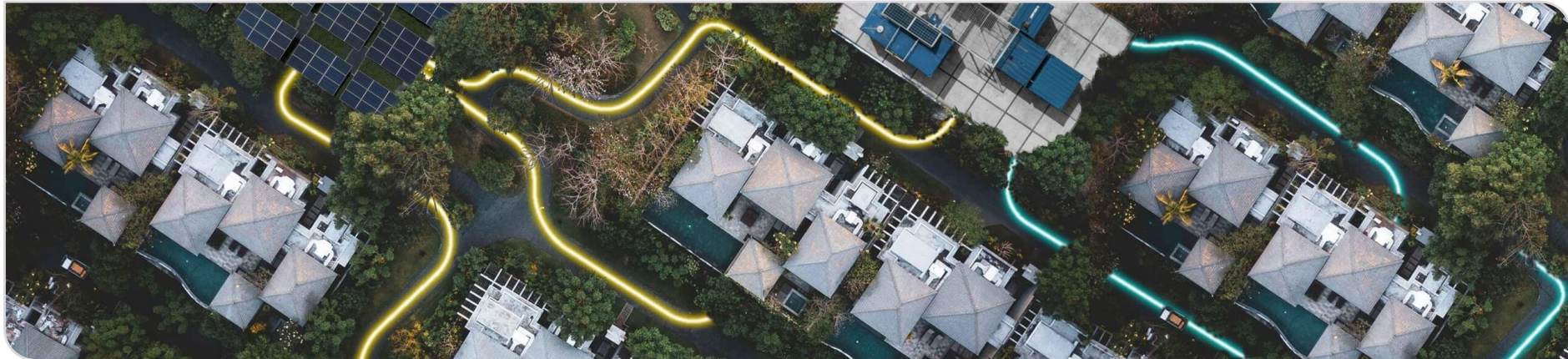
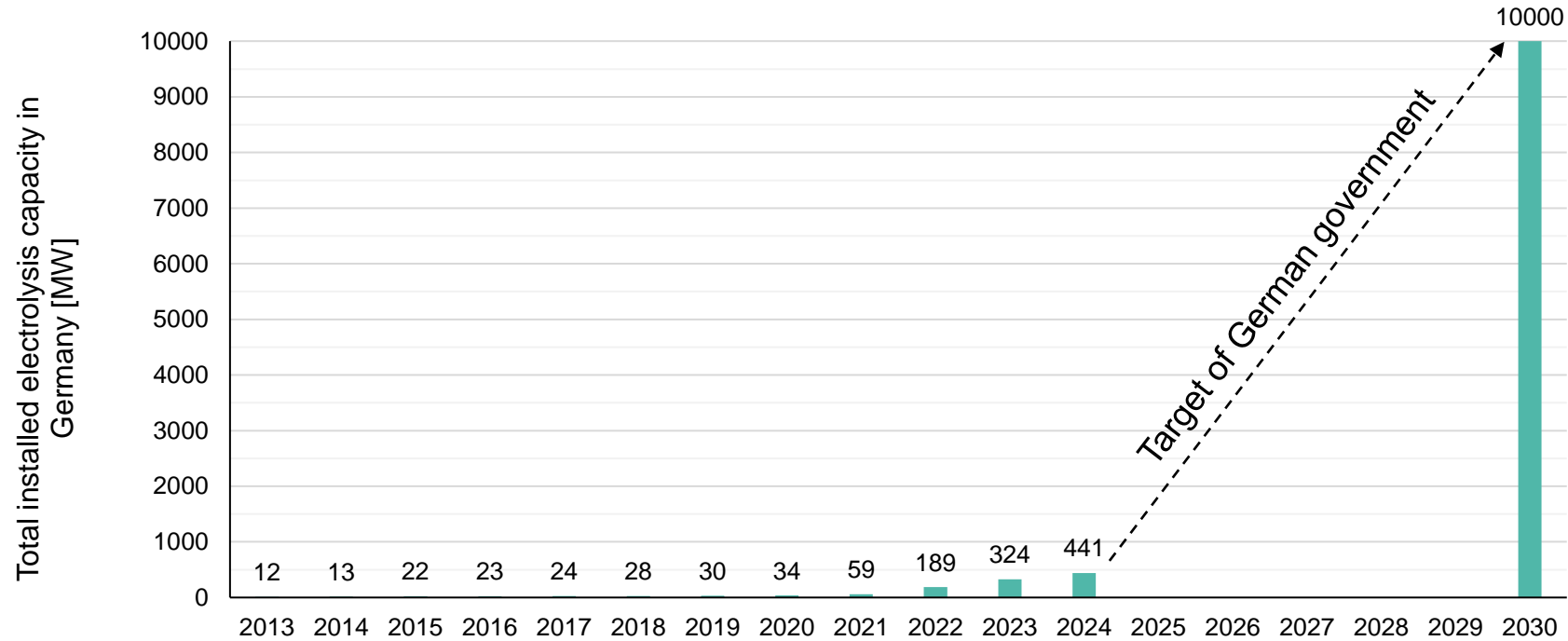


