



OPTIMIZING THE ACQUISITION AND OPERATION OF DISTRIBUTED GENERATION SYSTEMS

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Research Question





What is the least cost system design and dispatch to meet the electricity demand of a commercial building?

Outline

- Mixed-Integer Program (MIP)
 - Basic Formulation
 - Solution Intuition
- Numerical Example
 - Optimal Design and Dispatch
 - Cost Analysis
- Conclusions and Extensions



MIP: Assumptions

- One entity is the building owner *and* operator.
- Building's annual load demand is the same for the lifetime of the acquired system.
- Building demand and fuel cell power are constant over each hour.
- Natural gas-fed fuel cells are acquired at the beginning of the time horizon at a fixed cost.
- Fuel cells can operate however the solution dictates.
- Grid prices are fixed over the time horizon.



MIP: Sets and Parameters

Sets

 $m \in M$: set of all months in a year

 $t \in T_m$: set of all hours in month m $(T = \bigcup_m T_m)$

Parameters

 $\tau = \text{time increment (hours)}$

 $d_t =$ expected value of electricity demand in hour t (kW)

- \rightarrow c = amortized, annual capital cost of each fuel cell (\$/fuel cell)
 - k = maximum power capacity of each fuel cell (kW)
- \rightarrow g = expected value of price of electricity from the fuel cell (\$/kWh)
 - p = expected value of price of electricity from the grid (/kWh)
 - \hat{p} = expected value of peak price of electricity from the grid (\$/kW/month)



MIP: Capital Cost Parameter

- ρ = annual interest rate (fraction)
- $\lambda =$ average lifetime of the fuel cell (years)
- $\kappa = \text{total capital cost ($/fuel cell)}$

$$\kappa = 1296.482k^{0.809}$$

 $c = \frac{\kappa e^{\rho \lambda}}{\gamma}$



MIP: Fuel Cell Electricity Price Parameter

0.034 therms per kilowatt-hour

- $p^g =$ expected value of price of natural gas (\$/therm)
 - $\epsilon =$ electrical efficiency of the fuel cell (fraction)



R.J. Braun. Techno-economic optimal design of SOFC systems for residential micro-combined heat and power applications in the U.S. *ASME Journal of Fuel Cell Science and Technology*, 7, June 2010.



MIP: Variables and Objective

Variables

- A = number of fuel cells acquired (integer)
- F_t = power generated by fuel cells in hour t (kW)
- $G_t =$ power bought from the grid in hour t (kW)
- \hat{G}_m = peak power bought from the grid in month m (kW)

Objective

$$\min AC = \begin{bmatrix} cA + g \sum_{t} \tau F_{t} \end{bmatrix} + \begin{bmatrix} p \sum_{t} \tau G_{t} + \hat{p} \sum_{m} \hat{G}_{m} \end{bmatrix}$$

Fuel Cell Grid

MIP: Constraints

$F_t + G_t$	\geq	d_t	$\forall t \in T$	(1)
\hat{G}_{m}	\geq	G_t	$\forall m \in M, t \in T_m$		2)
F_t	\leq	kA	$\forall t \in T$		3)
F_t, G_t, \hat{G}_m	\geq	0	$\forall t \in T, m \in M$	(-	4)
A	\geq	$0, ext{ integer}$		(5)

- (1) Demand must be met by fuel cells and grid
- (2) Peak load is greatest hourly load for the month
- (3) Fuel cells cannot exceed their total capacity
- (4)-(5) Non-negativity and integrality

MIP: When will fuel cells be acquired?

$$AC = \begin{bmatrix} cA + g \sum_{t} \tau F_{t} \end{bmatrix} + \begin{bmatrix} p \sum_{t} \tau G_{t} + \hat{p} \sum_{m} \hat{G}_{m} \end{bmatrix} \qquad \begin{array}{c} \hat{G}_{m} &= \max_{t \in T_{m}} \{G_{t}\} \\ G_{t} &= d_{t} - F_{t} \end{array}$$

