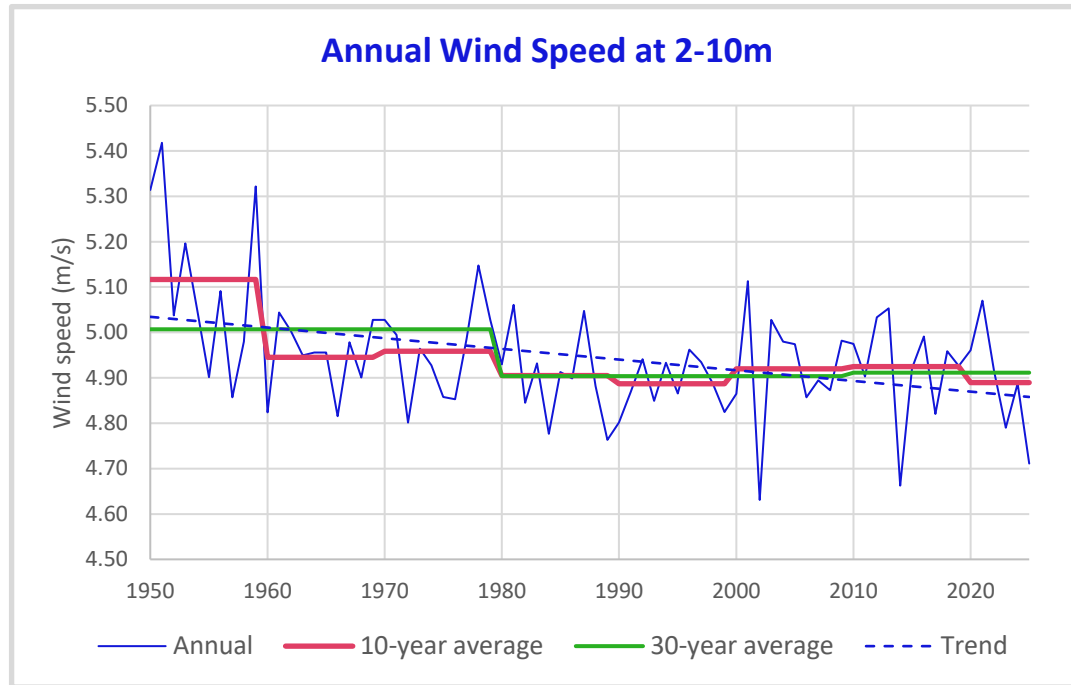
- Energy Curtailment: Frequent overproduction exceeds grid demand, resulting in wasted clean energy.
- Fossil Fuel Reliance: During periods of low weather-driven generation, the absence of energy storage forces the grid to rely on conventional power plants.

This study investigates Greece's optimal energy storage needs and formulates a robust storage model by examining:

1. **Climatic Analysis & Energy Droughts:** Evaluating historical meteorological and generation data to identify and quantify prolonged periods of low RES availability.
2. **Supply-Demand Dynamics:** Analyzing the hourly relationship between actual energy production and consumption to determine the system's energy deficits and storage capacity requirements.

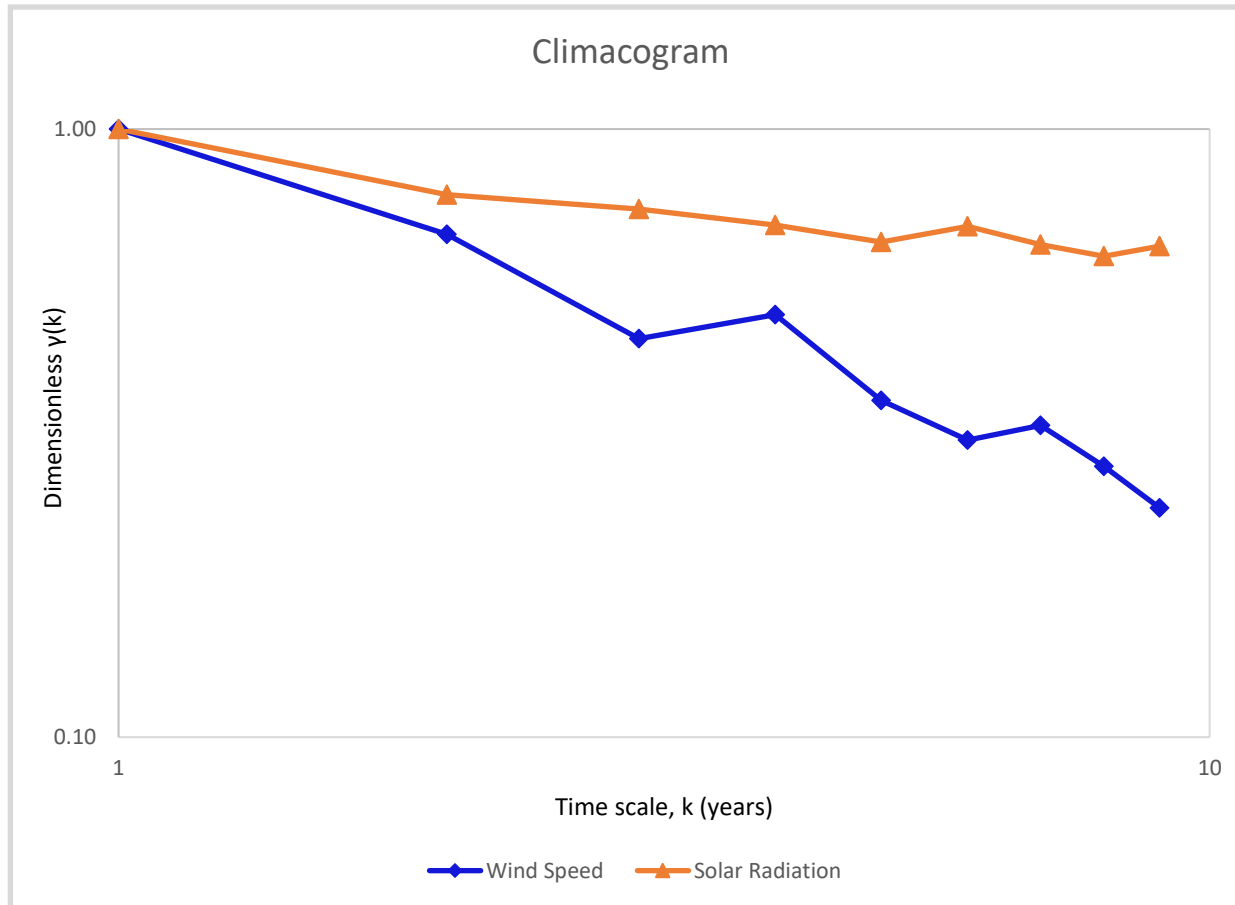


Climatic Patterns



Stochastic Parameters	Annual Wind Speed (m/s)	Annual Solar Radiation (W/m ²)
Average	4.95	209.03
Standard Deviation	0.13	2.92
Skewness	0.88	-0.64
Slope	-0.002	0.067

Climatic Pattern: Hurst-Kolmogorov process

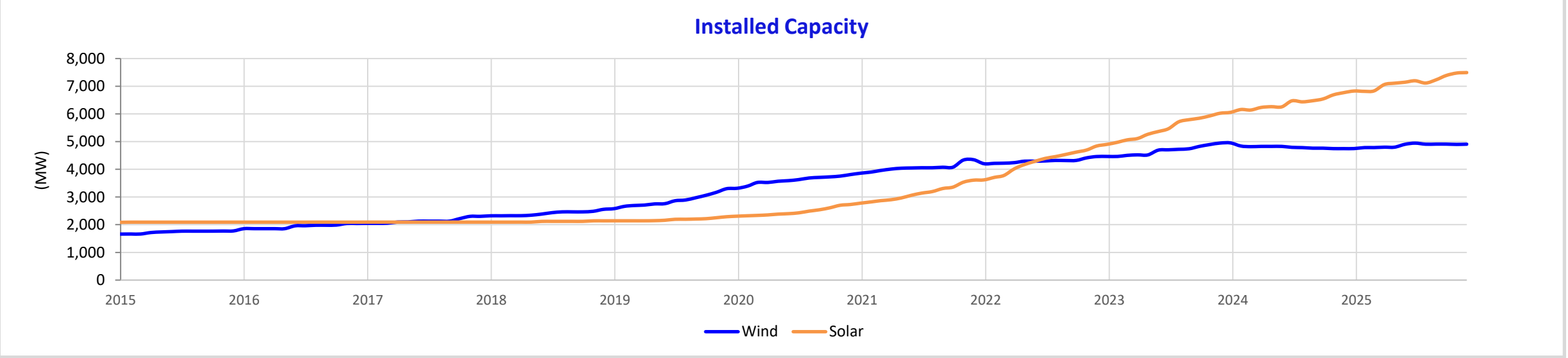
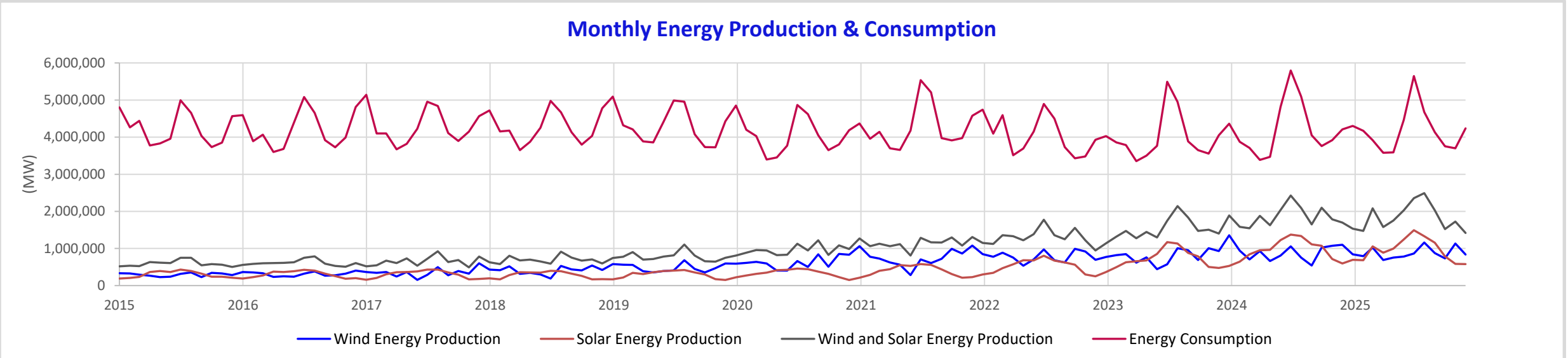