# Optimal Design and Operation of Community Hydrogen Generation and Storage Applications

Authors: Manuel Katholnigg, Armin Golla, Dr. Frederik vom Scheidt, Sarah Henni,  
Prof. Dr. Christof Weinhardt



# Motivation



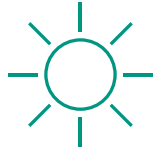
Data: Own research; SPD, Die Grünen und FDP, 2021

# Potentials & Challenges of Seasonal Storage

## Potentials



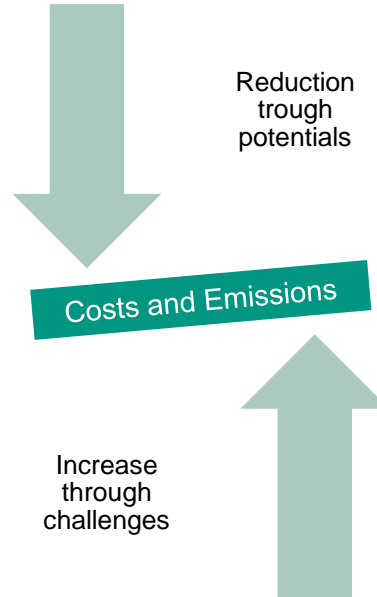
**Less activation of fossil power plants**



**Less shutdowns of renewables**



**Less heat pump capacity & operation**



## Challenges



**High investment costs**



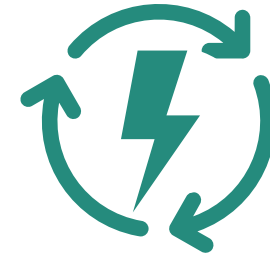
**High life cycle greenhouse gas emissions**



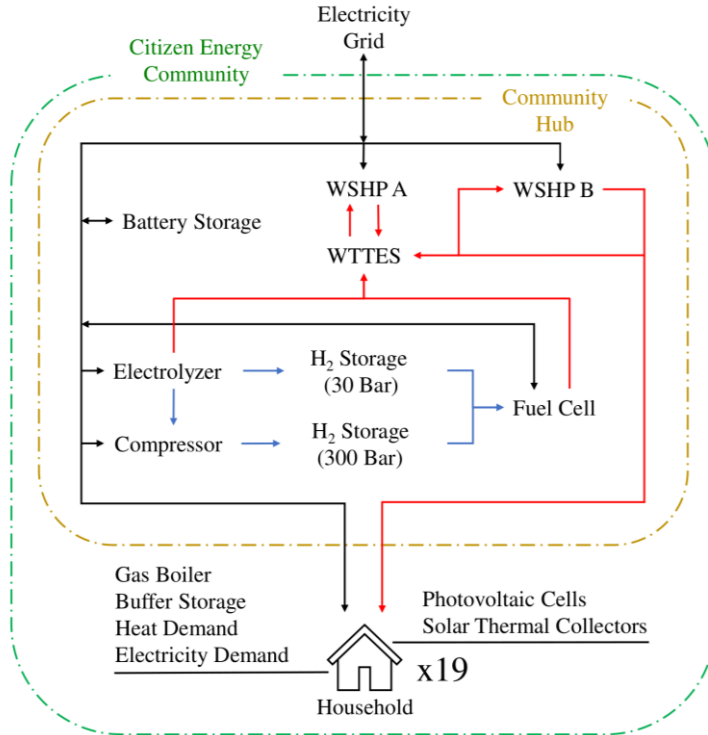
**Operating strategy**

# Research Questions

- 1) What **market, policy, and infrastructural conditions** are required to achieve economic and ecological benefits with a hydrogen system over a 30-year period?
- 2) How can an **operating strategy** be implemented to achieve these economic benefits in operation?



