



**Pacific Northwest**  
NATIONAL LABORATORY

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# Economic Analysis and Optimal Sizing for Behind-the-meter Battery Storage

DI WU

Pacific Northwest National Laboratory

Interagency Sustainability Working Group Webinar

March 22, 2018

# Grid Applications/Services using Energy Storage

- ▶ Transmission level
  - energy arbitrage
  - frequency regulation
  - spin and non-spin reserve
  - primary frequency response
  - resource adequacy
- ▶ Distribution level
  - distribution upgrade deferral
  - outage mitigation
  - volt/var support
- ▶ Behind-the-meter and customer domain
  - energy charge reduction (load shaping charge or energy imbalance charge)
  - demand charge reduction



Department of Commerce



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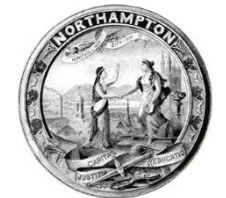
Sandia  
National  
Laboratories



PUGET  
SOUND  
ENERGY



ENERGY  
NORTHWEST



Mitsubishi International Corporation



LG Chem

# Washington State Clean Energy Funds Energy Storage Projects



*2MW/1 MWh Li-ion system  
2MW/8.8 MWh UET vanadium-flow  
Everett, WA*



*2 MW/4.4 MWh lithium-ion/phosphate battery  
Glacier, WA*



*1 MW/3.2 MWh UET vanadium-flow battery  
Pullman, WA*

**Total—7 MW/15 MWh;  
\$14.3 million state investment and \$43 million  
total investment for energy storage systems**



# Battery Storage for Behind-the-meter Applications

- ▶ Energy charge is based on the amount and time when energy is consumed.
  - Load shaping charge and energy imbalance charge are very similar as energy charge and can be modeled using the same mathematic formulation.
- ▶ Demand charge is based on the highest power consumption in different time periods.
- ▶ Separate charges for energy and demand more fairly distributed power system's operation and investment cost to customers.
- ▶ Example of electric utility rate tariff

		Summer	Winter (Oct.-May)
Energy (\$/kWh)	On	0.145	NA
	Mid	0.092	0.096
	Off	0.067	0.073
Demand (\$/kW/month)		30	



# Battery Optimal Dispatch

$$\min_{p_k, e_k^{\text{batt}}} \underbrace{\sum_{k=1}^K \lambda_k \overbrace{(L_k - p_k)}^{\text{net load}} \Delta T}_{\text{energy cost}} + \underbrace{\sum_{j=1}^J \beta_j \overbrace{\max(\{L_k - p_k : k \in \mathcal{N}_j\})}_{\text{peak demand over time period } j}}_{\text{demand cost}} \quad (1a)$$

subject to:

$$\text{Charging/discharging limit:} \quad -p_{\max} \leq p_k \leq p_{\max}, \quad \forall k = 1, \dots, K \quad (1b)$$

$$\text{ROC of energy in batt.:} \quad p_k^{\text{batt}} = \begin{cases} p_k / \eta^+ & \text{if } p_k \geq 0 \\ p_k \eta^- & \text{if } p_k < 0 \end{cases}, \quad \forall k = 1, \dots, K \quad (1c)$$

$$\text{Dynamics of energy in batt.:} \quad e_k^{\text{batt}} = e_{k-1}^{\text{batt}} - p_k^{\text{batt}}, \quad \forall k = 1, \dots, K \quad (1d)$$

$$\text{Energy limits:} \quad 0 \leq e_k^{\text{batt}} \leq E_s / \eta^+, \quad \forall k = 1, \dots, K \quad (1e)$$

$L_k$ : Load without battery at time step  $k$  (e.g., 15-minute or hour).

$p_k$ : Battery charging/discharging power (measured at AC side) at time step  $k$ , which is positive when discharging, i.e., using generator convention.

- D. Wu, C. Jin, P. Balducci, and M. Kintner-Meyer, "An energy storage assessment: Using optimal control strategies to capture multiple services," *IEEE Power and Energy General Meeting*, Denver, CO, Jul. 2015.
- D. Wu, M. Kintner-Meyer, T. Yang, and P. Balducci, "Economic analysis and optimal sizing for behind-the-meter battery storage," *IEEE Power and Energy General Meeting*, Boston, MA, Jul. 2016.
- D. Wu, M. Kintner-Meyer, T. Yang, and P. Balducci, "Analytical sizing methods for behind-the-meter battery storage," *Journal of Energy Storage*, Aug. 2017.
- D. Wu, P. Balducci, A. Crawford, V. Viswanathan, and M. Kintner-Meyer, "Optimal control for battery storage using nonlinear models" *Electrical Energy Storage Applications and Technologies Conference*, San Diego, CA, Oct. 2017.