By implementing the **Hurst-Kolmogorov model** with empirical climate data, we can represent the **stochastic nature and variability** inherent in solar radiation and wind speed.

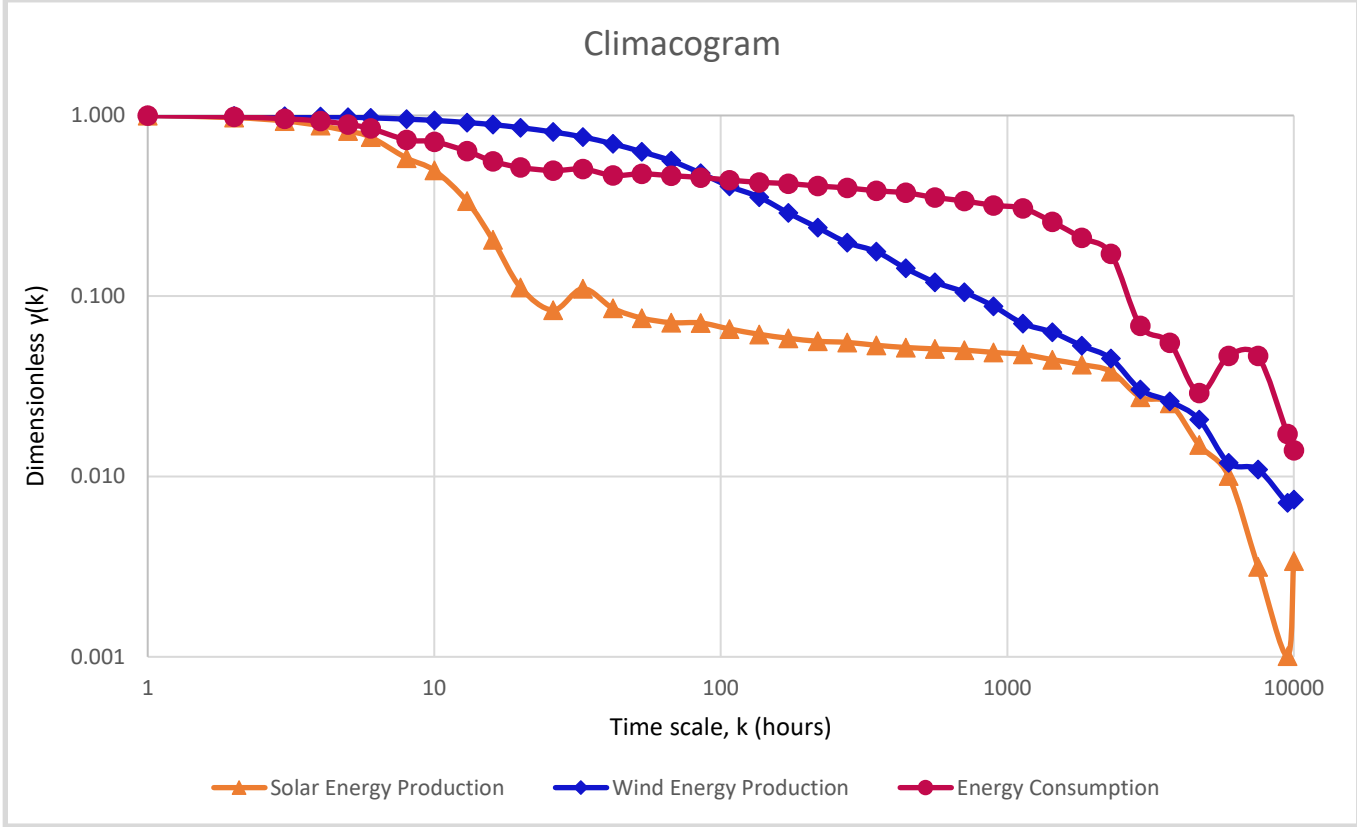
$$\gamma_k = \text{var}[\underline{x}_j^{(k)}] = \gamma_1 / k^{2-2H}$$

	Hurst
Solar Radiation	0.90
Wind Speed	0.69

Energy Production & Consumption



Energy Production and Energy Consumption: Hurst-Kolmogorov process

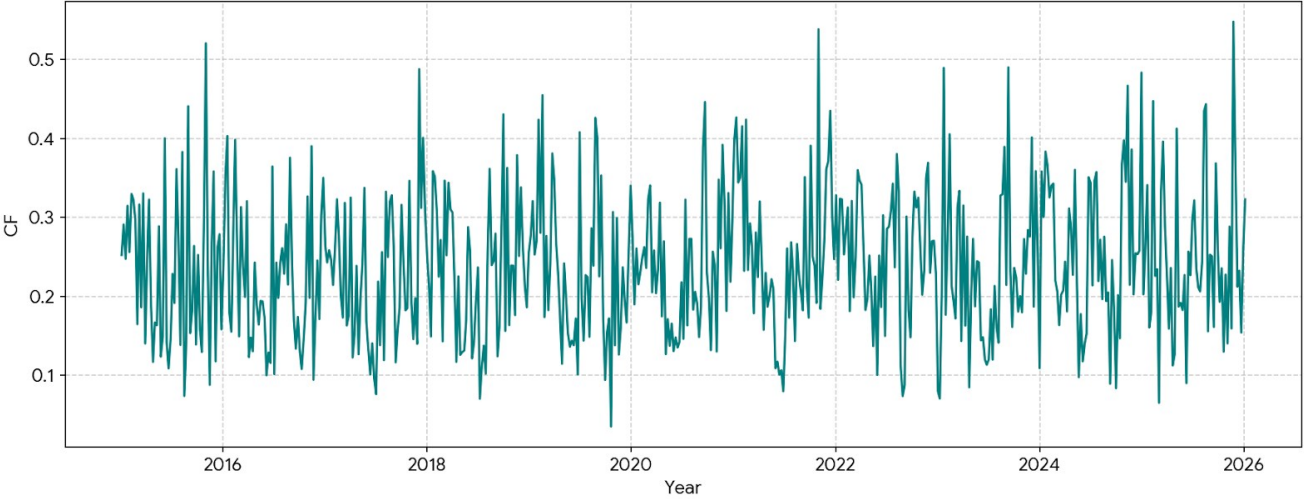


The climacograms are influenced by periodicity

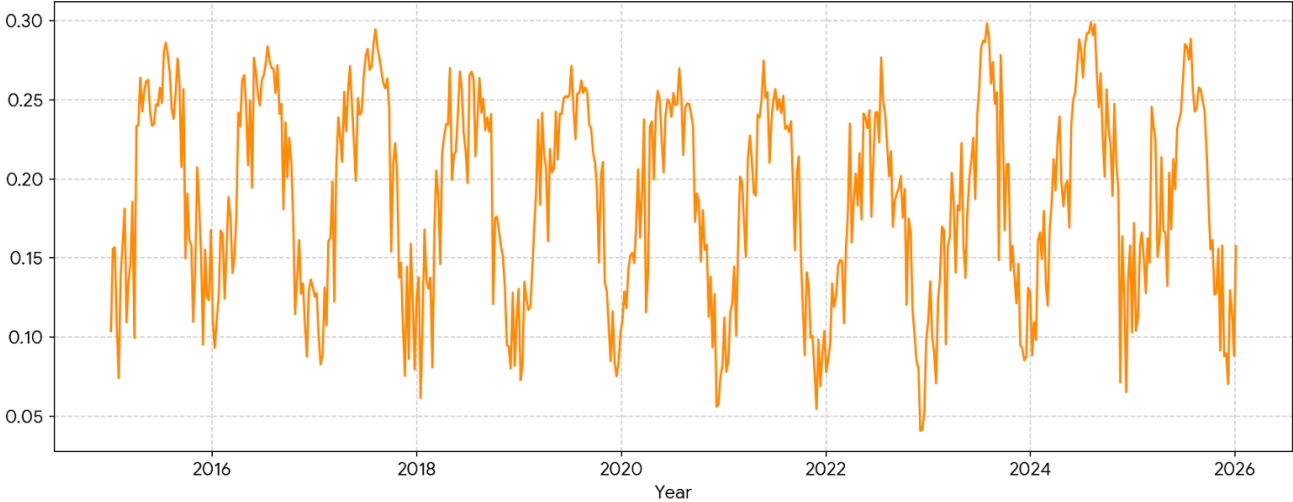
	Hurst
Solar Energy	0.72
Wind Energy	0.71
Energy Consumption	0.81

