

Sustainable municipality modelling: Clustering-based modeling framework of a decentralized municipality energy and resource treatment infrastructure portfolio

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- Introduction and motivation
- Investigation setup and case study
- Optimization model
- Results investment decisions
- Modeling framework applicability
- Summary and conclusions





- European climate targets by interaction of centralized and decentralized generation
  - and conversion technologies
- Community establishment to promote local energy use
- Often missing driving force for establishment and operation
- Municipal governments as community operators
- Take responsibility for operation and performs investments
- Development local sustainable municipalities (LSM)





- Local sustainable municipality (LSM)
  - Association of communities in a municipality  $\rightarrow$  extension of local communities
  - Municipality as operator of the LSM
  - Similar to regional energy communities, but within municipalities
  - Energy- and resource utilization business models and investments
  - Goal: Promote sustainable development at municipal level
- LSM investment
  - Investment decisions for LSM
  - Performed at multiple locations within the municipality
  - Primary investment in resource treatment plants
  - Dependent on configuration and policy
  - Also PV investments possible if areas can be provided

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- Muncicipality: Breitenau am Steinfeld
- Aggregation of inhabitants to 4 communities
- Additional communities with public buildings
- Predefined
  - Energy and water demands
  - Accruing waste
  - Consumer and household numbers
  - Technology potential public buildings
- Assumed
  - Demand profiles
  - Technology potential private buildings
  - Technology investment costs and operational costs
  - Different tariffs
  - Distances, grid lengths and efficiencies between LSCs



# Investigation setup and case study



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- Quantify the impact of renewable energy provision
- Investigation of different waste treatment options and their establishment under different frameworks and conditions
- Analysis of water circular economy with sewage treatment and sludge treatment
- Development of an optimization model with local investment decisions





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- Multiple step modeling framework
  - Step 1: Determine investments
  - Step 2: Optimize LSM operation
- Data clustering for portfolio optimization
  - K-means algorithm
  - Decrease computing time of solving







- Load input data into the model
  - Predefined input data including costs, technology parameters and demand timeseries







- Clustering of input data
  - Application of K-means algorithm
  - Clustering to 360 clusters
  - 30 clusters per month to consider seasonal variance of PV generation







- Data processing
  - Weighting with cluster centers
  - Maximum accruing resources that must be treated crucial for treatment capacity determination
  - PV generation timeseries adapted to prevent overestimation
  - Reduction in regard with anual generation data







- Performing investment decision with clustered data in first optimization step
  - Clustered data and cost data input
  - Investment optimization over shorter period
  - Model size reduction optimization over shorter period
  - Results provide technology capacities







- Replacement of investment components by operational components
  - Model adaption to operational technology components
  - Maximum capacities based on investment decision
  - Other than that, no configuration changes







- Second optimization to determine results
  - Operational optimization
  - Performance over year in hourly resolution
  - Model size reduction by only considering technology operation





- Cost minimization
  - $z = \min(c^{total})$
- Conversion relation
  - $x_t^{out} = F^{conversion} \cdot x_t^{in}$
- Technology limitations

$$x_t \le \frac{x^{max}}{\Delta t}$$

- Balance rule for all consumers and sectors
  - $\sum_{inputs} x_{t,i,j} = \sum_{outputs} x_{t,i,j} \forall i \in Sectors, j \in Consumers$
- Storage equations

• 
$$soc_{t+1} = soc_t + x_t^{in} \cdot \eta^{in} - \frac{x_t^{out}}{\eta^{out}}$$

•  $soc_0 = SOC^{start}$ 





# Optimization model: Investment decision



- Determination of maximum technology capacity
- Result as input to operational model
- Costs considered in total cost analysis
  - $c^{total} = c^{operationalmodel} + c^{investment}$
- Investment costs with variable costs and fixed costs (for certain technologies)
- Prevent multiple resource treatment plants at different locations
- Considered with annuities
- Weighted with period of year (e.g. clustering based only for about 2 weeks → consider in costs)

$$\begin{aligned} \alpha_{technology} &= \frac{(1+WACC)^{n} \cdot WACC}{(1+WACC)^{n}-1} \\ c_{technology}^{inv,fix} &= \alpha_{technology} \cdot C_{technology}^{fix} \cdot \frac{T}{T^{year}} \\ c_{technology}^{inv,var} &= \alpha_{technology} \cdot C_{technology}^{var} \cdot \frac{T}{T^{year}} \end{aligned}$$





- Test of the framework application in municipality
- Comparison with 4 hourly resolution and single step optimization
- Impact assessment on local generation technology investments, battery investments and treatment facility investments
- Determination of total costs
- Computation time, respectively model size



#### 4 hourly resolution

Tech.	LSC1	LSC2	LSC3	LSC4	LSC5	Sum
$rac{\mathbf{PV}}{\mathrm{kWp}}$ in	1630	2162	2000	1010	412	7214
Battery in kWh	21	22	8	8	0	59
District heat in kW	0	126	105	0	0	231
Heat pump kW	804	853	796	732	214	3399
Waste comb in kW	0	0	580	0	0	580
$\begin{array}{c} {\bf Sewage} \\ {\bf treat} \\ {\bf in} \ {\rm m}^3 \end{array}$	0	0	9	0	0	9
Total costs in €		1,201,762				
Computation time		10h 7min 5sec (36425s)				

#### **Modeling framework**

Tech.	LSC1	LSC2	LSC3	LSC4	LSC5	Sum
$\begin{array}{c} \mathbf{PV} & \mathbf{in} \\ \mathbf{kWp} \end{array}$	1630	2162	2000	1010	412	7214
Battery in kWh	0	16	9	10	3	38
District heat in kW	0	119	112	0	0	231
Heat pump kW	816	875	803	743	217	3454
Waste comb in kW	0	0	580	0	0	580
$\begin{array}{c} {\bf Sewage} \\ {\bf treat} \\ {\bf in} \ {\rm m}^3 \end{array}$	0	0	9	0	0	9
Total costs in €		1,358,035				
Computation 0h 49min 36sec (2976 s) time						

## Modeling framework applicability

- PV determined at same values in both approaches
  - Limiting factor rooftop area rather than modeling approach
- Lower battery installation with modeling framework
- District heating with same total capacities but with different allocation to locations
- Increased heat pump installation with modeling framework
- Resource treatment facilities installed with same capacities at same locations





### Modeling framework applicability

80

Deviation in % 05 09

20

0

- Cost estimations differ between both approaches
  - 12% higher cost estimation with modeling framework
- Computation time decreases by 92% with modeling framework
  - Reduction from more than 10h to less than 1h
  - Computation time reduction for more complex configurations with multiple treatment options even higher







Framework applicable for	Framework not applicable for
Capacity estimation of technology installations	Detailed portfolio optimization analyses
Capacitiy localization within communities or municipalities	Determination of exact incurred costs
Potential analyses for technology implementations	Detailed capacity investment analyses





- The proposed modeling framework lead to significant computation time reductions
- Capacity localization could be performed appropriately, while capacity investment could be estimated
- However, the framework is not appropriate for exact portfolio optimizations





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