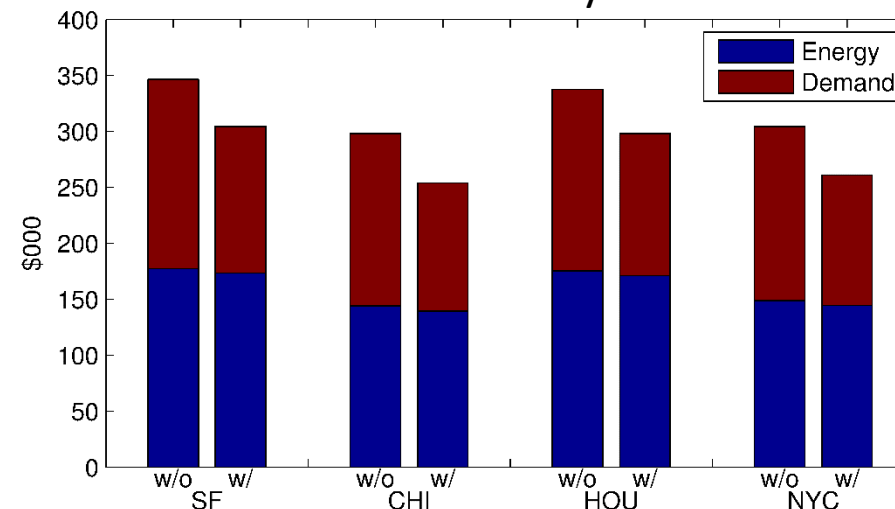
# Annual Electricity Cost and Saving

Battery rating: 0.2 MW/0.8 MWh

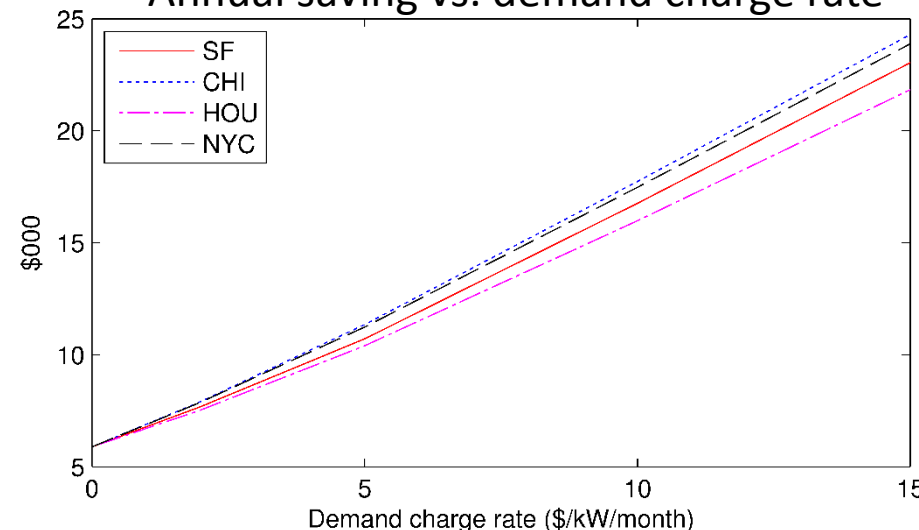
Efficiency: 0.868 (charging) and 0.887 (discharging)

- ▶ Demand charge account for half of total electricity bill. The capability of lowering peak from battery provides a great opportunity to cut electricity bill.
- ▶ Saving in energy charge is marginal comparing with demand charge due to losses.
- ▶ Total saving in electricity bill do not vary significantly with office load patterns.
- ▶ Energy charge reduction is independent of load profiles.
- ▶ Annual saving in electricity bill is quite linear to demand charge rate.