Solar & Wind Generation Capacity

Wind Generation Capacity Factor - Weekly Average



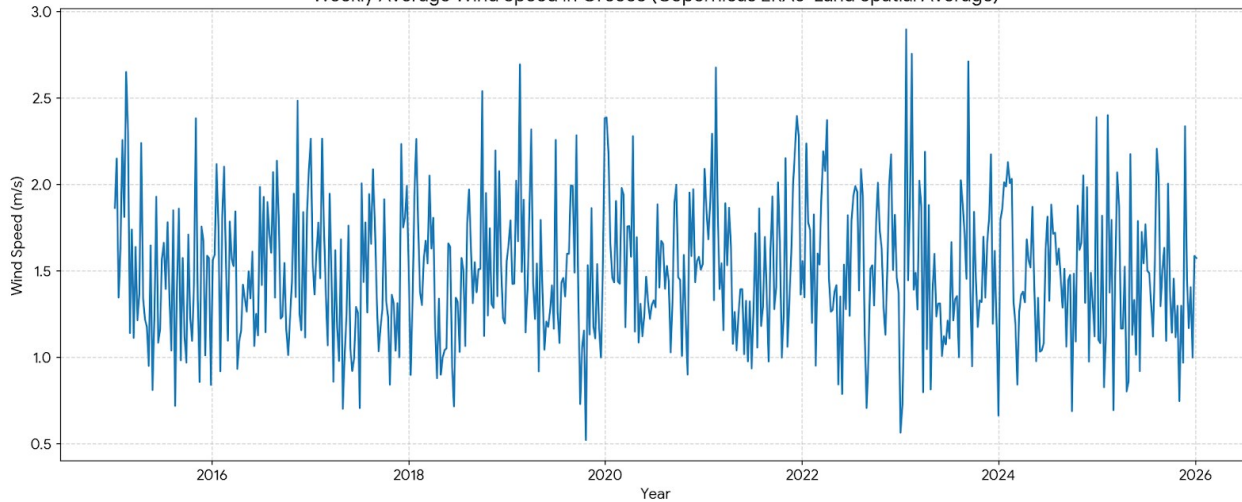
Solar Generation Capacity Factor - Weekly Average



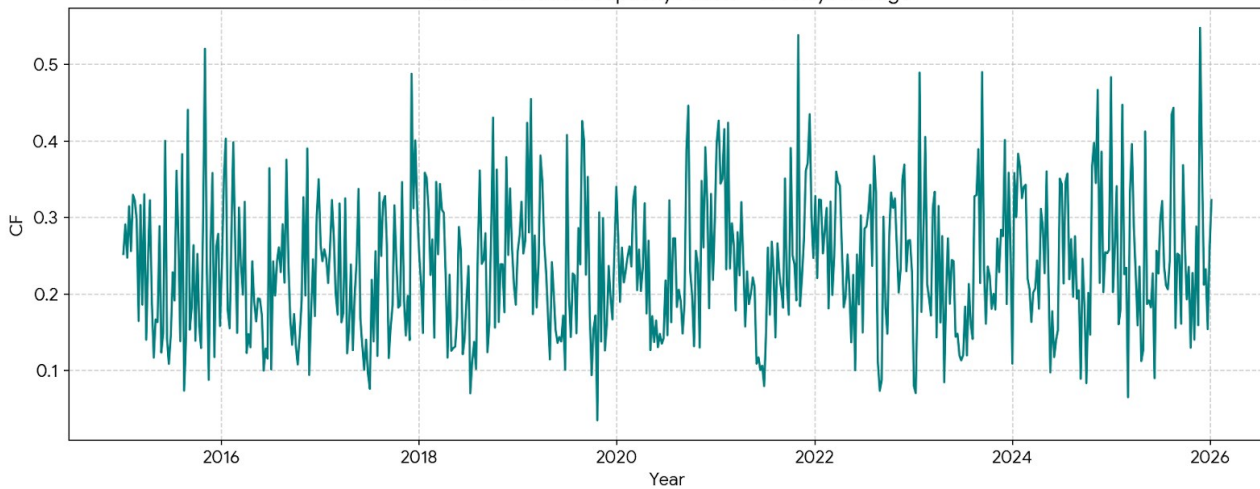
$$\text{Generation CF} = \frac{\text{Energy Production}}{\text{Installed Capacity}}$$

Correlation between Wind Speed and Wind Generation CF

Weekly Average Wind Speed in Greece (Copernicus ERA5-Land Spatial Average)