# Layout & Hydrogen Storage Types



**Hydrogen storage (30 bar)**  
Filled with hydrogen at the output pressure of an electrolyzer



**Hydrogen storage (300 bar)**  
Filled with hydrogen at the output pressure of a compressor

→ Heat Pipe      → Electricity Line      → H<sub>2</sub> Pipe

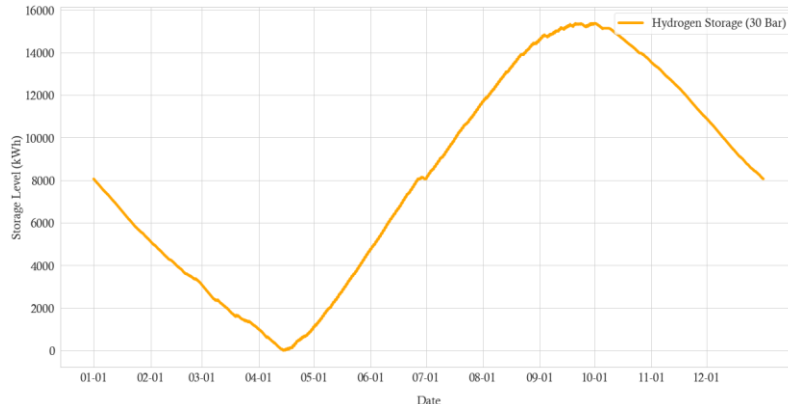
WSHP: Water Source Heat Pump  
WTTS: Water Tank Thermal Energy Storage

# Challenges for an Operating Strategy

## Theoretical Optimum

One 365 days scheduling horizon linear program

→ Seasonal storage curve emerges under suitable conditions



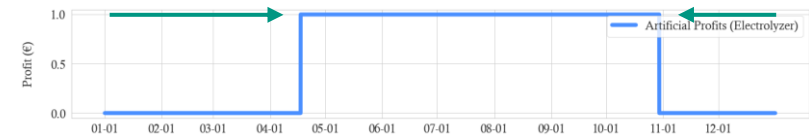
## Operating Strategy

Multiple 48 hours scheduling horizon linear programs

→ Lack of incentive for long-term operation of the seasonal storage

## Solution:

- 1) Implement artificial costs and profits for electrolyzer and fuel cell
- 2) Identify cost and profit levels through genetic algorithm and grid search application



# Objective, Balance & Energy Capacity

$$\min \sum_{\theta \in \Theta} \sum_{\lambda \in \Lambda} \sum_{k \in K} c_k(\lambda, \theta) \cdot w_k + \sum_{\zeta \in Z} \sum_{t \in T} u(\zeta, t) \cdot M$$

s.t.

$$- \sum_{\theta \in \Theta} \zeta^c(\lambda, \theta, \zeta, t) = \sum_{\theta \in \Theta} (\zeta^p(\lambda, \theta, \zeta, t) + \zeta^x(\lambda, \theta, \zeta, t)) \quad \forall \zeta \in Z, \lambda \in \Lambda, t \in T$$

$$\sum_{\zeta \in Z} (\zeta^p(\lambda, \theta, \zeta, t) + \zeta^x(\lambda, \theta, \zeta, t)) \leq e^c(\lambda, \theta) \quad \forall \zeta \in Z, \lambda \in \Lambda, \theta \in \Theta, t \in T$$

$$- \zeta^c(\lambda, \theta, \zeta, t) \leq e^c(\lambda, \theta) \quad \forall \zeta \in Z, \lambda \in \Lambda, \theta \in \{\Theta^d, \Theta^s, \Theta^t\}, t \in T$$