### Annual Electricity Cost

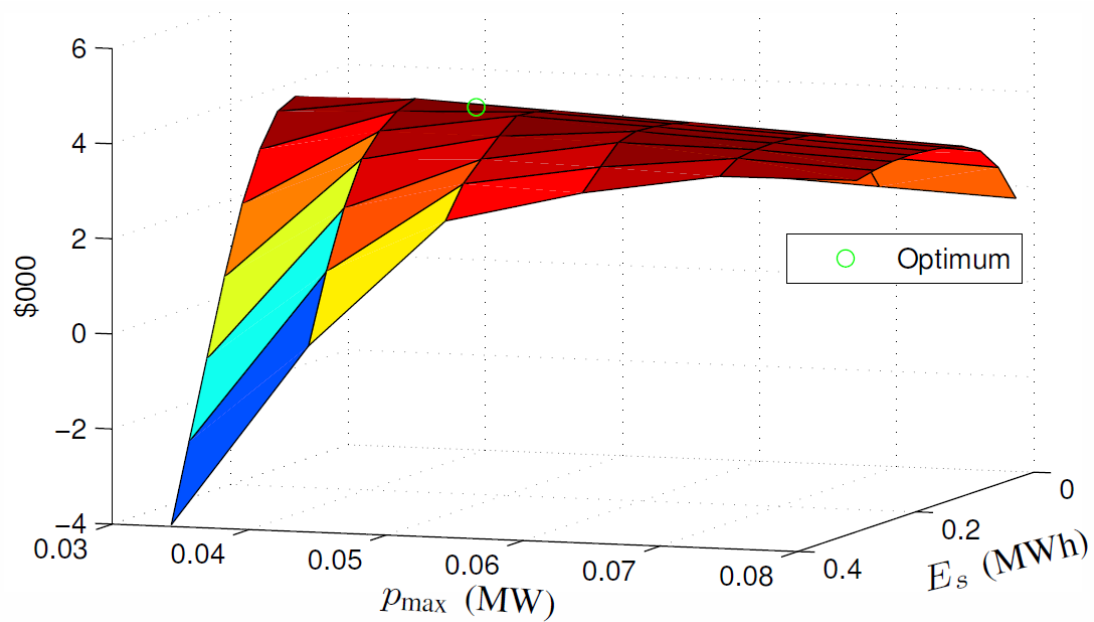


### Annual saving vs. demand charge rate

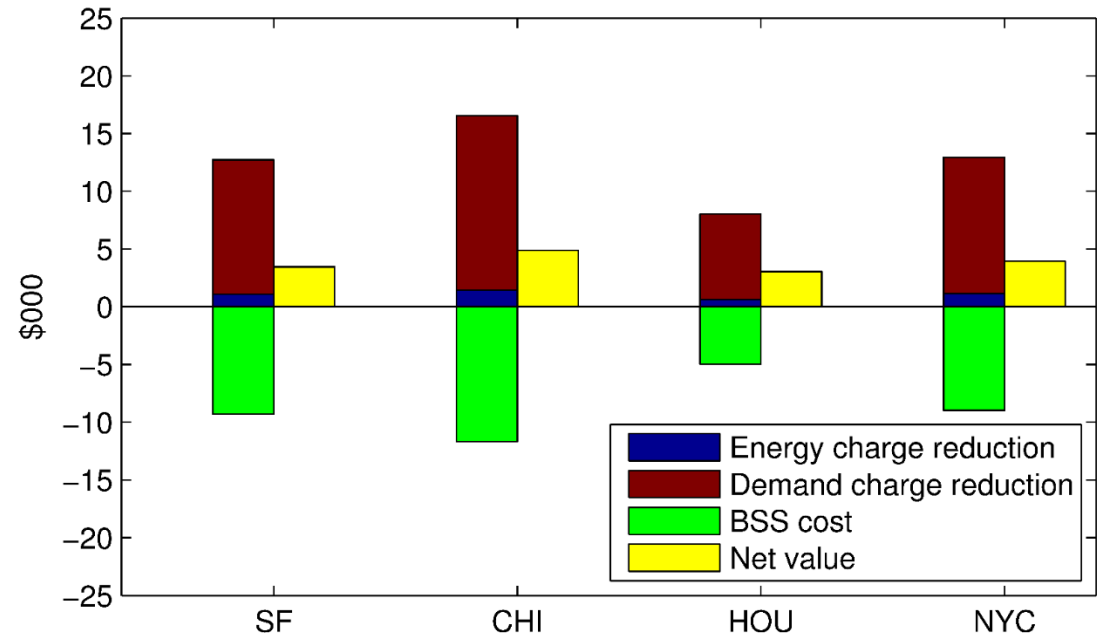


# Optimal Sizing

Sensitivity of net value on battery sizes with  
Chicago office building load profile



Annual benefits vs. levelized cost with  
optimal size





# Los Alamos Microgrid with Energy Storage

- ▶ Background
- ▶ Key questions
  - What are the potential benefits from different investment candidates?
  - What is the optimal scale in terms of power and energy capacity for the energy storage systems?
  - How can we evaluate tradeoffs between benefits accruing to end-user and utility?