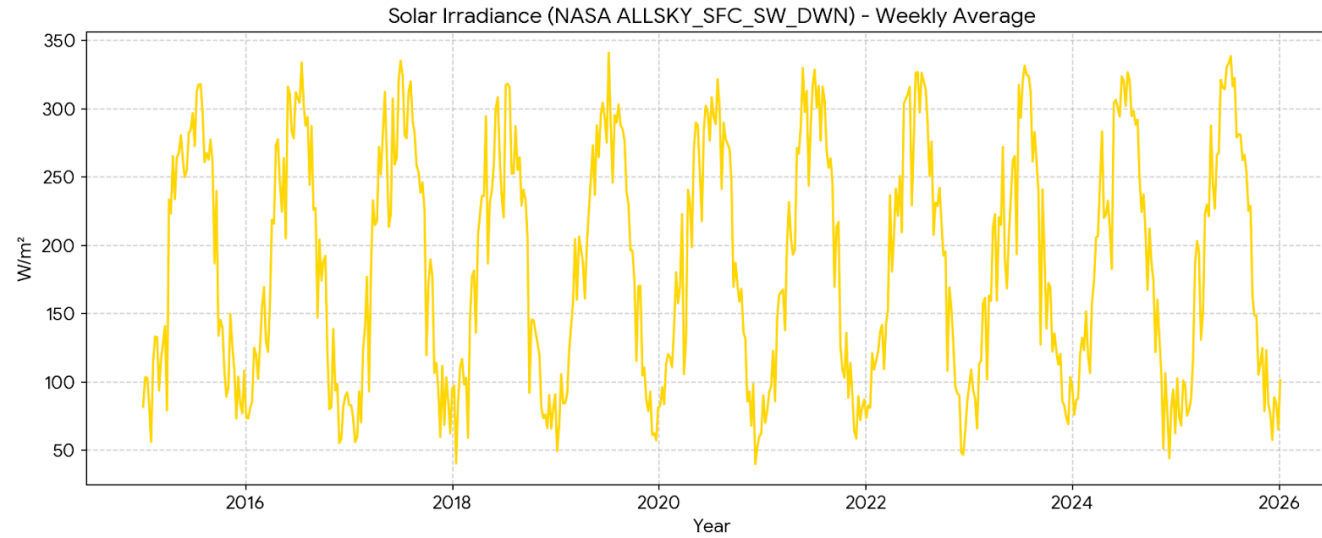


Wind Generation Capacity Factor - Weekly Average

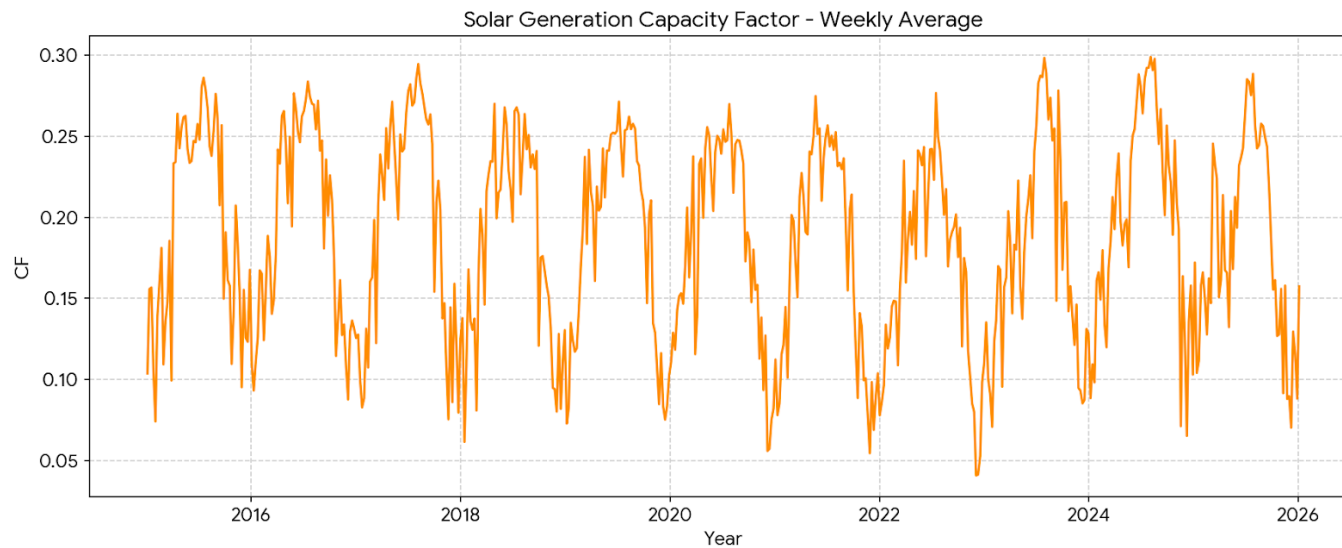


Correlation $r=0.74$

Correlation between Solar Irradiance and Solar Generation CF

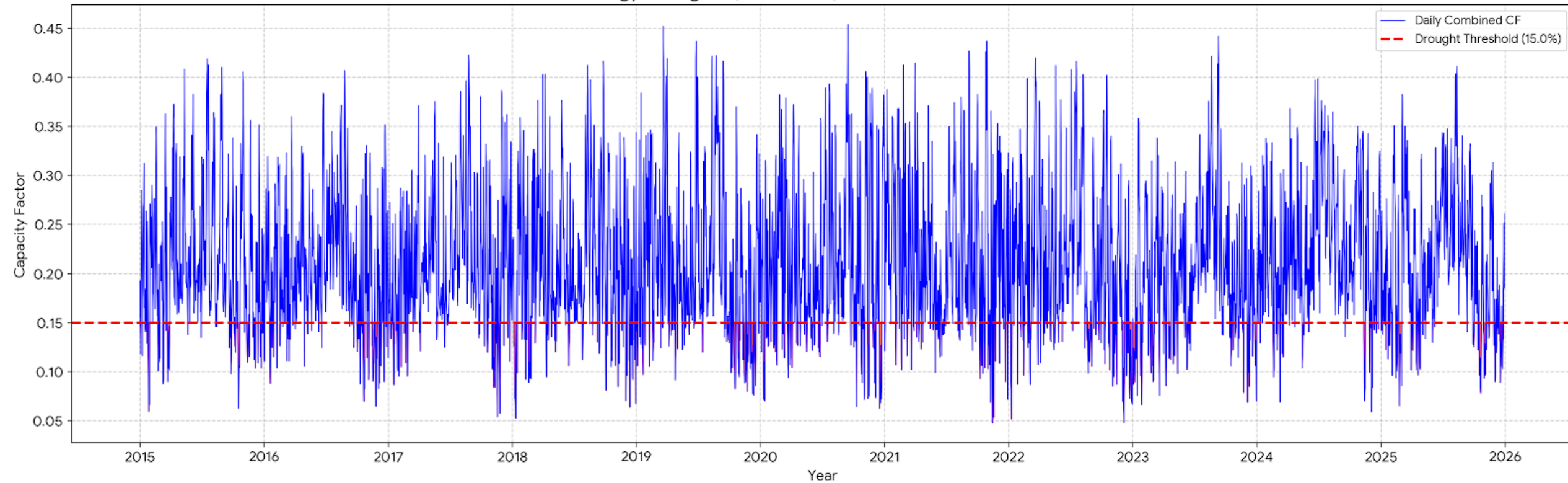


Correlation: $r=0.91$



Energy Droughts

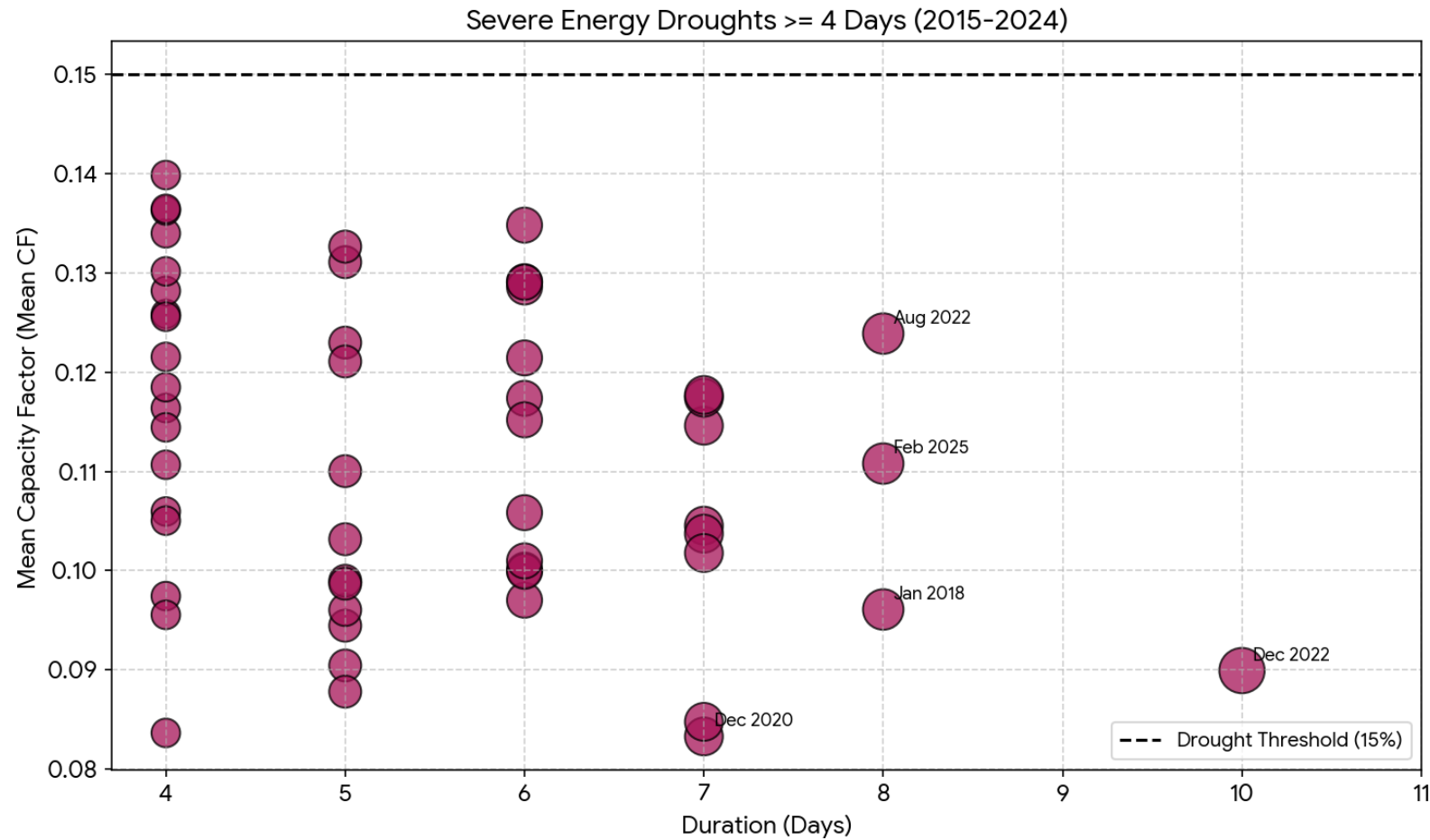
Energy Droughts (2015-2025) - Wind + Solar Combined



$$CF_{\text{combined}} = \frac{E_{\text{solar}} + E_{\text{wind}}}{C_{\text{solar}} + C_{\text{wind}}}$$