Mixed System Cost
$$\begin{bmatrix} 1 \le A \text{ and } F_{t} \ge 0 \ \forall t \end{bmatrix}$$
$$\begin{bmatrix} cA + g \sum_{t} \tau F_{t} \end{bmatrix} + \begin{bmatrix} p \sum_{t} \tau (d_{t} - F_{t}) + \hat{p} \sum_{m} \max_{t \in T_{m}} \{d_{t} - F_{t}\} \end{bmatrix}$$

Grid-only System Cost
$$\begin{bmatrix} A = 0 \text{ and } F_{t} = 0 \ \forall t \end{bmatrix}$$
$$\begin{bmatrix} p \sum_{t} \tau d_{t} + \hat{p} \sum_{m} \max_{t \in T_{m}} \{d_{t}\} \end{bmatrix}$$

MIP: When will fuel cells be acquired?

The cost of the mixed system is less than the cost of the grid-only system when

$$\hat{p} \left[\sum_{m} \left(\max_{t \in T_m} \{d_t\} - \max_{t \in T_m} \{d_t - F_t\} \right) \right] - (g - p) \left[\sum_{t} \tau F_t \right] > cA$$
Reduced Peak Load Costs
Added Operational Costs

 Fuel cells will be acquired and operated when the net savings in operational costs are greater than the capital cost.



- Three-story, 54K sqft office building in Boulder, CO
- Annual electricity demand of 445,421 kWh
- Average hourly load demand of 51 kW
- Based on "typical" year demand
- Electricity demand includes lighting, office equipment, and cooling



Example: Demand Parameters

 $\tau = 1$ hour

 $d_t =$ forecasted hourly demand (kW)



Example: Other Parameters

- Commercial Electricity–Secondary General Service
- Commercial Gas-Small Service
 - $c=\$1,777\,$ annually per fuel cell
 - $k = 20 \, \mathrm{kW}$
 - g =\$0.011 per kWh
 - $p=\$0.005\,$ per kWh
 - $\hat{p} = \$13.83\,$ per kW per month

$$c = \frac{\kappa e^{\rho \lambda}}{\lambda} = \frac{14,625e^{0.04(15)}}{15} = 1,777$$
$$g = \frac{0.034p^g}{\epsilon} = \frac{0.034(0.131)}{0.42} = 0.011$$

Xcel Energy. Colorado Rates and Tariff Information. Electric and Gas Tariff Books. http://www.xcelenergy.com/Colorado/Company/About_Energy_and_Rates

Example: Initial Feasible Solution

Grid-only system is always feasible in this model



Example: Optimal Solution

Optimal system has 6 fuel cells (120 kW total)



Example: Optimal Solution



Cost Analysis

Does the acquisition condition from before hold?

$$\hat{p} \left[\sum_{m} \left(\max_{t \in T_m} \{d_t\} - \max_{t \in T_m} \{d_t - F_t\} \right) \right] - (g - p) \left[\sum_{t} \tau F_t \right] > cA$$

$$\$19,575.05 - \$2,028.55 > \$10,662.00$$

$$\$17,546.50 > \$10,662.00$$

- The net savings pay off the capital investment in 7-9 years, depending on the discount rate.
- The 6 fuel cell system is cheaper than the grid-only system for capital costs up to \$17,546.50, but it does not remain optimal (decrease to 4 fuel cells).



Cost Analysis

Is it better to utilize the fuel cells more?



 Levelized cost from fuel cells decreases from \$0.043 per kWh to \$0.035 per kWh, but annual cost and levelized cost of system increase.



Basic Model Conclusions

- The optimal system design is driven by the reduction of peak load costs.
- The optimal dispatch strategy is to base-load with the grid in months where peak demand exceeds on-site capacity and meet hourly peaks with the fuel cells.
- This basic model provides a foundation for specifying more realistic system characteristics and determining the effect on the optimal design and dispatch.



Extensions

Cost Measurement

- Seasonal / Time-of-Day Pricing and Pricing Structures
- Net Metering
- Fuel Cell Characteristics
 - Different Capacities, Ramp Rates, and Efficiencies
 - Minimum Turn-down Ratio and Cycling
 - Combined Heat and Power
- Renewable Generation
 - Solar Cells, Wind Turbines, and Batteries
- Stochasticity
 - Demand, Prices, and Generation (Renewable)







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