

# **Contract-based Emergency Demand Response Participation of Multi-tenant Colocation Data Center**

**Presenter: Kishwar Ahmed**

Advisor: Dr. Jason Liu



**FIU**

School of Computing &  
Information Sciences

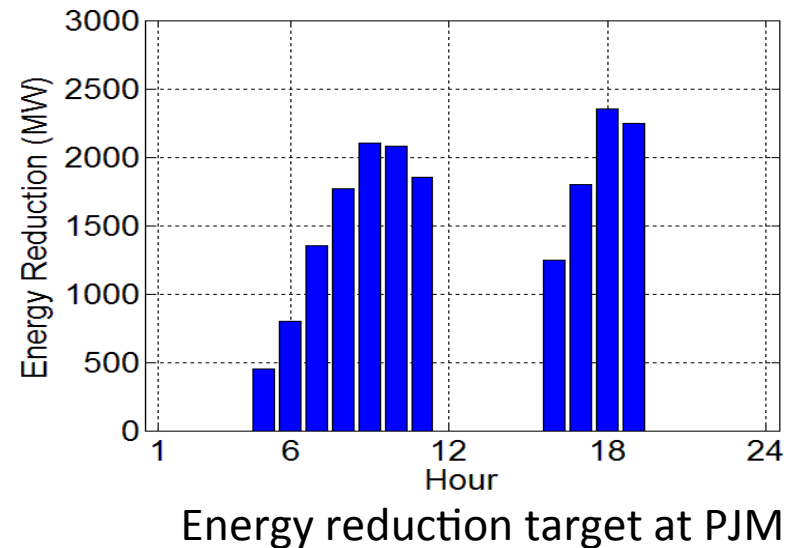
# **MOTIVATION AND BACKGROUND**

# Demand Response (DR)

- Customers reduce power consumption
- Demand response getting popular
  - Some reports
    - Current: **180%** increase in demand response from 2010 to 2012 in Baltimore Gas and Electric
    - Future: DR participation to **double** in 2020

# Emergency Demand Response (EDR)

- Ensures reliability during emergency period
- A recent EDR example:
  - Extreme cold in beginning of January 2014
  - Closure of electricity grid
  - EDR in PJM and ERCOT



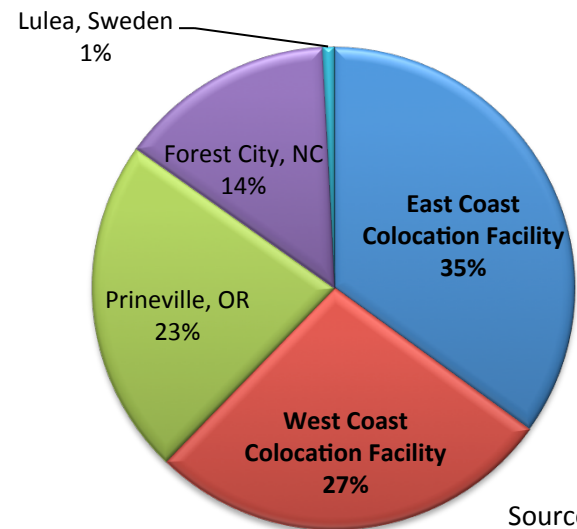
# Colocation data center

- Multi-tenant data center
- Colocation vs. owner-operated data center
  - Colocation
    - **Tenants** control servers
  - Owner-operated
    - **Data center operator** controls both servers and supporting system

# Colocation data center (Contd.)

- A popular option to small and medium businesses (SMBs)
  - Universities, hospitals, enterprises
- Large-scale companies
  - E.g., VMware, Facebook

Facebook's energy usage: 2012



Source: Facebook

# Some numbers...

- 64% of organizations utilize data center colocation services
- Revenue of colocation increasing 9.4% every year
- Colocations in New York collectively consume 400MWs of power
  - Comparable to google's global data center power demand