Drought Threshold: $CF_{\text{combined}} = 0.15$

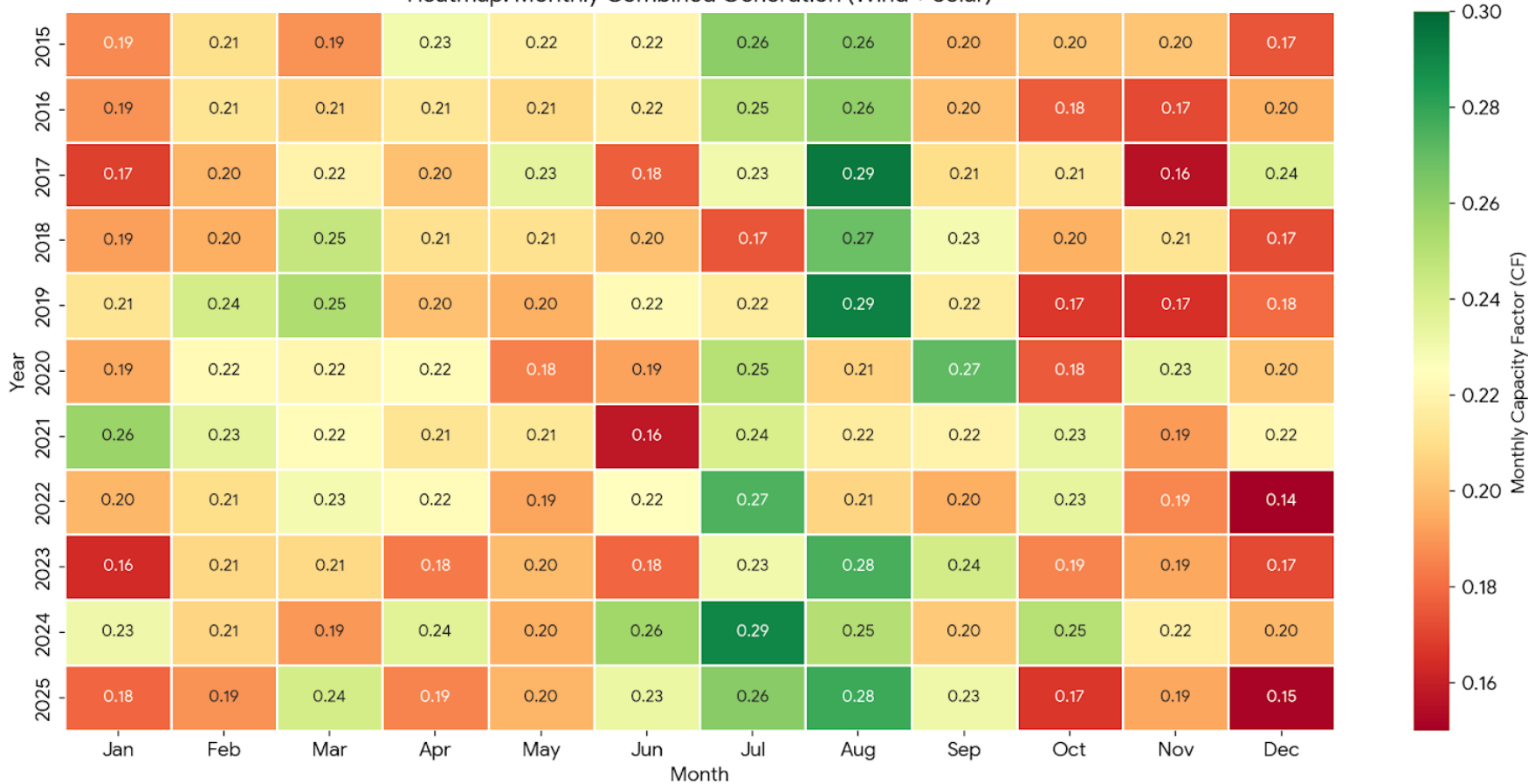
Energy Droughts



The longest energy drought occurred in December 2022 and lasted for 10 days, with a mean CF of 0.09.

Energy Droughts

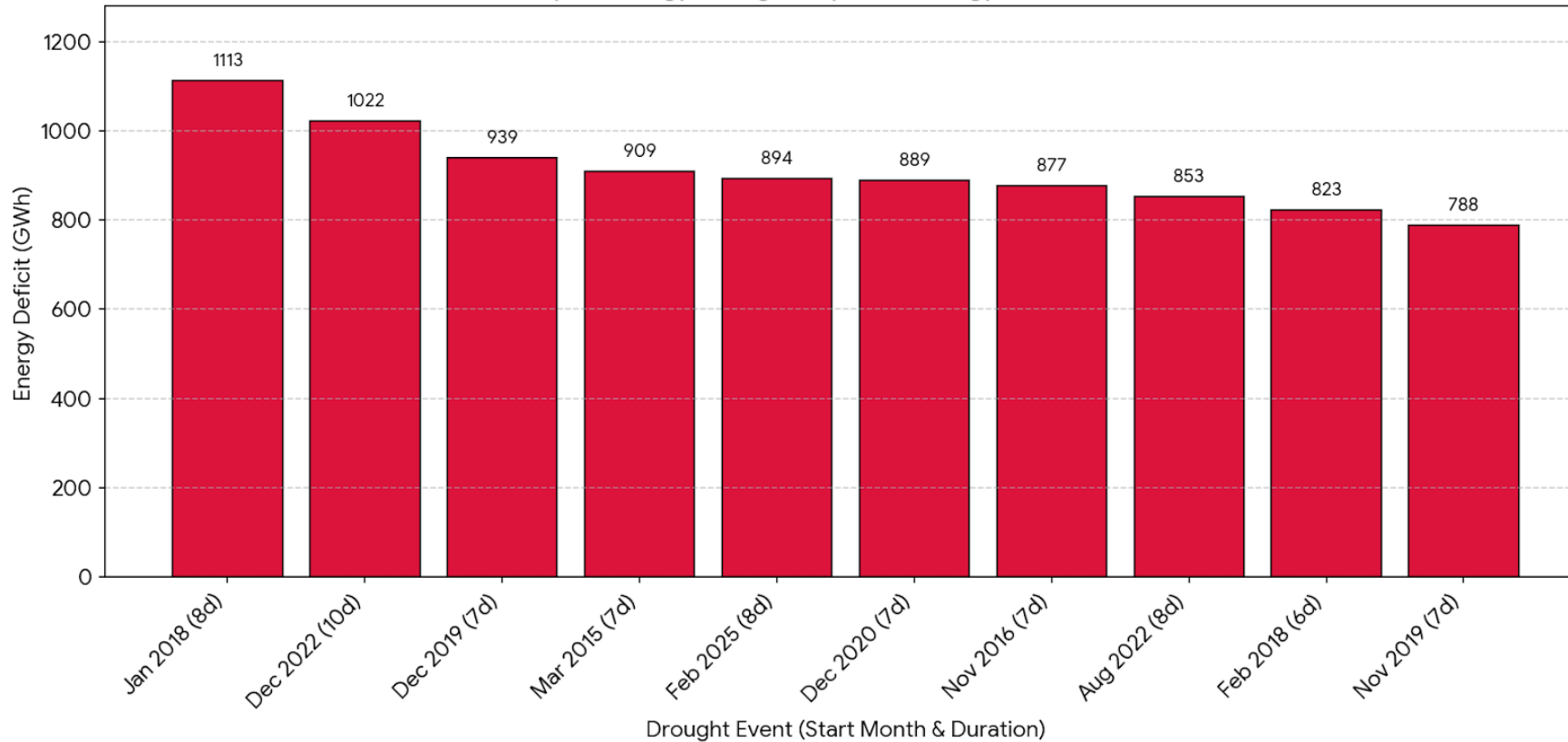
Heatmap: Monthly Combined Generation (Wind + Solar)



The most critical month regarding energy droughts appears to be December.

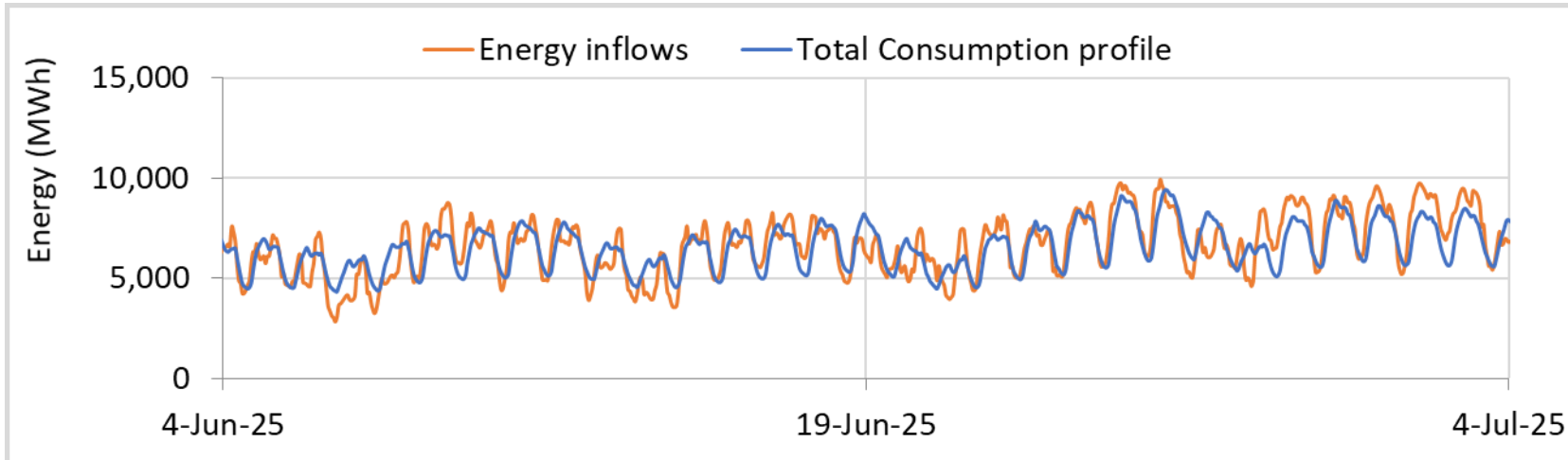
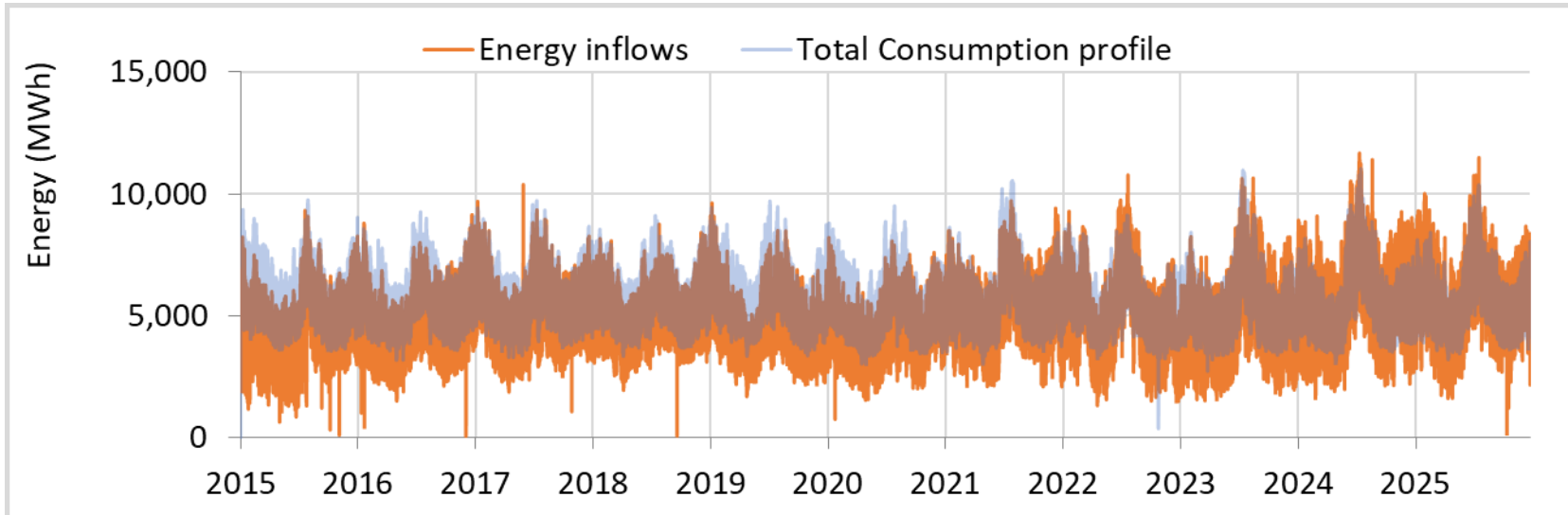
Energy Deficits