## ▶ Utility benefits

- Capacity value
- Energy time shifting
- Regulation services
- Spin and non-spinning reserves
- Outage mitigation
- Distribution investment deferral
- Voltage support

## ▶ End-user benefits

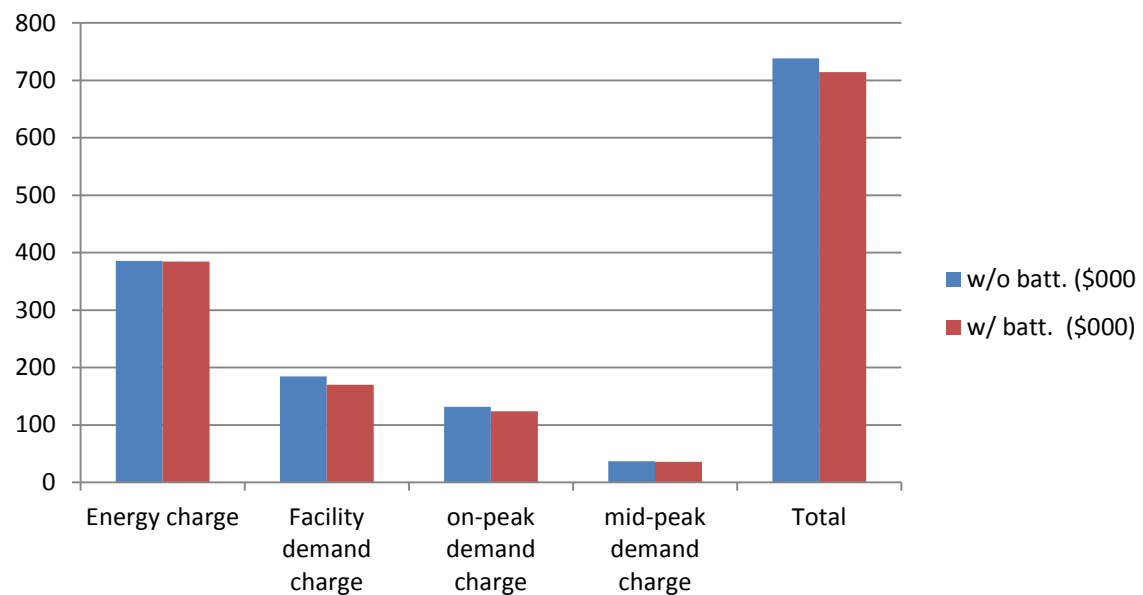
- Energy time shifting (reduce energy charge)
- Peak demand reduction (reduce demand charge)
- Outage mitigation



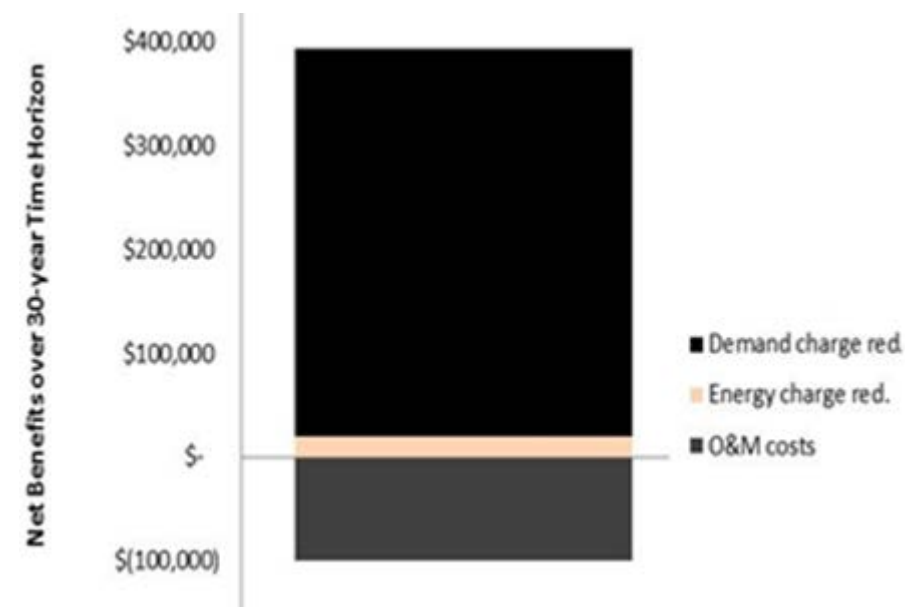
# Results in Scenario a

175 kW/175 kWh (behind-the-meter, benefits to end-user)