Objective function

Energy system balance

Energy capacity limits carrier production, export & consumption

$\theta$	Technology	$\zeta$	Carrier	$\Theta^d$	Demand technology set	$e^c$	Energy capacity
$\Theta$	Technology set	$Z$	Carrier set	$\Theta^s$	Storage technology set	$c_k$	Technology-related cost or revenue
$\lambda$	Location	$t$	Timestep	$\Theta^t$	Transmission technology set	$w_k$	Cost class weight
$\Lambda$	Location set	$T$	Timestep set	$\zeta^c$	Consumed carrier quantity ( $\leq 0$ )	$u$	Unsatisfied demand
$k$	Cost class	$\Theta^\rho$	Resource conversion technology set	$\zeta^p$	Produced carrier quantity	$M$	Unsatisfied demand penalty factor
$K$	Cost class set	$\Theta^\zeta$	Carrier conversion technology set	$\zeta^x$	Exported carrier quantity		



# Resource Conversion, Demand & Transmission

$$\zeta^c(\lambda, \theta, \zeta, t) \geq d(\lambda, \theta, \zeta, t) \quad \forall \zeta \in Z, \lambda \in H, \theta \in \Theta^d, t \in T$$

$$\frac{\zeta^p(\lambda, \theta, \zeta, t) + \zeta^x(\lambda, \theta, \zeta, t)}{\eta^p(\lambda, \theta, \zeta)} \leq \rho^{av}(\lambda, \theta, t) \quad \forall \zeta \in Z, \lambda \in \Lambda, \theta \in \Theta^p, t \in T$$

$$\rho^{av}(\lambda, \theta, t) = \begin{cases} \rho^t(\lambda, \theta, t) \cdot \rho^{ar}(\lambda, \theta), & \text{if } \lambda \in H \text{ and } \theta \in \Theta^p \\ \infty, & \text{else} \end{cases} \quad \forall \lambda \in \Lambda, \theta \in \Theta, t \in T$$

$$\sum_{\theta \in \Theta^p} \rho^{ar}(\lambda, \theta) \leq r(\lambda) \quad \lambda \in H$$

$$\frac{\zeta^p(\lambda, \lambda^t, \theta, \zeta, t)}{\eta^d(\lambda, \theta, t)} = -\zeta^c(\lambda, \lambda^t, \theta, \zeta, t) \quad \forall \lambda, \lambda^t \in \Lambda, \zeta \in Z, \theta \in \Theta^t, t \in T$$

Demand limits carrier consumption

Available resource limits carrier production & export

Available resource is determined by resource quantity per energy capacity & used resource area, which is limited by the roof area

Carrier consumption & production of transmission technologies

$\theta$	Technology	$Z$	Carrier set	$\zeta^c$	Consumed carrier quantity ( $\leq 0$ )	$\rho^{av}$	Available resource quantity
$\Theta$	Technology set	$t$	Timestep	$\zeta^p$	Produced carrier quantity	$\rho^t$	Resource quantity per energy capacity
$\lambda$	Location	$T$	Timestep set	$\zeta^x$	Exported carrier quantity	$\rho^{ar}$	Used resource area
$\lambda^t$	Transmission endpoint	$\Theta^p$	Resource conversion technology set	$H$	Household set	$r$	Roof area
$\Lambda$	Location set	$\Theta^d$	Demand technology set	$d$	Household demand ( $\leq 0$ )	$\eta^d$	Energy efficiency per distance
$\zeta$	Carrier	$\Theta^t$	Transmission technology set	$\eta^p$	Resource efficiency		



# Carrier Conversion & Storage

$$\frac{\zeta^p(\lambda, \theta, \zeta^{fo}, t)}{\eta^\zeta(\lambda, \theta, \zeta^{fi}, \zeta^{fo})} = -\zeta^c(\lambda, \theta, \zeta^{fi}, t) \quad \forall \zeta^{fi}, \zeta^{fo} \in Z, \lambda \in \Lambda, \theta \in \Theta^\zeta, t \in T$$

$$\frac{\zeta^c(\lambda, \theta, \zeta^{si}, t)}{\zeta^{ri}(\lambda, \theta, \zeta^{fi}, \zeta^{si})} = \zeta^c(\lambda, \theta, \zeta^{fi}, t) \quad \forall \zeta^{fi}, \zeta^{si} \in Z, \lambda \in \Lambda, \theta \in \Theta^\zeta, t \in T$$

$$\frac{\zeta^p(\lambda, \theta, \zeta^{so}, t)}{\zeta^{ro}(\lambda, \theta, \zeta^{fo}, \zeta^{so})} = \zeta^p(\lambda, \theta, \zeta^{fo}, t) \quad \forall \zeta^{fo}, \zeta^{so} \in Z, \lambda \in \Lambda, \theta \in \Theta^\zeta, t \in T$$