Top 10 Energy Droughts by Total Energy Deficit (GWh)



Incorporating the Energy Consumption Data, the 10 most critical Energy Droughts are being quantified, determining Storage Demand.

Profiles of Energy Consumption and Production (2015–2025)



- In 2025, with a storage capacity of ≈ 1 GWh, the energy demand was met $\approx 64\%$ of the time, meaning that $\approx 36\%$ of the time Greece had to import energy.
- The big view is that post-2025, energy production matched overall consumption.
- In 2025, the system lacks the capacity to store all the produced energy. The energy surplus amounts to 3.62 TWh.
- However, we can see that in a smaller scale, energy demand remains unmet during certain periods as it did not align with the timeline of energy needs.

Model for the Estimation of Storage Demand

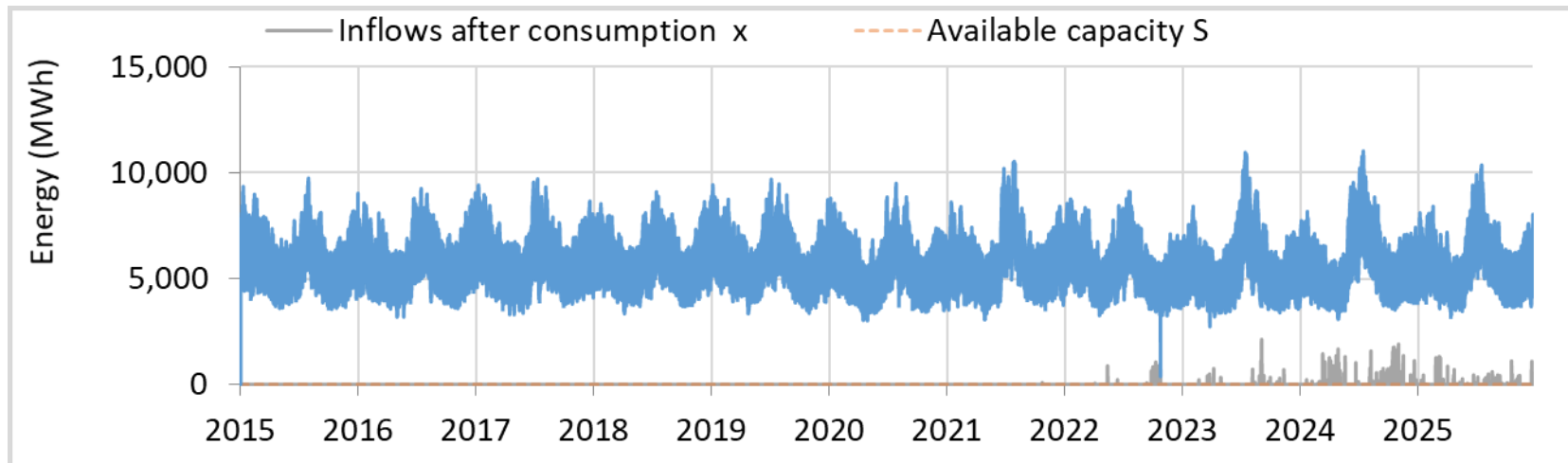
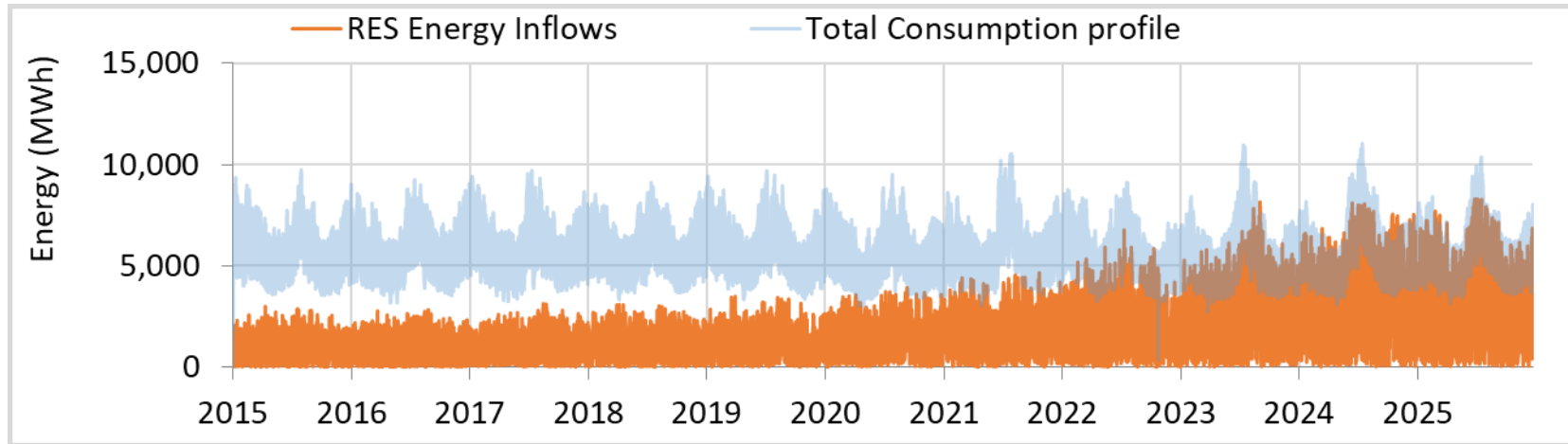
To describe the operation of the energy storage system, we employ a model described by the processes defined in Equations:

$$\underline{S}_T = \max(0, \min(\underline{S}_{T-1} + \underline{x}_T - \underline{\delta}_T, K))$$

$$\underline{R}_T = \min(\underline{S}_{T-1} + \underline{x}_T, \underline{\delta}_T)$$

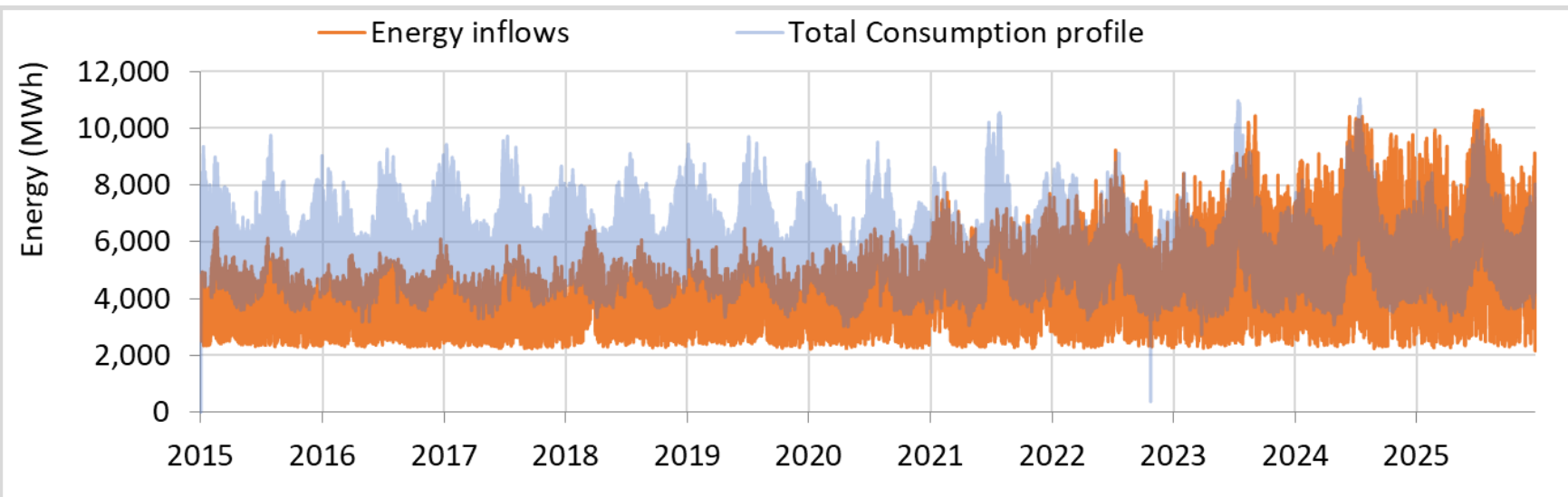
where T is time; K is the storage capacity of the system; S_T is the stock in the storage energy system; x_T is the inflow to the energy storage system after consumption; δ_T is the energy demand and R_T is the actual amount of taken energy in an attempt to satisfy energy demand during the time period ($t-1, t$). When the storage energy system has sufficient energy, R_T equals demand δ_T ; otherwise, $R_T < \delta_T$.