## Annual



## Present value



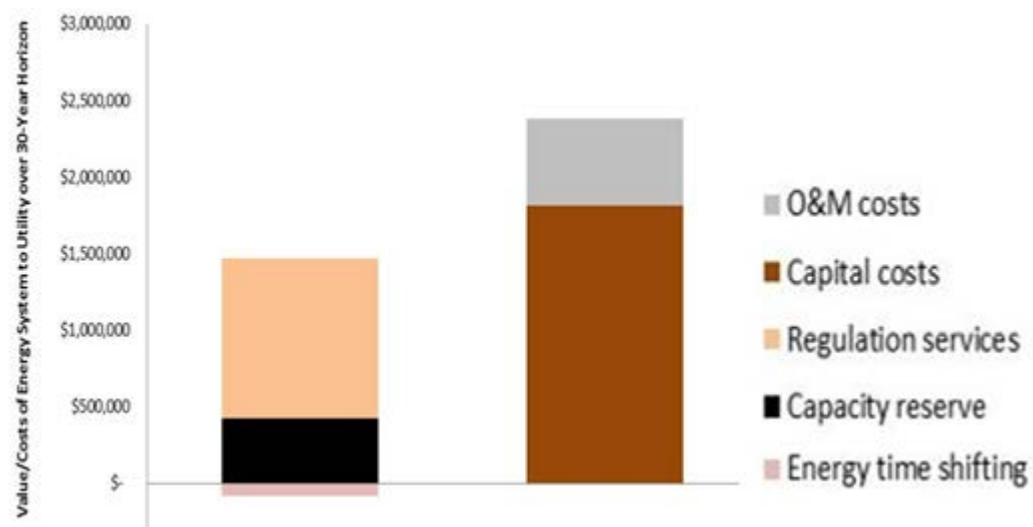
Key Point: BSET found optimal energy storage sizing at 204 kW/258 kWh when combined with 625 kW of PV.



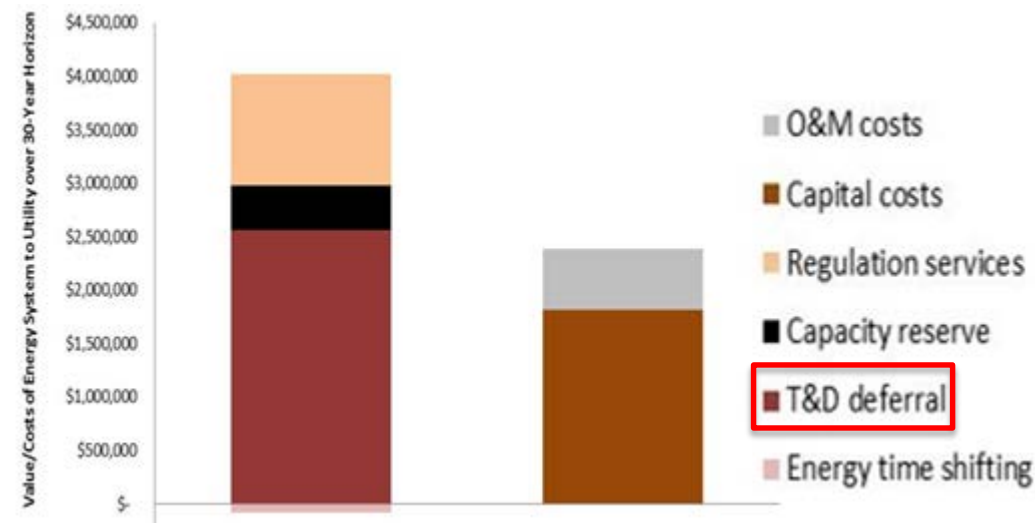
# Results in Scenario b

1 MW/1 MWh (utility invested and owned)

Utility benefits without T&D deferral



Utility benefits include T&D deferral (\$156/kW-year)

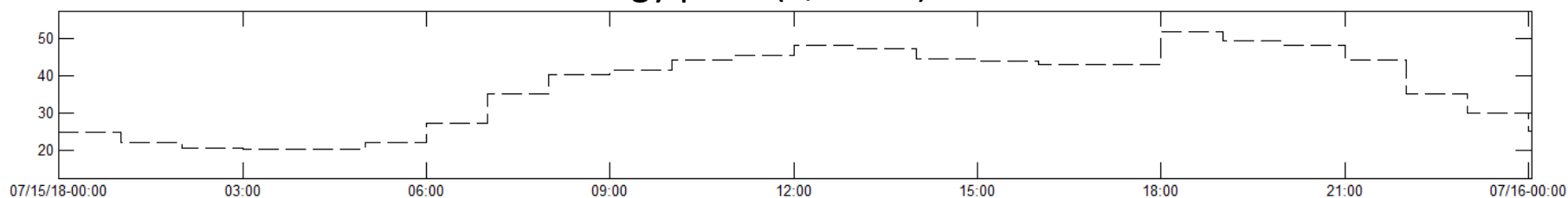


Key Point: In base case, energy storage benefits are significant but fall short of costs. Adding transmission and distribution (T&D) system upgrade deferral could easily yield benefits that exceed costs.