$$s(\lambda, \theta, \zeta, t) = s(\lambda, \theta, \zeta, t-1) \cdot (1 - l(\lambda, \theta, \zeta)) + \zeta^c(\lambda, \theta, \zeta, t) \cdot \eta^\zeta(\lambda, \theta, \zeta) - \frac{\zeta^p(\lambda, \theta, \zeta, t)}{\eta^\zeta(\lambda, \theta, \zeta)} \quad \forall \lambda \in \Lambda, \theta \in \Theta^s, \zeta \in Z, t \in T$$

$$s(\lambda, \theta, t) \leq s^c(\lambda, \theta) \quad \forall \lambda \in \Lambda, \theta \in \Theta^s, t \in T$$

$$s(\lambda, \theta, t) \geq s^d(\lambda, \theta) \cdot s^c(\lambda, \theta) \quad \forall \lambda \in \Lambda, \theta \in \Theta^s, t \in T$$

$$e^c(\lambda, \theta) \leq s^c(\lambda, \theta) \cdot e^s(\lambda, \theta) \quad \forall \lambda \in \Lambda, \theta \in \Theta^s$$

Relations between consumed input carriers and produced output carriers for carrier conversion technologies

Storage level is determined by the storage level of the previous time step, charged & discharged energy

Storage capacity limits the storage level, for which a lower bound exists

$\theta$	Technology	$t$	Timestep	$\zeta^{fi}$	First input carrier	$\Theta^s$	Storage technology set	$\eta^\zeta$	Conversion, charge or discharge efficiency
$\Theta$	Technology set	$T$	Timestep set	$\zeta^{fo}$	First output carrier	$\Theta^\zeta$	Carrier conversion technology set		
$\lambda$	Location	$e^c$	Energy capacity	$\zeta^{si}$	Second input carrier	$\zeta^c$	Consumed carrier quantity ( $\leq 0$ )		
$\Lambda$	Location set	$s^c$	Storage capacity	$\zeta^{so}$	Second output carrier	$\zeta^p$	Produced carrier quantity		
$\zeta$	Carrier	$s$	Storage level	$\zeta^{ri}$	Relation between $\zeta^{fi}$ and $\zeta^{si}$	$l$	Storage loss rate between $t-1$ and $t$		
$Z$	Carrier set	$e^s$	Maximum $e^c$ per $s^c$	$\zeta^{ro}$	Relation between $\zeta^{fo}$ and $\zeta^{so}$	$s^d$	Minimum state of charge (fraction of $s^c$ )		

# Technology-related Costs

$$c_k(\lambda, \theta) = \begin{cases} c_k^i(\lambda, \theta) + \sum_{t \in T} c_k^v(\lambda, \theta, t), & \text{if } \theta \in \{\theta^\rho, \theta^\zeta, \theta^t, \theta^s\} \\ 0, & \text{if } \theta \in \theta^d \end{cases}$$

$$\forall k \in K, \lambda \in \Lambda, \theta \in \Theta$$

$$c_k^i(\lambda, \theta) = c_k^c(\lambda, \theta) + c_k^f(\lambda, \theta)$$

$$\forall k \in K, \lambda \in \Lambda, \theta \in \Theta \setminus \theta^d$$

$$c_k^c(\lambda, \theta) = \begin{cases} d_k(\lambda, \theta) \cdot c_k^e(\lambda, \theta) \cdot e^c(\lambda, \theta), & \text{if } \theta \in \{\theta^\rho, \theta^\zeta, \theta^t\} \\ d_k(\lambda, \theta) \cdot c_k^s(\lambda, \theta) \cdot s^c(\lambda, \theta), & \text{if } \theta \in \theta^s \end{cases}$$

$$\forall k \in K, \lambda \in \Lambda, \theta \in \Theta \setminus \theta^d$$

$$c_k^f(\theta) = \begin{cases} c_k^{ef}(\theta) \cdot e^c(\theta), & \text{if } \theta \in \{\theta^\rho, \theta^\zeta, \theta^t\} \\ c_k^{sf}(\theta) \cdot s^c(\theta), & \text{if } \theta \in \theta^s \end{cases}$$