# LITERATURE REVIEW



# Related work

- Optimization of data center resources exploiting ancillary services by utility (e.g., [1])
  - **Owner-operated** data center
- Multi-tenant colocation demand response ([2, 3])
  - Requires **complex** bidding mechanism
  - Subject to tenants **cheating behavior**

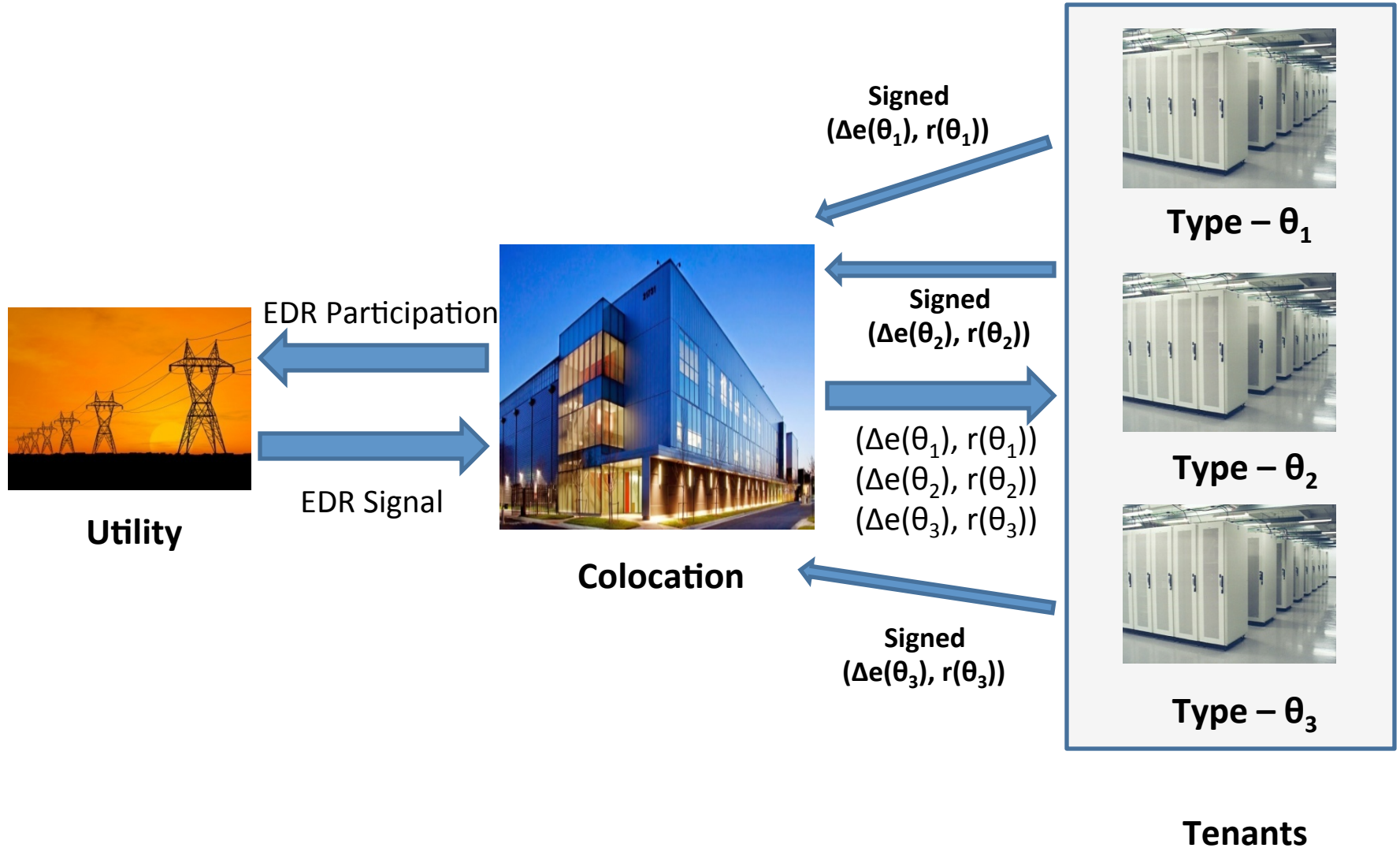
**Our contribution: We propose an **easily-implementable contract-based** mechanism for **target** energy reduction in **emergency demand response** program for **colocation data center****

[1]. M. Ghamkhari and H. Mohsenian-Rad, "Data centers to offer ancillary services," in *Smart Grid Communications (SmartGridComm)*, 2012 IEEE Third International Conference on. IEEE, 2012, pp.436–441.

