

Exploiting Flexible Loads in Buildings for Renewable Integration

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Environmental Concerns

Future 2050?



Now 2015!

China, Beijing

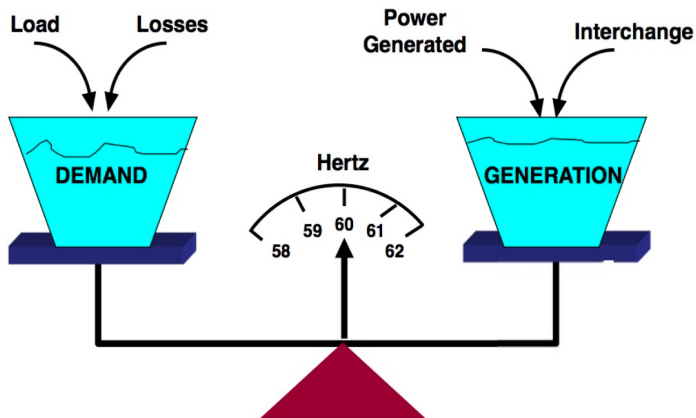


India, Island of Ghorama



A sustainable energy future needs the help from clean renewable energies

Challenge in Power Balance with Renewables



Power balance must be maintained at a second-to-second basis

A Paradigm Shift

- Today: tailor generation to meet uncertain net load
 - decrease generator efficiency
 - diminish net carbon benefit from renewables
 - increase electricity price
- Tomorrow: tailor load to meet uncertain generation
 - reduce generation reserves
 - clean, environmentally friendly
 - fast response
- Enabling ingredient: flexible loads
 - thermostatically controlled loads, energy storages
 - pool pumps, plugin electric vehicles
 - commercial HVAC, refrigeration systems, data centers
- One of the Key Questions:
 - How to characterize their aggregate flexibility in a unified way

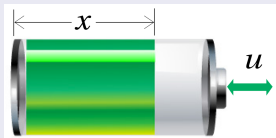
Virtual Battery Model

Definition

A *Virtual Battery Model* \mathbb{B} is a set of signals $u(t)$ that satisfy

$$-N^- \leq u(t) \leq N^+, \quad \forall t > 0,$$

$$\dot{x}(t) = -ax(t) + u(t), \quad x(0) = 0 \Rightarrow C^- \leq x(t) \leq C^+, \quad \forall t > 0.$$



- $u(t)$ as the power input or output
- $x(t)$ as its state-of-charge

The model is specified by the non-negative parameters $\phi = (C^-, C^+, N^-, N^+, a)$, and we write this compactly as $Batt(\phi)$.

- Interpretation of parameters ϕ

parameter	meaning
N^-, N^+	discharge/charge power limits
C^-, C^+	lower/upper energy capacity
a	dissipation rate

Aggregate Flexibility of Flexible Loads

Theorem (Hao, et. al., CDC,'14; Hao, et. al., SmartGridComm, '15)

Consider a collection of **homogeneous** electric vehicles parameterized by $T = (a, d, E, p_m)$. The aggregate flexibility \mathbb{U} of the collection satisfies

$$\mathbb{U} = \text{Batt}(\phi_t)$$

where the parameters ϕ_t of the virtual battery model are given by

$$C_t^- = \sum_{i:d^i < t} E^i + \sum_{i:a^i \leq t < d^i} \max\{E^i - (d^i - t)p_m^i\delta, 0\},$$

$$C_t^+ = \sum_{i:d^i < t} E^i + \sum_{i:a^i \leq t < d^i} \min\{E^i, (t - a^i)p_m^i\delta\},$$

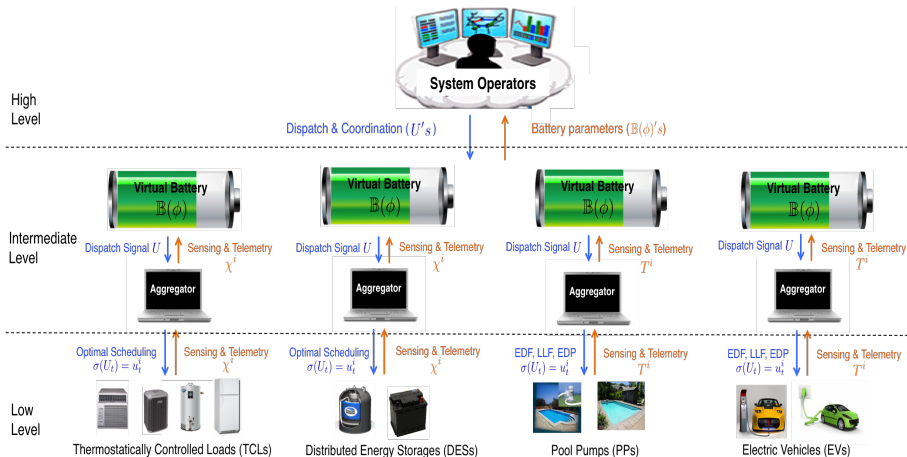
$$N_t^- = 0, \quad N_t^+ = \sum_{i \in \mathbb{A}_t} p_m^i, \quad a_t = 1,$$

where $t \in \{0, 1, \dots, T\}$.

For **heterogeneous** EVs, and other loads, please refer to:

Hao, et. al., CDC,'14; Hao, et. al., tech report,'15, Hao, et. al., TPS, '15;

A Generalized Aggregate and Coordination Architecture



Conclusions

- We developed a virtual battery model to aggregate the flexibility of various classes of loads
- We proposed a unified aggregation and coordination framework for flexible loads

Future Work

- Design attractive incentives to engage customers for demand response
- Quantify the value of virtual battery (flexible loads) and compare it with real battery

References

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Thank you very much for your time!