$$\forall k \in K, \theta \in \Theta \setminus \theta^d$$

Technology-related costs consist of investment & variable costs

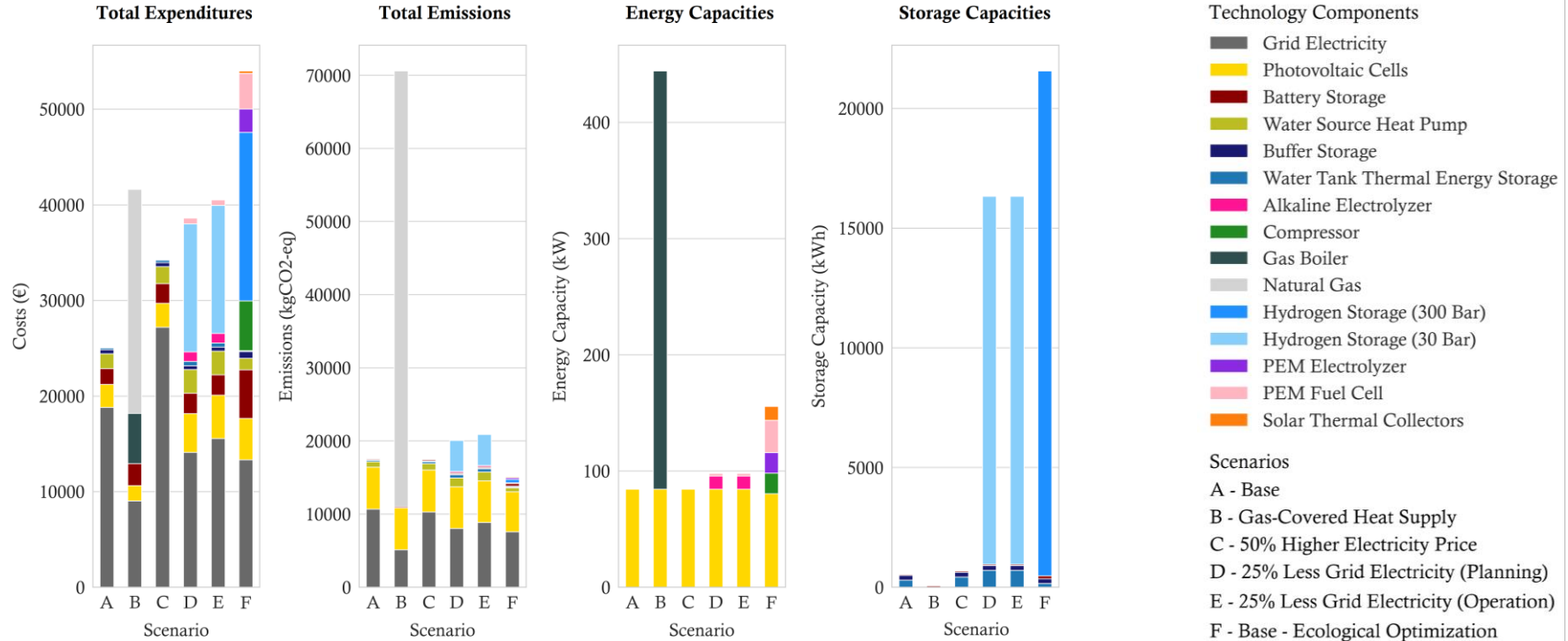
Investment costs embody capacity-related & fixed O&M costs

Capacity-related costs depend on depreciation rate, costs per capacity and used capacity