[2]. L. Zhang, S. Ren, C. Wu, and Z. Li. *A Truthful Incentive Mechanism for Emergency Demand Response in Colocation Data Centers*, in *Infocom 2015*.

[3]. Chen, Niangjun, Xiaoqi Ren, Shaolei Ren, and Adam Wierman. "Greening Multi-Tenant Data Center Demand Response.", in *IFIP Performance*, 2015

# Model overview



# **PROBLEM FORMULATION AND ALGORITHM**

# Objective and constraints

- Objective: Minimize total cost

$$\min_{(\Delta e(\theta_i), r(\theta_i))} \sum_{\theta_i \in \Theta} m_{\theta_i} \times r(\theta_i) + \alpha \times e_b$$

–  $m_{\theta_i}$  denotes number of tenants of type- $\theta_i$

- Constraint 1: Colocation should achieve **target energy reduction** ( $\Delta e_{th}$ )

$$\gamma \times \sum_{\theta_i \in \Theta} m_{\theta_i} \times \Delta e(\theta_i) + e_b = \Delta e_{th}$$

# Objective and constraints (Contd.)

- Constraint 2: Individual Rationality (IR)
  - Participants achieve **non-negative pay-off**

$$r(\theta_i) - v(\theta_i, \Delta e(\theta_i)) \geq 0$$

- Constraint 3: Incentive Compatibility (IC)
  - Tenant **chooses its own type** to maximize utility

$$r(\theta_i) - v(\theta_i, \Delta e(\theta_i)) \geq r(\theta_i') - v(\theta_i, \Delta e(\theta_i'))$$

# Two cases

- Contract design with **complete** information
  - Colocation operator has **complete knowledge** of type of each tenant

$$\min_{(\Delta e(\theta_i), r(\theta_i))} \sum_{\theta_i \in \Theta} m_{\theta_i} \times r(\theta_i) + \alpha \times e_b$$

s.t., IR, IC and energy reduction constraints

# Two cases (Contd.)

- Contract design with **incomplete** information
  - Colocation operator **lacks information** of tenant's type distribution

$$\min_{(\Delta e(\theta_i), r(\theta_i))} \sum_{\theta_i \in \Theta} E[m_{\theta_i} \times r(\theta_i) + \alpha \times e_b \mid \{m_{\theta_i}\}_{\theta_i \in \Theta}]$$

s.t., IR, IC and energy reduction constraints

- $\{m_{\theta_i}\}_{\theta_i \in \Theta}$  denotes distribution of tenants to different types

