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**FFF online event: The role of energy storage in power sectors  
with fossil fuel phase-out**

## **How time-series reduction impacts storage modelling**

**Leonard Göke, Mario Kendzioriski**

# Introduction

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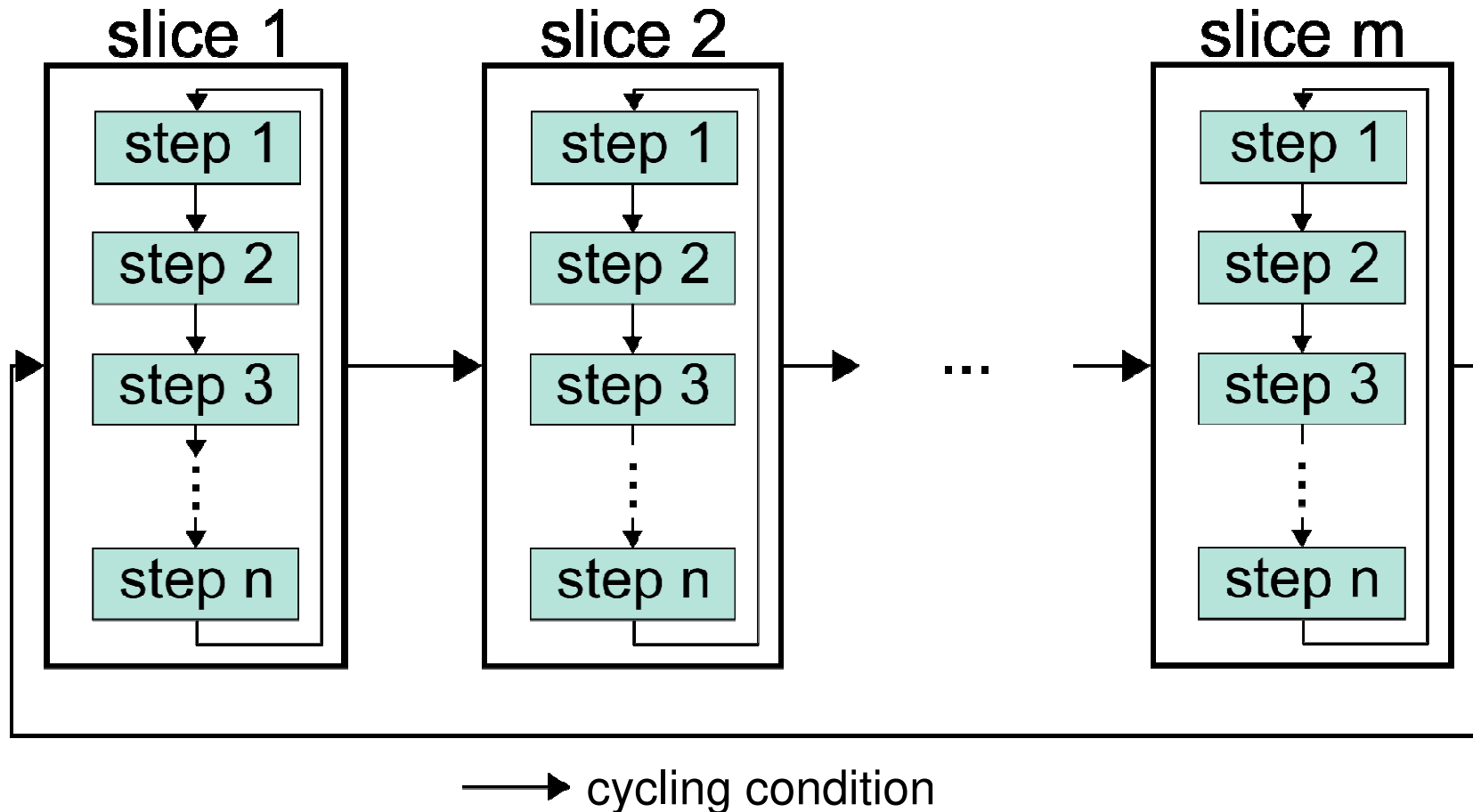
## Background

- Reducing the input-series to a small number is a common strategy to reduce the complexity of energy system models
- Methods for time-series reduction (TSR) were originally developed and tested for energy systems characterized by fossil fuels

## Research Question

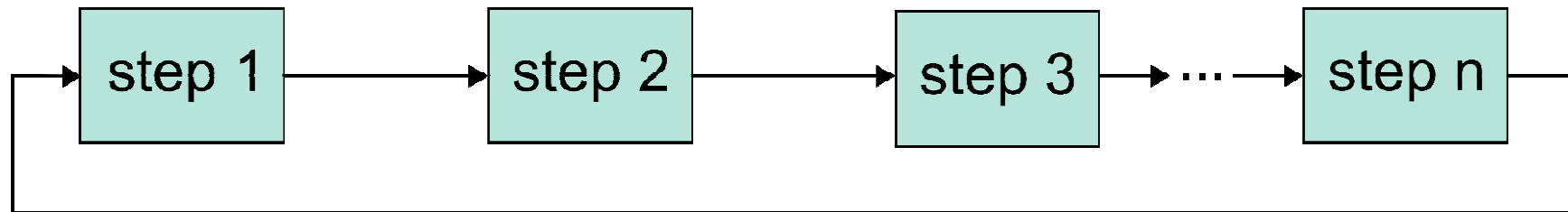
- How well is TSR suited to be used in the context of renewable energy systems characterized by fluctuating generation and storage?