Toy model (1)– Only Renewable Energy Sources



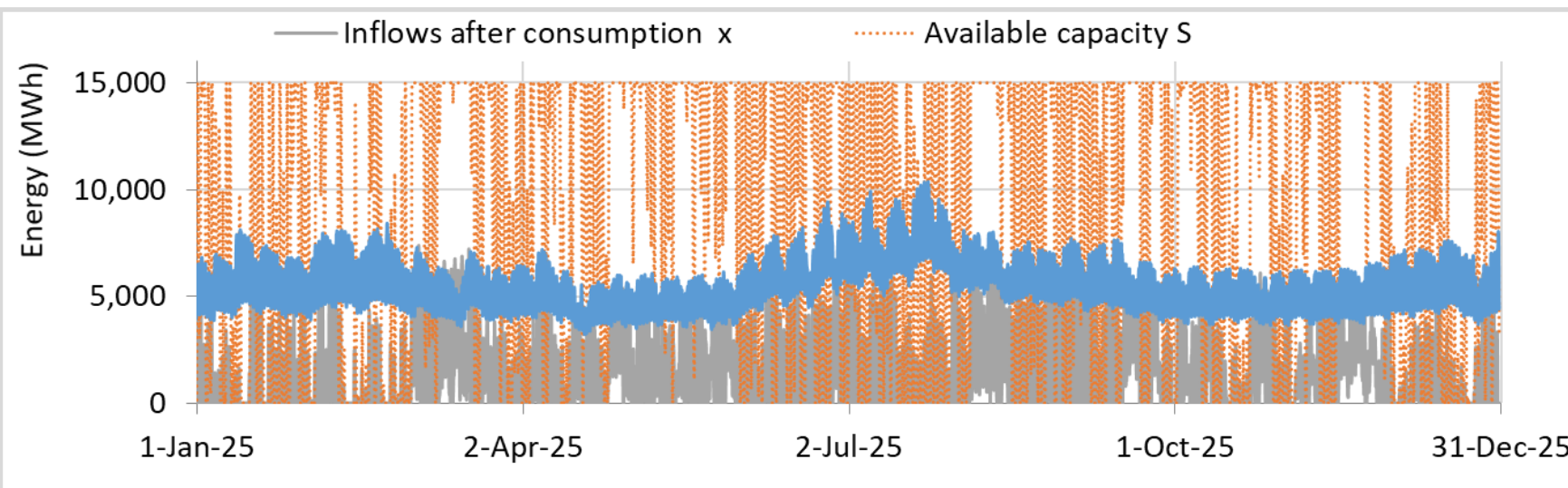
- **The big view is that post-2021 RES production began to reach the energy consumption profile.**
- **Excess energy is insufficient for storage, proving that adding storage capacity alone is not enough.**
- **Increased RES penetration is required to generate the necessary surplus for storage.**

Toy model (2)— System stability via domestic energy sources



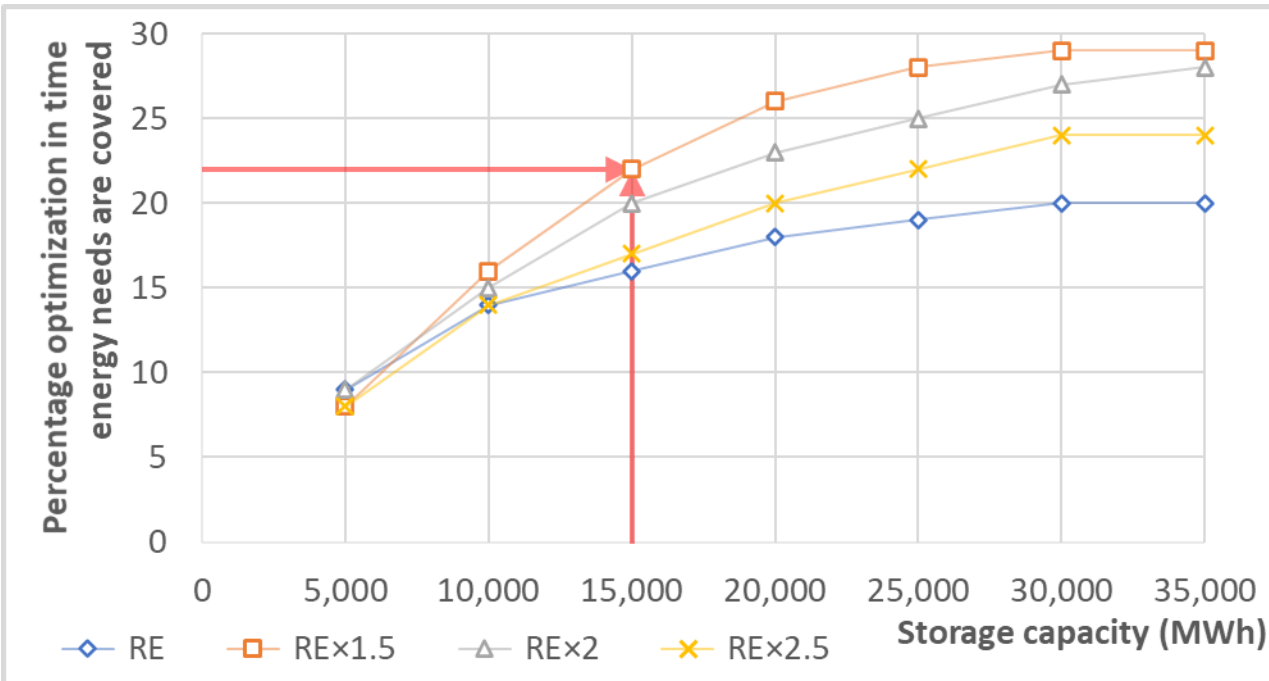
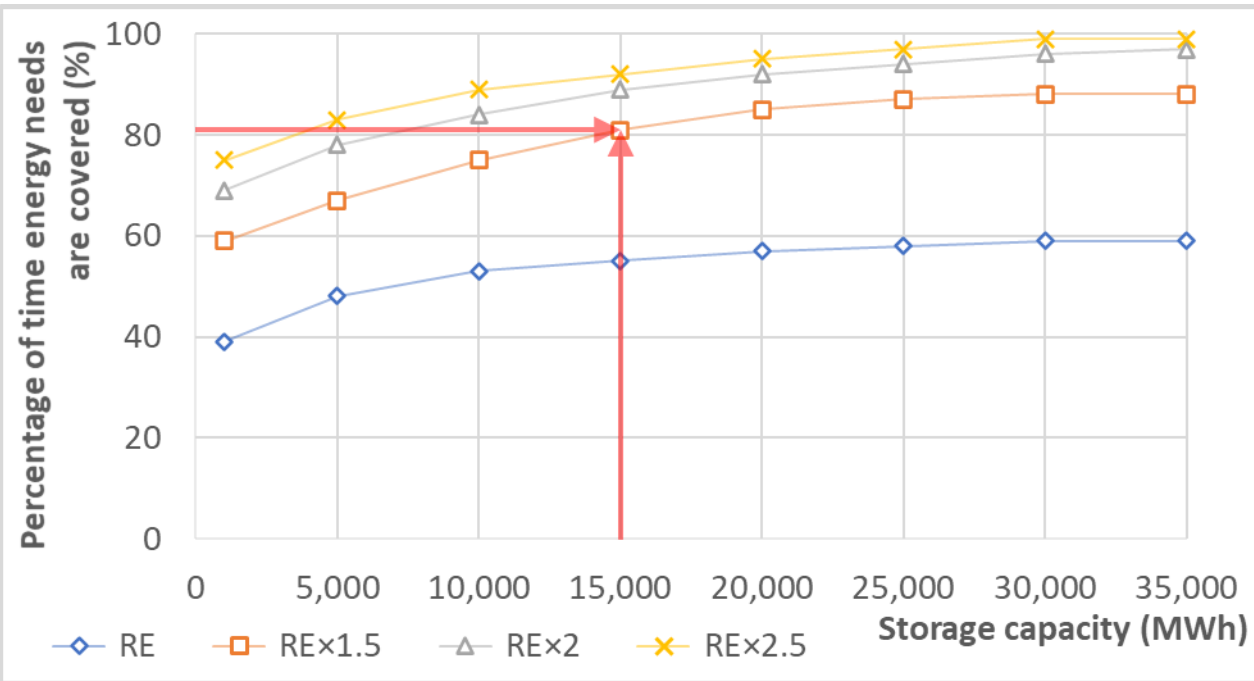
We are aiming at system stability and independence by optimizing domestic energy resources:

- hydroelectric power
- Lignite
- Renewables (wind +solar)



- In 2025, the energy demand would be covered 33% of the time if we relied solely on domestic energy sources
- A $\times 1.5$ increase in RES and installation of 15,000 GWh storage capacity results in $\approx 80\%$ system reliability.