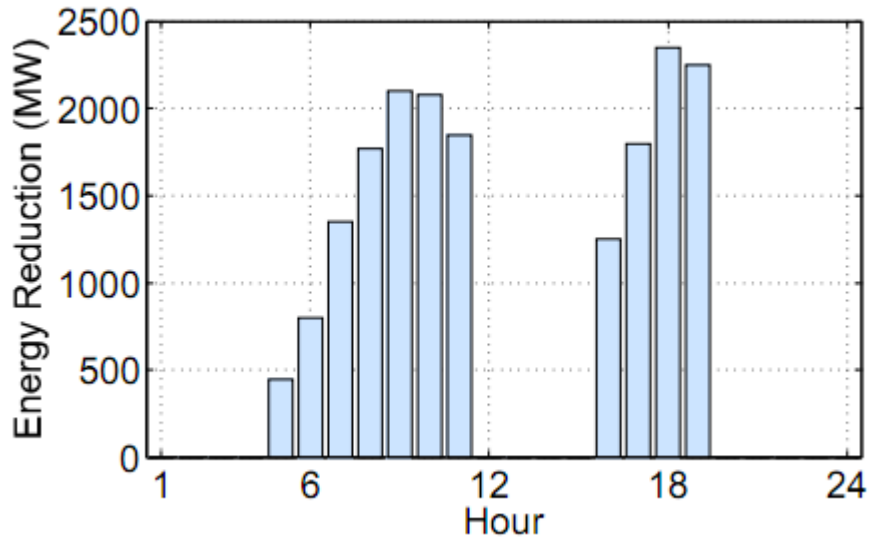
# Algorithm and theorem

- **Algorithm:** We use exhaustive search algorithm to find optimal solution (also considered in [4])
- **Theorem:** The designed contracts minimize the colocation operator's cost while satisfying both IR and IC constraints
  - The proof follows through mathematical induction