# Discontinuous time-slices to implement reduced time-series



- Allows for weighting of time-slices
- Implementation of cycling conditions from Kotzur 2018 used

# Continuous time-steps to implement reduced time-series



- No weights!
- Two ways to aggregate reduced time-series to steps
  1. Scale-up variables that relate to the entire year →  $\alpha$
  2. Scale-up parameters that relate to single time-steps →  $\beta$

$$\min \text{FixCosts} + \text{VarCosts} \cdot \alpha$$

$$\text{s.t. } \sum \text{Gen} + \sum \text{StOut} = \text{dem} \cdot \beta + \sum \text{StIn}$$

$$\text{Emissions} \cdot \alpha \leq \text{emissionLimit}$$

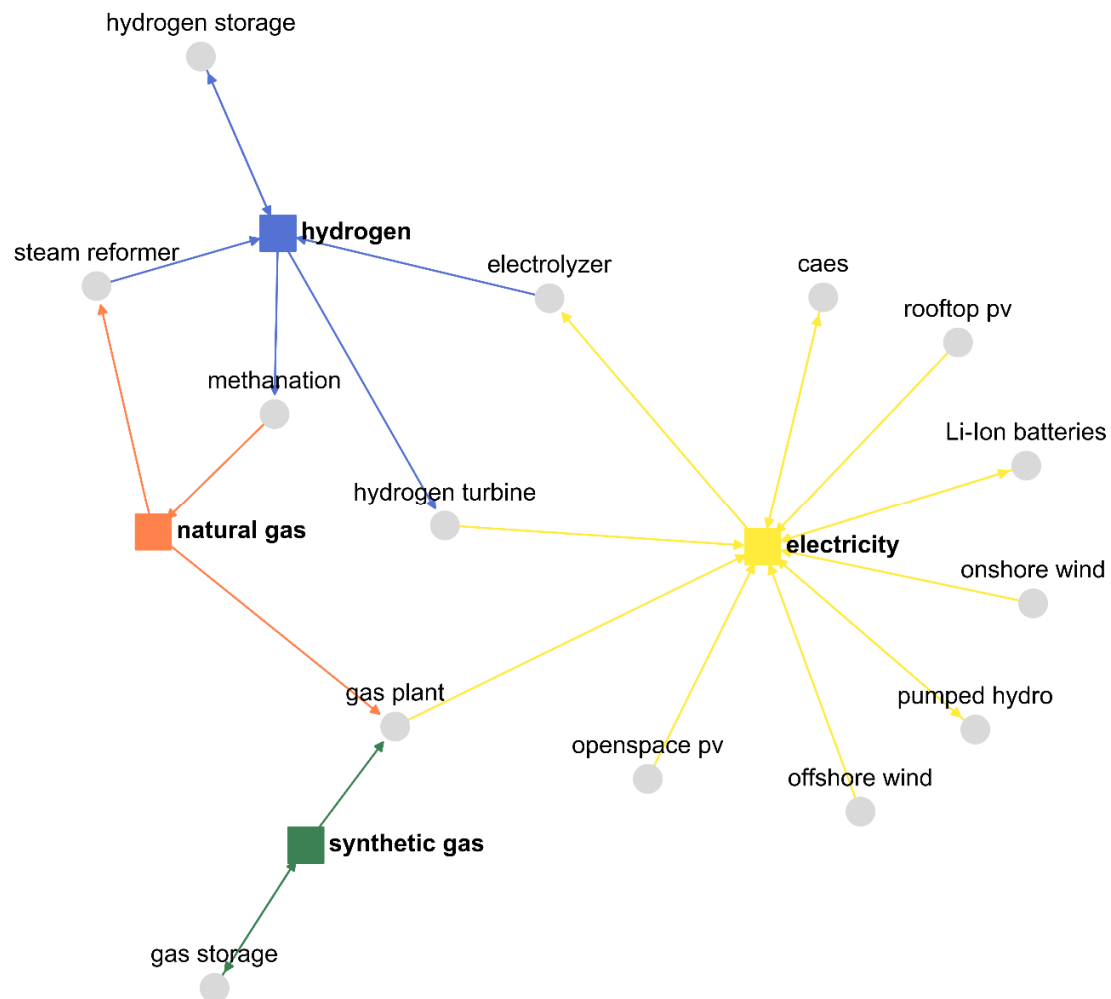
*etc.*

# Methods to reduce time-series

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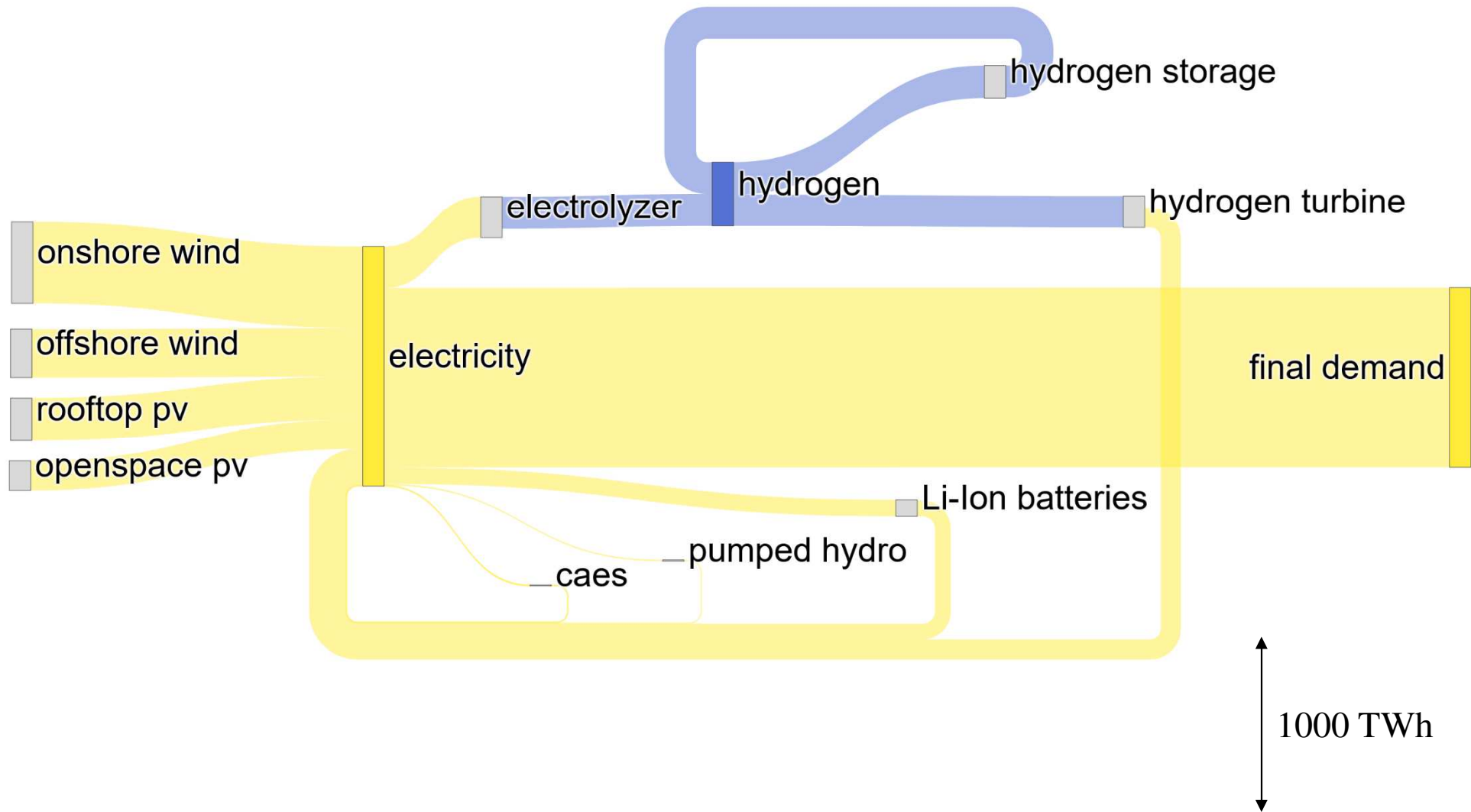
		Slices	Steps
<b>k-Means</b>	centroid	X	
	medoid	X	
<b>hierarchical</b>	centroid	X	
	medoid	X	
<b>Poncelet</b>	10 bins	X	X
	20 bins	X	X
	30 bins	X	X
<b>Gerbaulet</b>			X
<b>Re-Sampling</b>			X