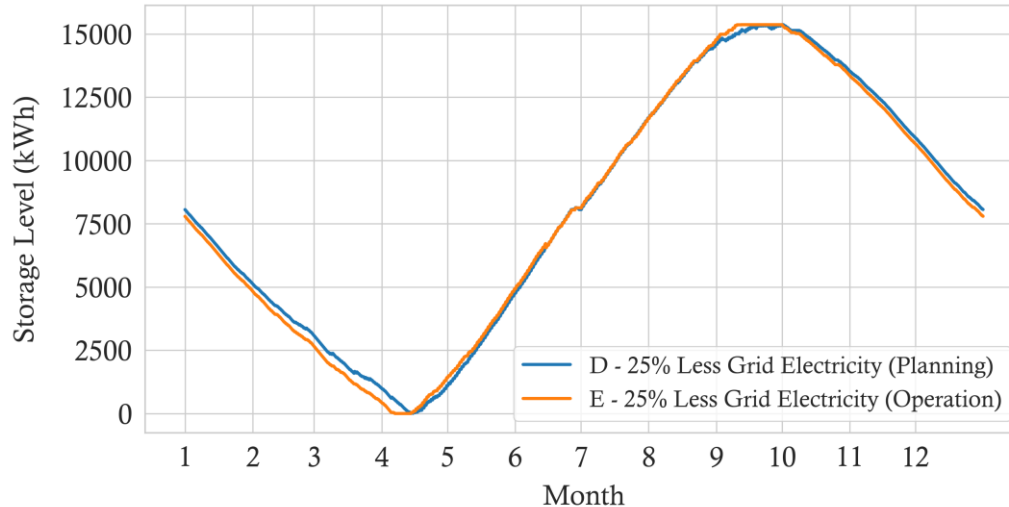
Fixed O&M costs depend on capacity & fixed O&M costs per capacity

$\theta$	Technology	$t$	Timestep	$c_k^c$	Capacity-related costs	$\theta^\rho$	Resource conversion technology set	$c_k^s$	Capacity-related costs per storage capacity
$\Theta$	Technology set	$T$	Timestep set	$c_k^f$	Fixed O&M costs			$c_{k,m}^{ef}$	Fixed O&M costs per energy capacity
$\lambda$	Location	$e^c$	Energy capacity	$d_k$	Yearly depreciation rate	$\theta^\zeta$	Carrier conversion technology set		
$\Lambda$	Location set	$s^c$	Storage capacity	$\theta^d$	Demand technology set	$c_k$	Technology-related cost or revenue	$c_{k,m}^{sf}$	Fixed O&M costs per storage capacity
$k$	Cost class	$c_k^i$	Investment costs	$\theta^s$	Storage technology set	$c_k^e$	Capacity-related costs per energy capacity		
$K$	Cost class set	$c_k^v$	Variable costs	$\theta^t$	Transmission technology set				

# Expenditures, Emissions and Capacity Results



# Optimal Operating Strategy



## Genetic Algorithm & Grid Search Results

**Charging period: Electrolyzer**  
Artificial profits of 0.06€ per kWh

**Discharging period: Fuel Cell**  
Artificial costs of 0.20€ per kWh

→ 48 hours of perfect foresight lead to 4.2% higher total expenditures compared to 365 days of perfect foresight

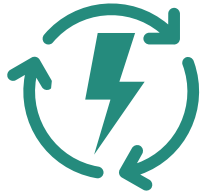
# Conclusion – Economical Evaluation



## **Economic benefits only in special cases**

such as limited access to the electricity grid or the goal of high self-generated electricity consumption

→ Little economic potential in the near future



## **Interval-based solution of linear programs as basis for operation**

Artificial costs and profits enable an efficient seasonal storage integration

→ Forecasts regarding energy prices, weather and energy consumption mainly determine the benefit

# Conclusion – Ecological Evaluation



**Hydrogen storage with 300 bar leads to emission reductions**  
in contrast to a 30 bar storage, which leads to emission increase

→ Cross-sectoral CO<sub>2</sub> price is more desirable than unspecific subsidies



**Comprehensive heat pump and PV expansion has priority**

Maximum possible emission reduction is 78.59% compared to gas-fired heat coverage, without hydrogen 75.08% is possible

→ Non-use of gas brings decisive emission savings

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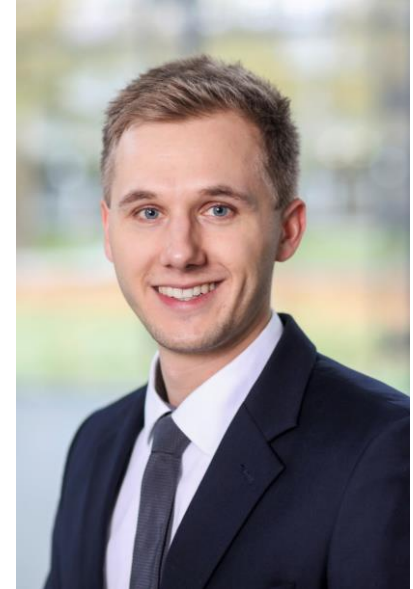


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