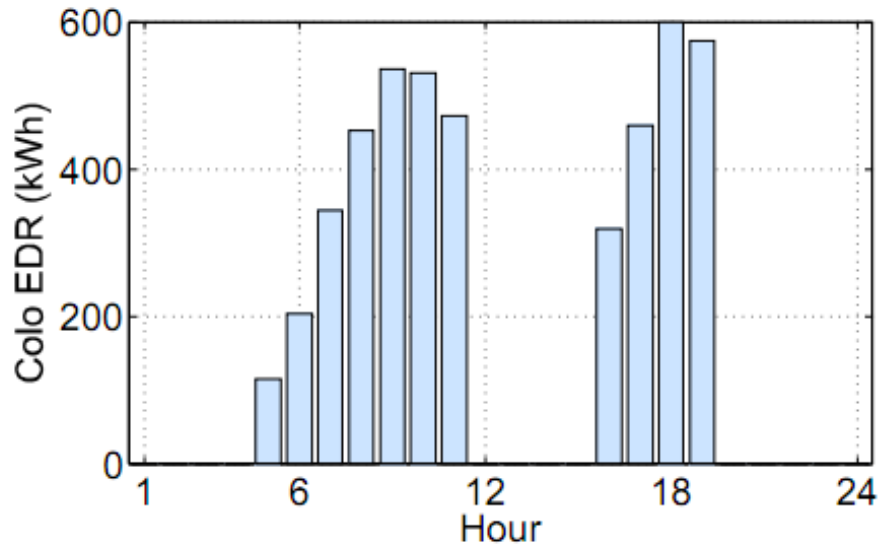


# VALIDATION

# Energy reduction target

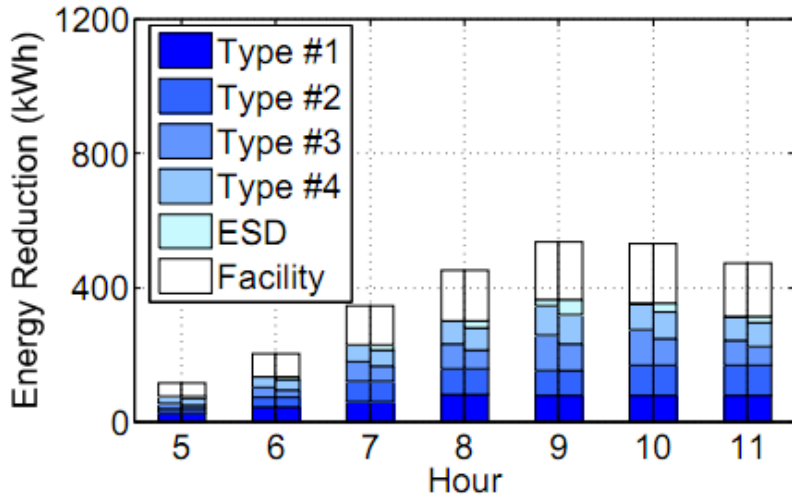


**(a) Energy reduction target at PJM on January 7, 2014**

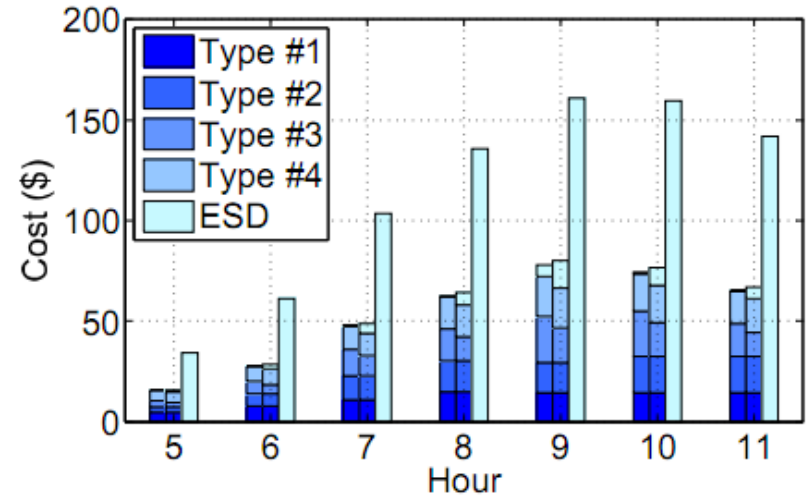


**(b) Scaled energy reduction target at colocation**

# Results



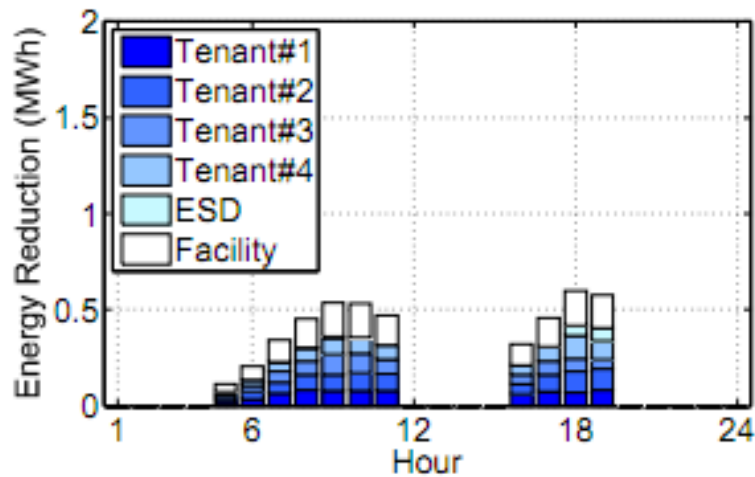
(a)



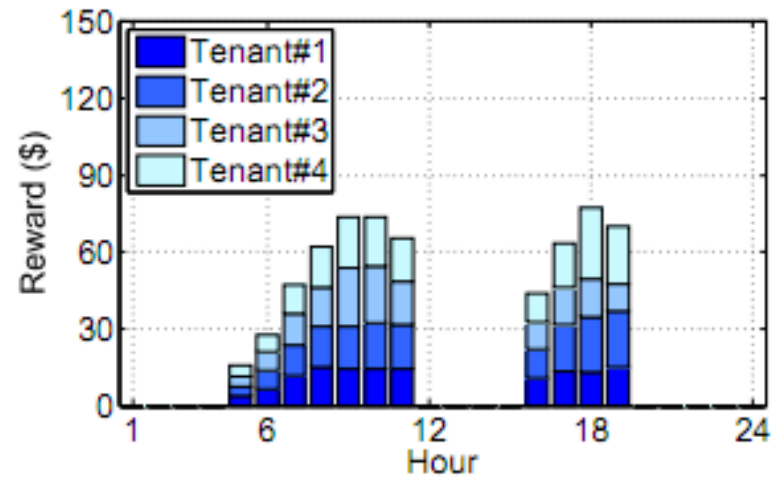
(b)

Achieve **target** energy reduction at much **lower** cost!