# Overview of test model



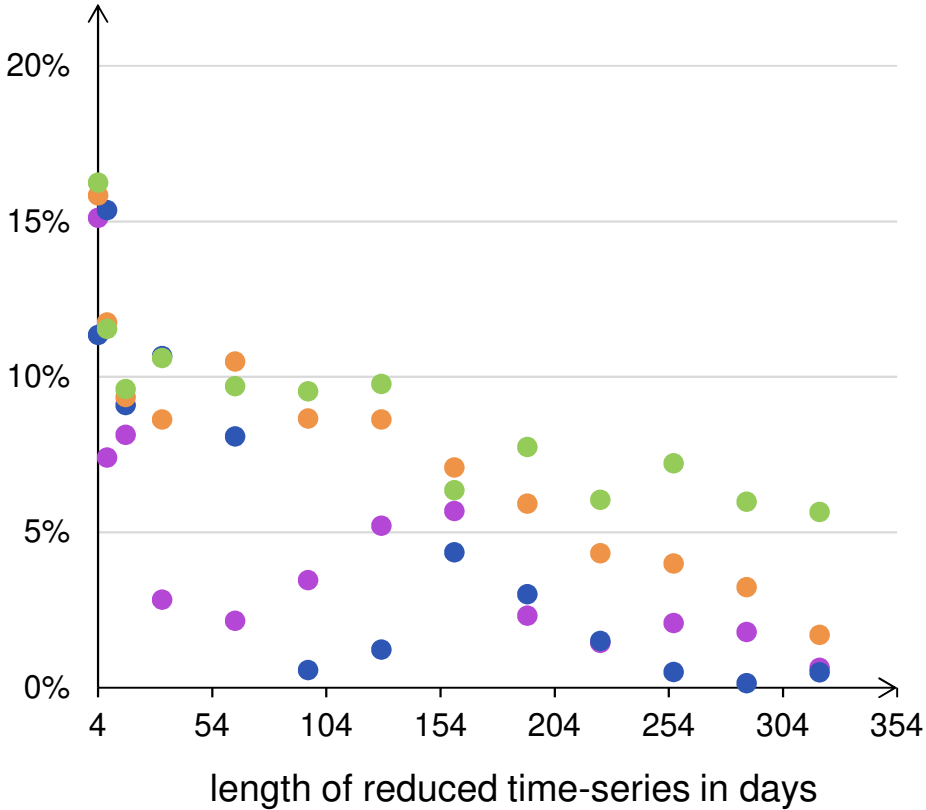
- Capacity expansion model for a single year
- Germany modelled as a single node
- Green field approach
- Electricity demand is based on Hainsch (2020) and accounts for sector integration
  - 956 TWh of total demand
  - More pronounced seasonal fluctuations
- Already includes load shedding as a peak-load measure