Storage Demand – System Optimization



- Alternative scenarios explored for storage capacity and RES penetration.
- System reliability plateaus after 20 GWh of storage capacity.

- System reliability growth was analyzed across different RES and storage capacity scenarios.
- It is shown that a $\times 1.5$ increase in RES capacity provides the most significant boost to system reliability.

Conclusions

Regarding Energy Droughts:

- The Most critical month regarding energy droughts in Greece appears to be December.
- The Longest Energy Drought of the last decade in Greece lasted 10 days, in December 2022 with a Mean Capacity Factor = 0.09.
- The worst energy drought of the last decade occurred in January 2018, lasting 8 days and resulting in an energy deficit of approximately 1100 GWh.

Regarding Energy Storage:

- Post-2021 RES production began to reach the energy consumption profile. In 2025, the energy surplus amounts to 3.62 TWh. However, since it did not align with the timeline of the needs, it was either exported or discarded.
- Expanding storage capacity alone is insufficient without a corresponding increase in RES generation to provide the necessary surplus.
- System Reliability Analysis & Scenarios with domestic sources
 - a) Current Infrastructure Performance
 - Lignite, Hydro, RES: 40% reliability.
 - RES-only (Current Levels): Only 5% reliability.
 - Conventional-only (Lignite & Hydro): 0% reliability (insufficient capacity).
 - b) Future Scenarios
 - ×1.5 RES + Hydro + 15 GWh Storage: ≈ 42% reliability.
 - ×1.5 RES + Lignite + Hydro + 15 GWh Storage: ≈ 80% reliability.

References (1)

- Arvanitidis, I. and Sargentis, G.-F.: Spatial Indicators of Dynamic Self-Sufficiency and Resilience in the Water–Energy–Food Nexus. Case study: Small Rural Village in North Euboea, Greece, EGU General Assembly 2026, Vienna, Austria, 3–8 May 2026, EGU26-14761, <https://doi.org/10.5194/egusphere-egu26-14761>, 2026.
- Bozanas, I. F., Sargentis, G.-F., and Iliopoulou, T.: European snow dynamics and changing patterns under climate variability, EGU General Assembly 2026, Vienna, Austria, 3–8 May 2026, EGU26-10737, <https://doi.org/10.5194/egusphere-egu26-10737>, 2026.
- Iliopoulou, T.; Dimitriadis, P.; Siganou, A.; Markantonis, D.; Moraiti, K.; Nikolinakou, M.; Meletopoulos, I.T.; Mamassis, N.; Koutsoyiannis, D.; Sargentis, G.-F. Modern Use of Traditional Rainwater Harvesting Practices: An Assessment of Cisterns' Water Supply Potential in West Mani, Greece. *Heritage* 2022, 5, 2944-2954 <https://doi.org/10.3390/heritage5040152>.
- Kopelia, S., Tepetidis, N., Tzortzi, J. N., Sargentis, G.-F., and Ioannidis, R.: Integrating Participatory Perception-Mapping Data and Stochastic Image Analysis for Urban Landscape Assessment, EGU General Assembly 2026, Vienna, Austria, 3–8 May 2026, EGU26-13270, <https://doi.org/10.5194/egusphere-egu26-13270>, 2026.
- Koutsoyiannis D. Reliability concepts in reservoir design. *Water Encycl.* 2005; 3: 259-265
- Maravelakis, M., Iliopoulou, T., and Sargentis, G.-F.: The Water-Energy-Food Nexus in Naxos Island: Enhancing Self-Sufficiency Through Traditional Techniques, EGU General Assembly 2026, Vienna, Austria, 3–8 May 2026, EGU26-12878, <https://doi.org/10.5194/egusphere-egu26-12878>, 2026.
- Markantonis, D.; Sargentis, G.-F.; Dimitriadis, P.; Iliopoulou, T.; Siganou, A.; Moraiti, K.; Nikolinakou, M.; Meletopoulos, I.T.; Mamassis, N.; Koutsoyiannis, D. Stochastic Evaluation of the Investment Risk by the Scale of Water Infrastructures—Case Study: The Municipality of West Mani (Greece). *World* 2023, 4, 1-20. <https://doi.org/10.3390/world4010001>

References (2)

- Sargentis, G.-F.; Siamparina, P.; Sakki, G.-K.; Efstratiadis, A.; Chiotinis, M.; Koutsoyiannis, D. Agricultural Land or Photovoltaic Parks? The Water–Energy–Food Nexus and Land Development Perspectives in the Thessaly Plain, Greece. *Sustainability* 2021, 13, 8935. <https://doi.org/10.3390/su13168935>
- Sargentis G.-F. Entropy and War, Toy Models. *Recent Prog Sci Eng* 2025; 1(2): 007; doi:10.21926/rpse.2502007.
- Sargentis, G.-F.; Defteraios, P.; Lagaros, N.D.; Mamassis, N. Values and Costs in History: A Case Study on Estimating the Cost of Hadrianic Aqueduct’s Construction. *World* 2022, 3, 260-286. <https://doi.org/10.3390/world3020014>
- Sargentis, G.-F. Issues of Prosperity: Stochastic Evaluation of Data Related to Environment, Infrastructures, Economy and Society. Ph.D. Thesis, National Technical University of Athens, School of Civil Engineering, Athens, Greece, 2022. <https://doi.org/10.5281/zenodo.6785733>
- Sargentis G.-F., Baroudi S, Angelidis M.-A., Arvanitidis I, Mamassis N, Ioannidis R. Restoring the Resilience of Water-Energy-Food Nexus Based on Desalination through Biomass Management: Case Study West Mani, Greece. *Adv Environ Eng Res* 2026; 7(1): 005; <http://dx.doi.org/10.21926/aeer.2601005>.
- Sargentis G.-F.; Arvanitidis I.; Angelidis M.-A. Geospatial Analysis of Energy Requirements for Supplying Desalinated Seawater to the Greek Territory. *Clean Energy and Sustainability* 2026, 4, 10001. <https://doi.org/10.70322/ces.2026.10001>
- Sargentis, G.-F.; Koutsoyiannis, D. The Function of Money in Water–Energy–Food and Land Nexus. *Land* 2023, 12, 669. <https://doi.org/10.3390/land12030669>

References (3)

- Sargentis, G.-F.; Lagaros, N.D.; Cascella, G.L.; Koutsoyiannis, D. Threats in Water–Energy–Food–Land Nexus by the 2022 Military and Economic Conflict. *Land* 2022, 11, 1569. <https://doi.org/10.3390/land11091569>
- Sargentis, G.-F.; Koutsoyiannis, D.; Angelakis, A.; Christy, J.; Tsonis, A.A. Environmental Determinism vs. Social Dynamics: Prehistorical and Historical Examples. *World* 2022, 3, 357-388. <https://doi.org/10.3390/world3020020>
- Sargentis, G.-F.; Palamarczuk, E.; Iliopoulou, T. Swimming Pools in Water Scarce Regions: A Real or Exaggerated Water Problem? Case Studies from Southern Greece. *Water* 2025, 17, 2934. <https://doi.org/10.3390/w17202934>
- Sargentis G.-F.; Papadodimas N.; Benekos I.; Katsoulakos N.M.; Dimitriadis P.; Tepetidis N.; Ioannidis R.; Arvanitidis I.; Angelidis M.-A.; Saperopoulou D.; Laoutaris G.-D.; Maravelakis M.; Amiralis O.-I.; Markantonis D.; Alexandridou A.; Mamassis N.; Koutsoyiannis D. Stochastic Assessment of Renewable Energy Reliability: A Case Study of North Euboea, Greece. *Journal of Energy and Power Technology* 2026; 8(2): 008; <http://dx.doi.org/10.21926/jept.2602008>.
- Sargentis G.-F.; Arvanitidis I.; Angelidis M.-A. Geospatial Analysis of Energy Requirements for Supplying Desalinated Seawater to the Greek Territory. *Clean Energy and Sustainability* 2026, 4, 10001. <https://doi.org/10.70322/ces.2026.10001>
- Sargentis, G.-F. Fragility in Human Progress. A Perspective on Governance, Technology and Societal Resilience *Front. Complex Systems* 2025. <https://doi.10.3389/fcpxs.2025.1609467>