# Results (Contd.)



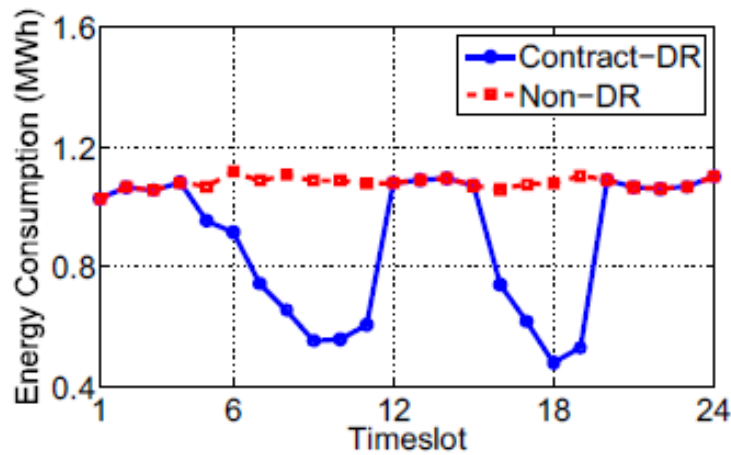
(a)



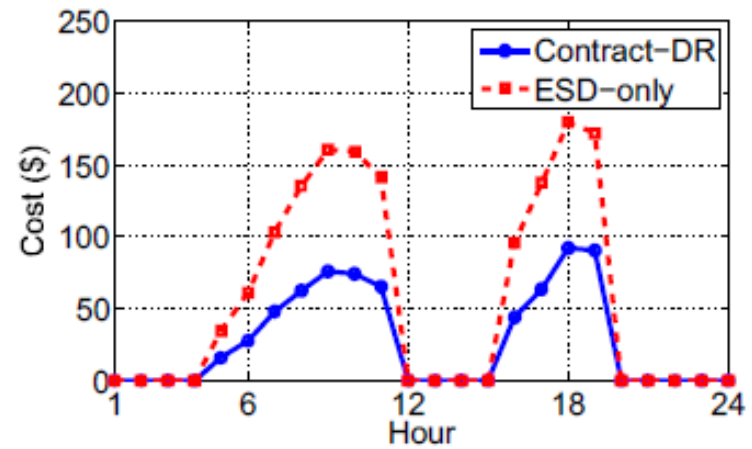
(b)

Tenants also receive **reward** for EDR participation!

# Results (Contd.)



(c)



(d)

**Comparison with non-demand response approach**

# Conclusions

- Studied
  - Colocation emergency demand response
- Proposed
  - Contract-based incentive mechanism
    - Achieves target energy reduction
    - Rewards tenants
- Trace-based simulation study
  - To validate Contract-DR

Questions?

# **BACKUP SLIDES**



# Colocation model

- Energy reduction by tenant of type- $\theta_i$

$$\Delta e(\theta_i) = n_{\theta_i} \times e_{0, \theta_i} \times T$$

- $n_{\theta_i}$  denotes number of servers turned-off
- Energy Storage Device (ESD)
  - To assist tenants in achieving energy reduction
  - Discharge amount:  $e_b$
  - ESD discharge cost:  $\alpha$  per kWh

# Tenant utility

- Tenant's inconvenience cost

$$v(\theta_i, \Delta e(\theta_i)) = \xi_{\theta_i} \times c(\Delta e(\theta_i))$$

- $\xi_{\theta_i}$  denotes cost of energy reduction

- $c(\Delta e(\theta_i))$  denotes a general cost function of energy reduction

- Tenant's utility

$$u(\theta_i, \Delta e(\theta_i)) = r(\theta_i) - v(\theta_i, \Delta e(\theta_i))$$

- $r(\theta_i)$  denotes reward awarded to tenant of type- $\theta_i$