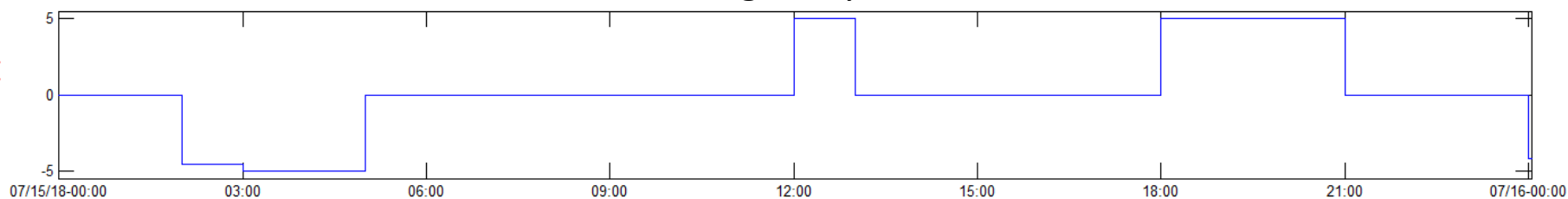
# Bundling Services: How To Do It Optimally?

### Energy price (\$/MWh)



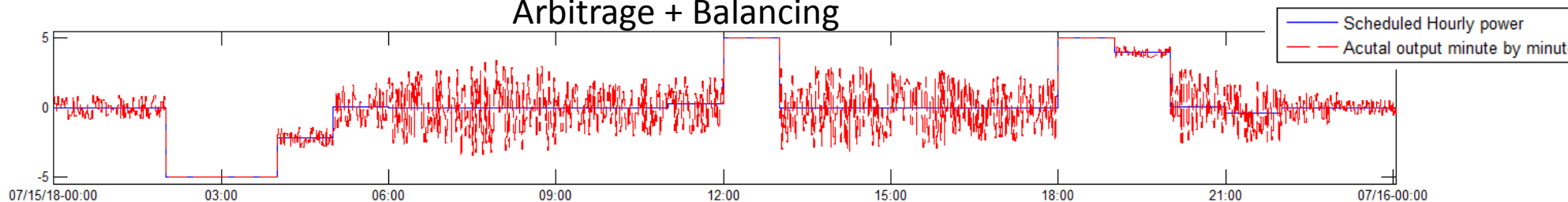
### Arbitrage only

Power output  
(MW)



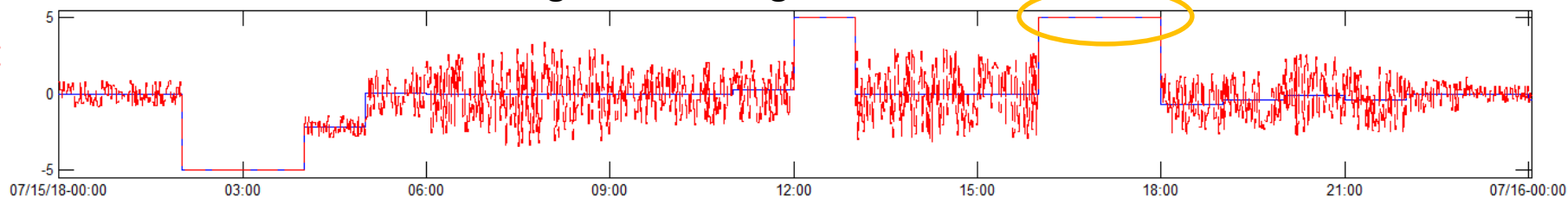
### Arbitrage + Balancing

Power output  
(MW)



### Arbitrage + Balancing + T&D deferral

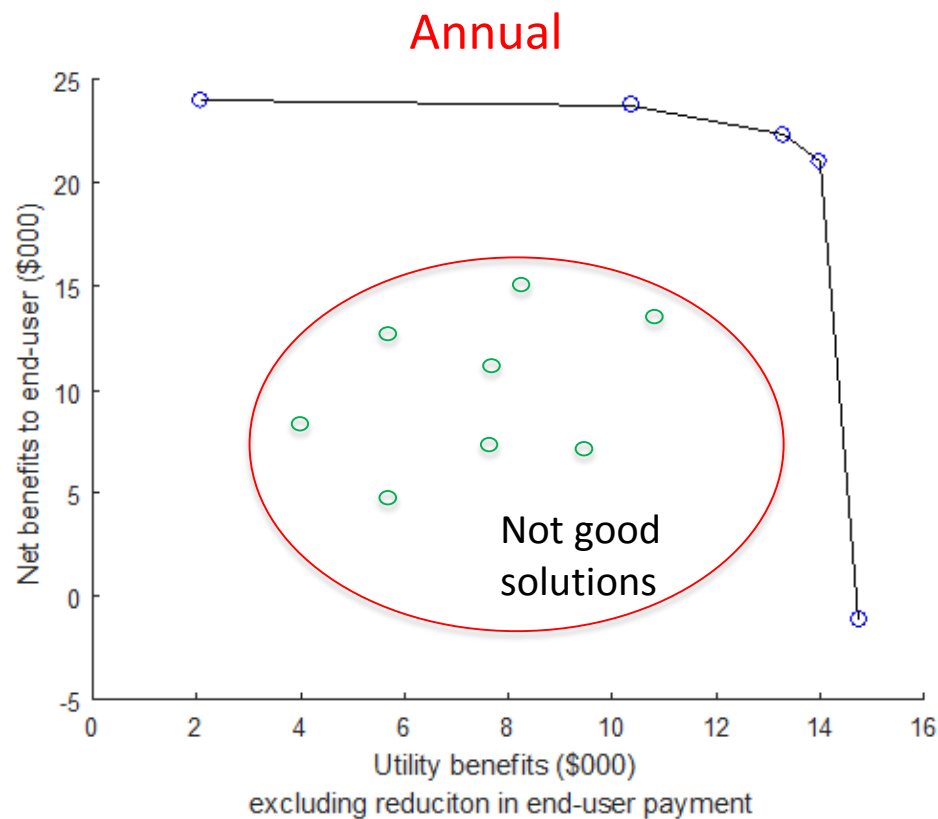
Power output  
(MW)