# Test model solved at full temporal resolution

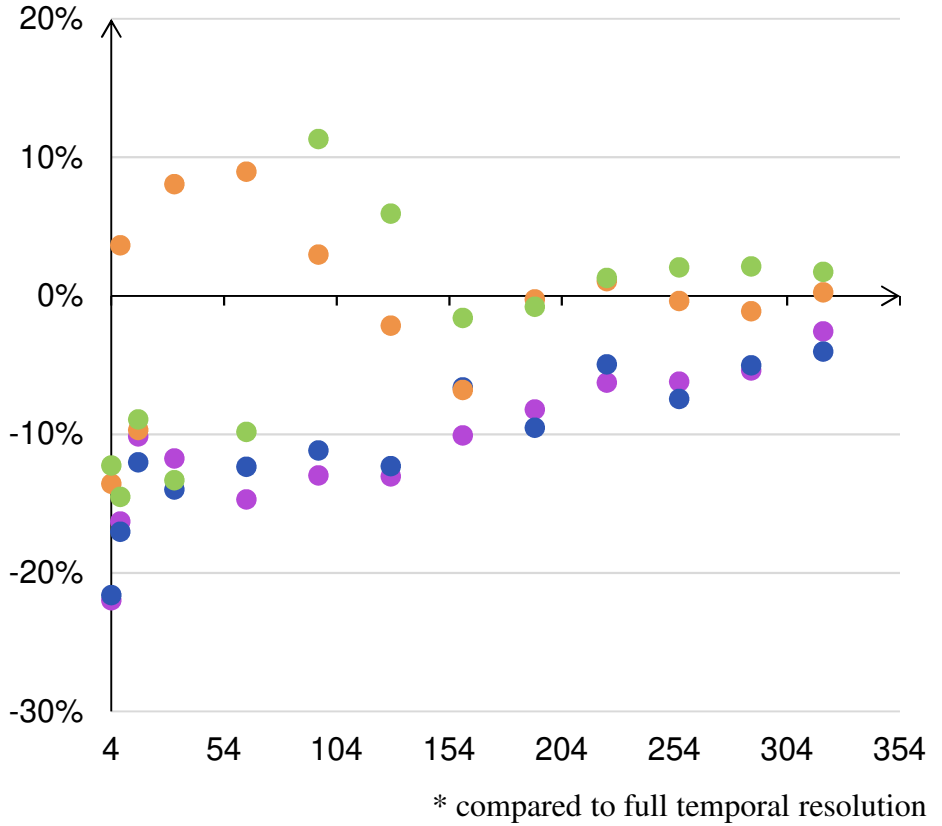


# General results for time-slices

## Lost load



## System costs\*



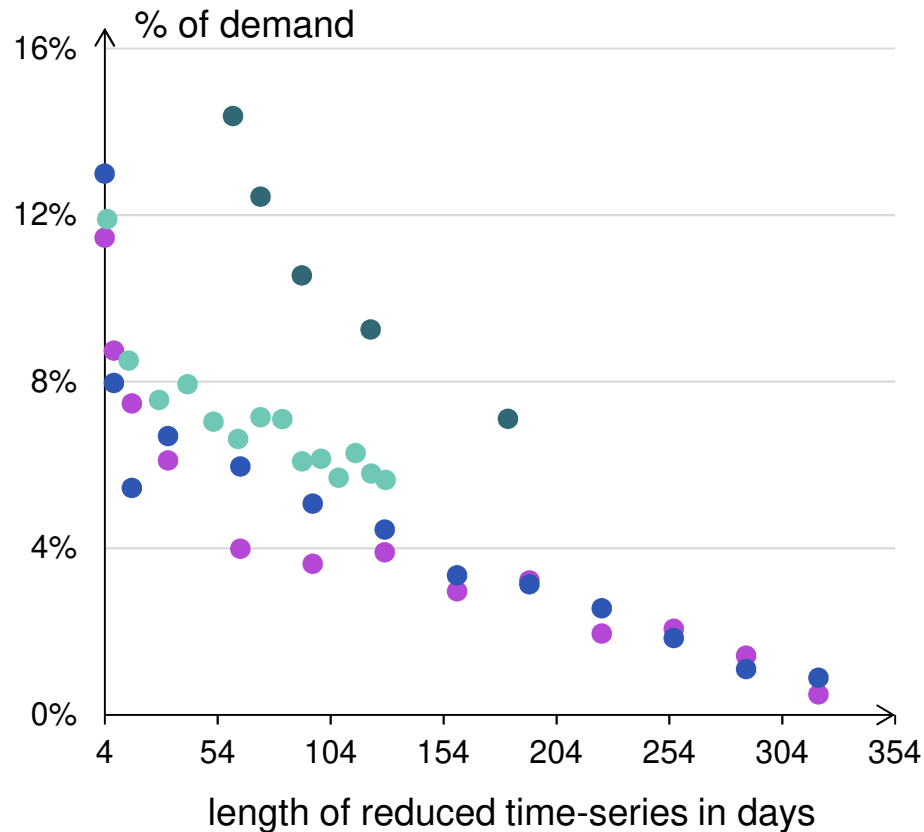
\* compared to full temporal resolution

● Poncelet with 10 bins    ● Poncelet with 20 bins    ● hierarchical clustering    ● k-means clustering