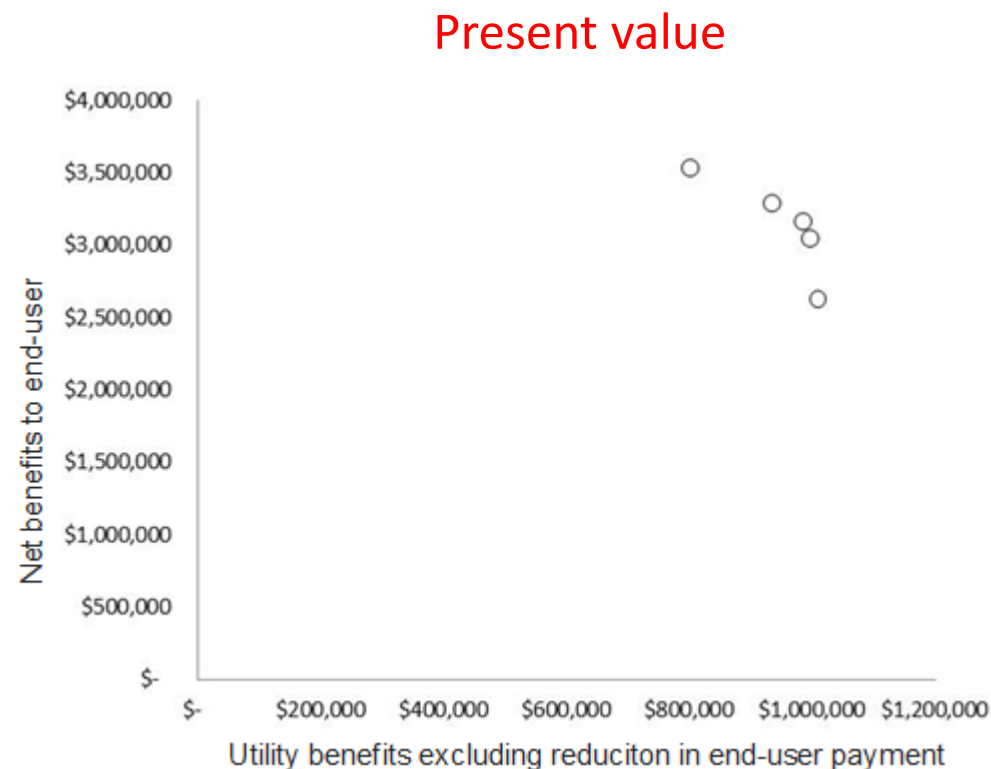


# Pareto Front for Multi-objective Optimization

175kW /175kWh battery

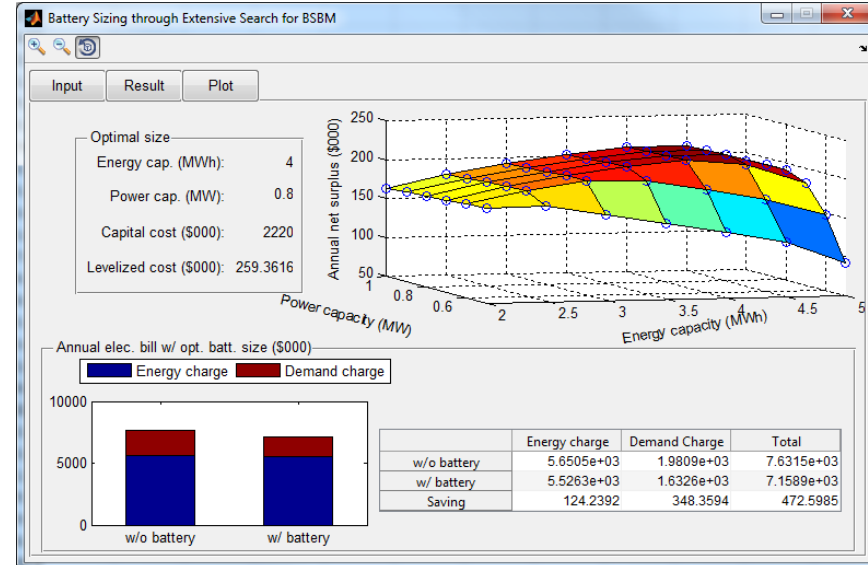
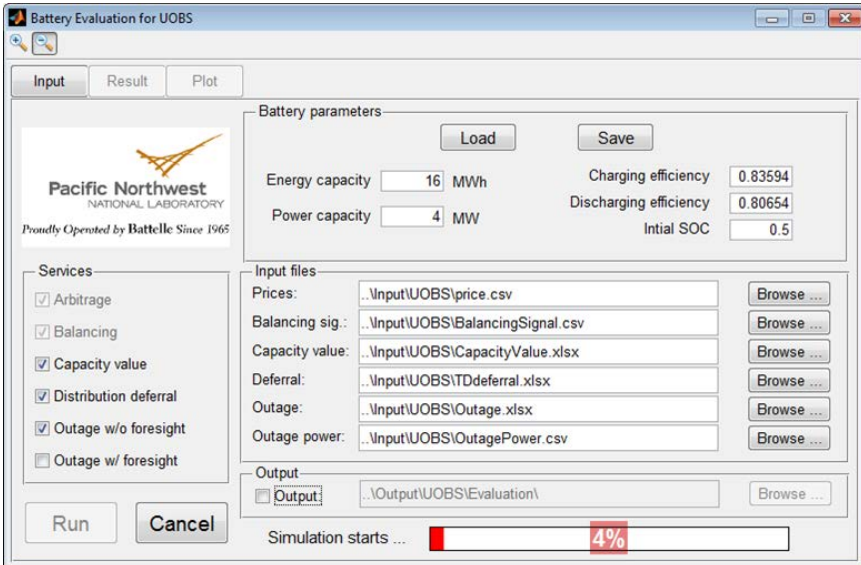
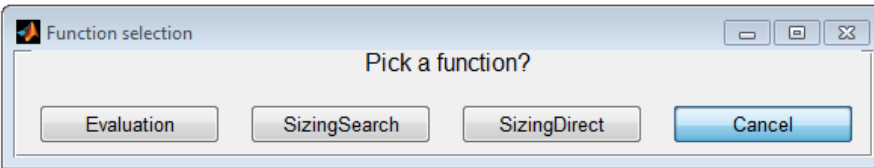
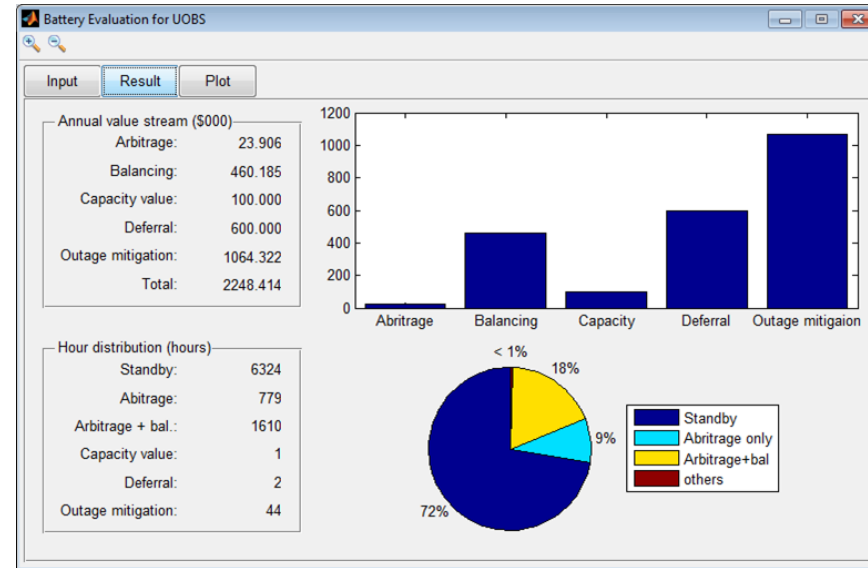


625 kW PV + 175kW /175kWh battery



There does not exist a single solution that can simultaneously maximize both objectives; there exist Pareto optimal solutions

# Evaluation and Sizing Tool





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Thank you !  
Questions?

Di Wu  
di.wu@pnnl.gov