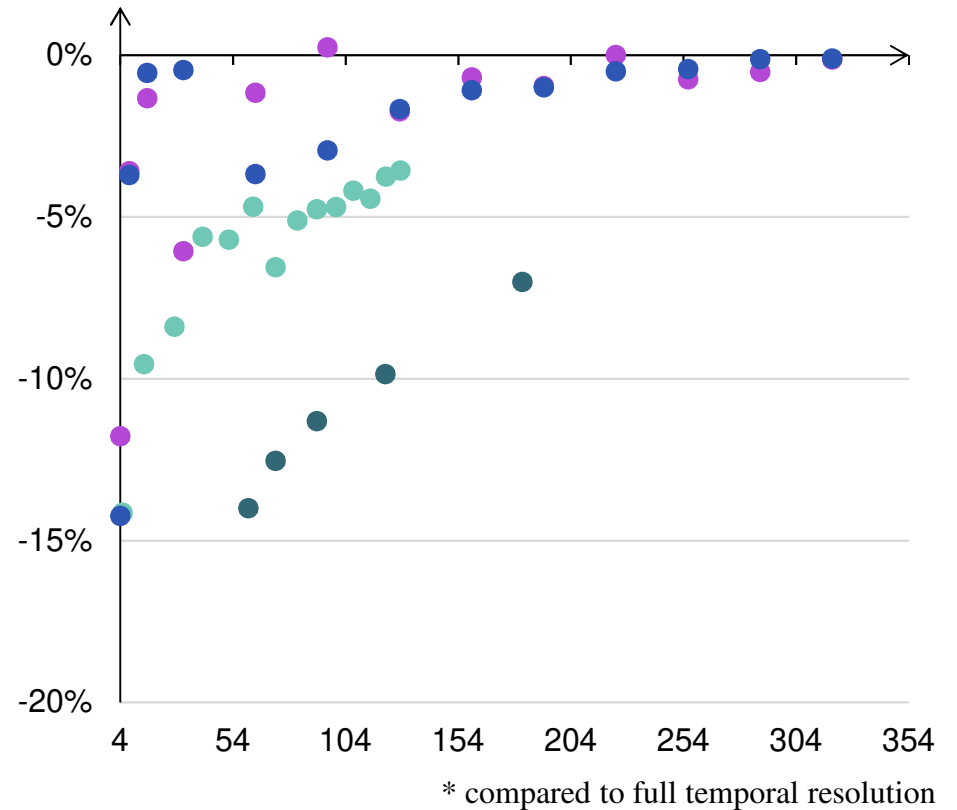


# General results for time-steps with $\alpha$ -scaling

## Lost load



## System costs\*



● Poncelet with 10 bins

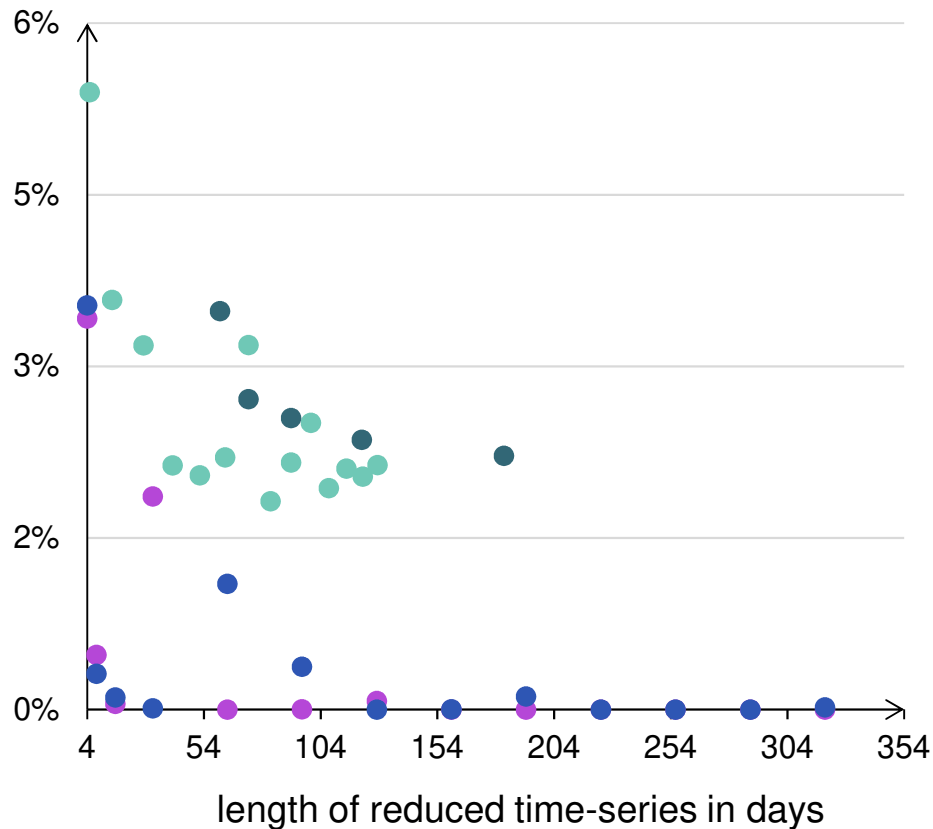
● Poncelet with 20 bins

● Gerbaulet

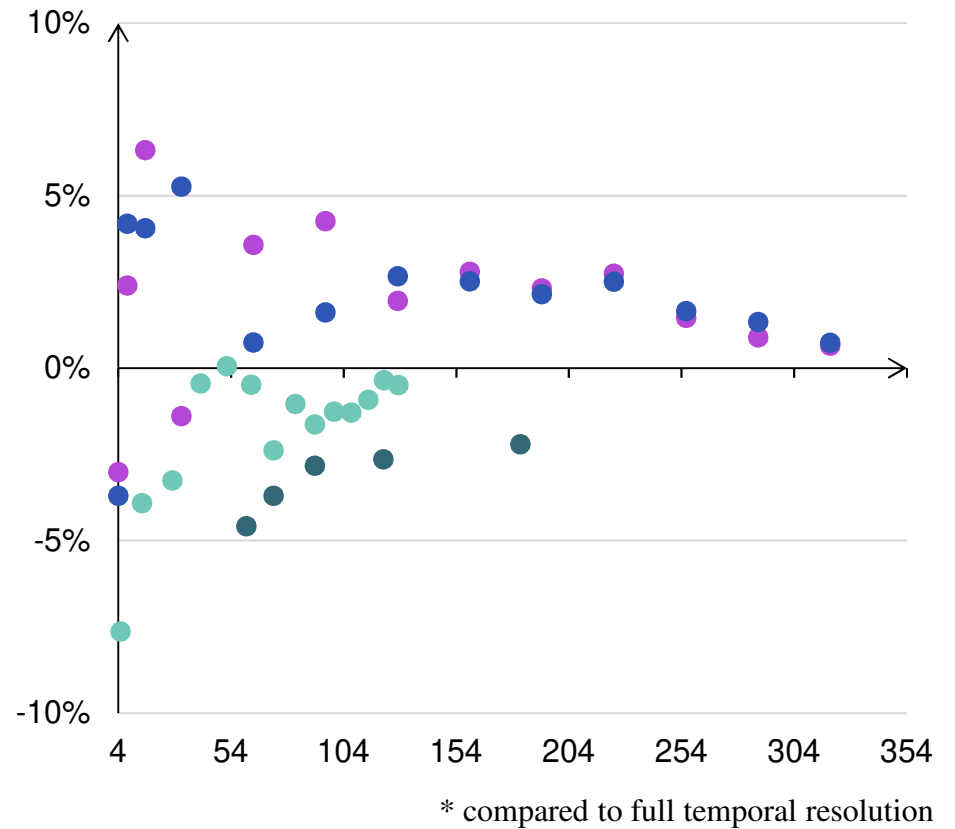
● Re-Sampling

# General results for time-steps with $\beta$ -scaling

## Lost load



## System costs\*



\* compared to full temporal resolution

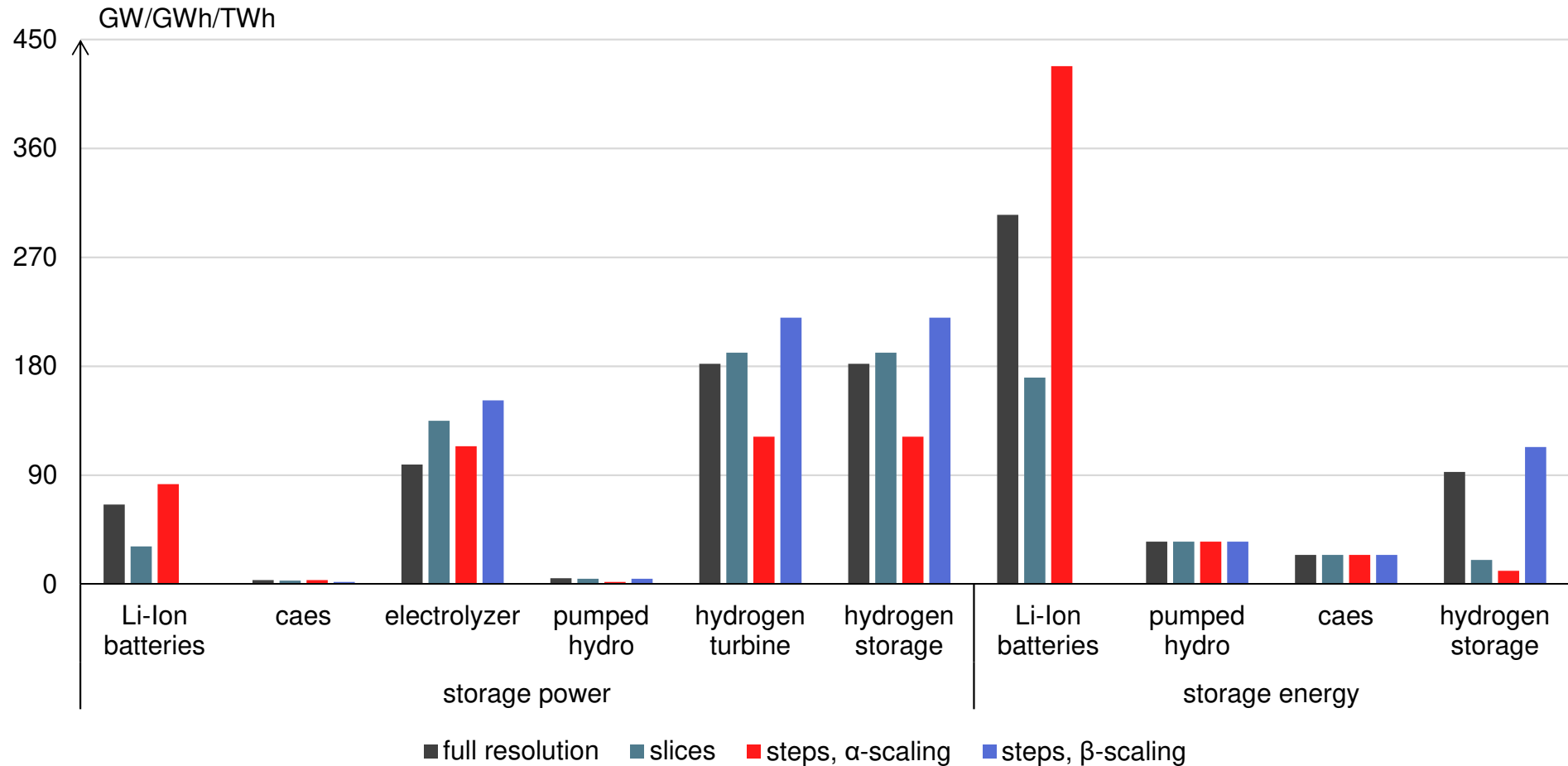
● Poncelet with 10 bins

● Poncelet with 20 bins

● Gerbaulet

● Re-Sampling

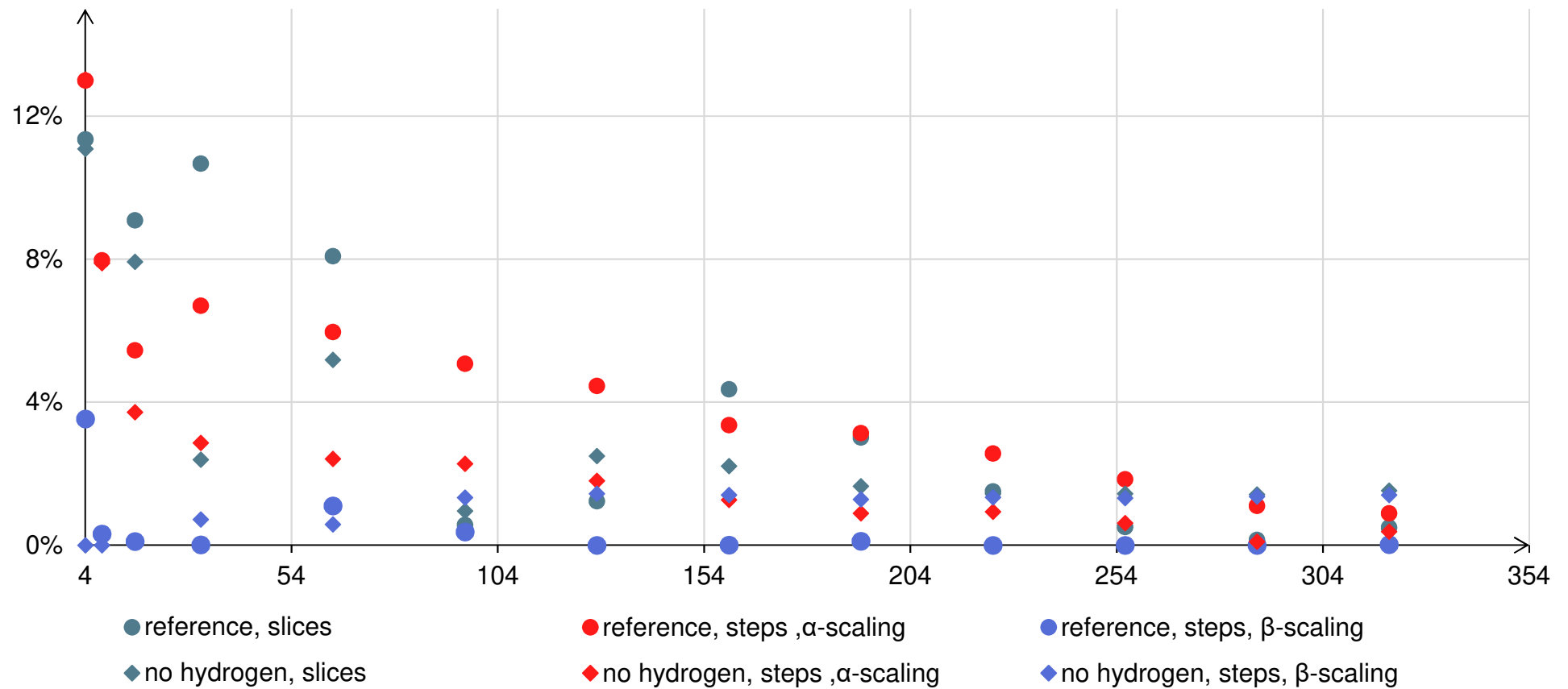
# Comparison of storage investment



- All results were obtained with 20 bins Poncelet and 64 days & 1536 hours
- Results show clear show different storage bias from  $\alpha$  and  $\beta$ -scaling

# Sensitivity without long-term storage

## Lost load



# Conclusion

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## Conclusion

- Fluctuating nature of supply and necessity for seasonal storage distort results obtained using TSR
- How reduced time-series are implemented has much more significant effect than how they were obtained

## Outlook

- TSR methods should be chosen and used with great care when modelling fully renewable energy systems
- Bias from TSR suggests similar effects from only considering a single weather year

# References

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- Göke, L. (2020):** AnyMOD – A graph-based framework for energy system modelling with high levels of renewables and sector integration. Working paper.
- Kotzur, L., Markewitz, P., Robinius, M., Stolten, D. (2018):** Time series aggregation for energy system design: Modeling seasonal storage. *Applied Energy*, 213:123–135.
- Teichgräber, H., Brandt, A.R. (2019):** Clustering methods to find representative periods for the optimization of energy systems: An initial framework and comparison, 239:1283-1293.
- Poncelet, K., Delarue, E., Six, D., Duerinck, J., D'haeseleer, W. (2016):** Impact of the level of temporal and operational detail in energy-system planning models. *Applied Energy*, 162:631-643.
- Poncelet, K., Höschle, H., Delarue, E., Virag, A., D'haeseleer, W. (2016):** Selecting representative days for capturing the implications of integrating intermittent renewables in generation expansion planning problems. *IEEE Transactions on Power Systems*, 32(3):1936-1948.