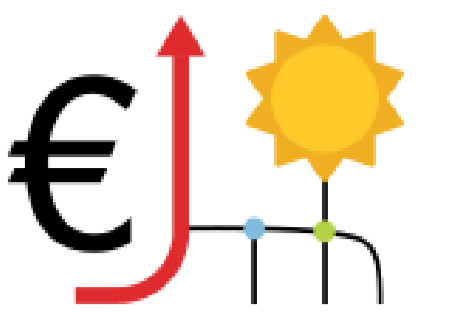


Teaming and Competition for Demand-Side Management in Office Buildings

Appeared at IEEE SmartGridComm'17, Dresden, Germany

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The Problem

- Significant fraction of electricity consumed by the services sector (29.8%) (source European Environment Agency (2017))
 - Key part comprises office buildings
- User consumption behavior is key factor to be addressed, yet a **tricky** one
- Multiple factors that influence energy-consumption behavior, and decisions in general – Behavioral Economics try to explain people's behaviors

Our Objectives

- 1) Change "bad" energy-consumption behaviors at work context
We employ a **serious-game approach** to maximize user engagement
- 2) Maximize game **potential effectiveness** in a **sustainable way**
Optimize game parameters
Maximize energy conservation at the lowest cost for achieving it
- 3) Investigate potential effectiveness of our game in real settings

The approach

We employed Behavioral Economics (BE), specifically:

- Sensitivity to loss of personal comfort
- Normative social influence
- Desire for teaming
- Mobilization by means of rewards

The Game Setup

- Team competition based on energy-saving performance
- Team scores build on individual performance
- Teams receive a reward that depends on their rank
- Individual performance Δp_i for employee i

User's Problem: How should I play?

User utility maximization based on four components:

- Personal discomfort $d_i(\Delta p_i)$
- Societal advantages from conforming to social norms $s_i(\Delta p_i, \Delta p_{-i})$
- Desire for teaming $t(|G_j|)$, $|G_j|$ is size of team j
- Mobilization through rewards $r_i(\Delta p_i, \Delta p_{-i})$

Game Designer's Problem

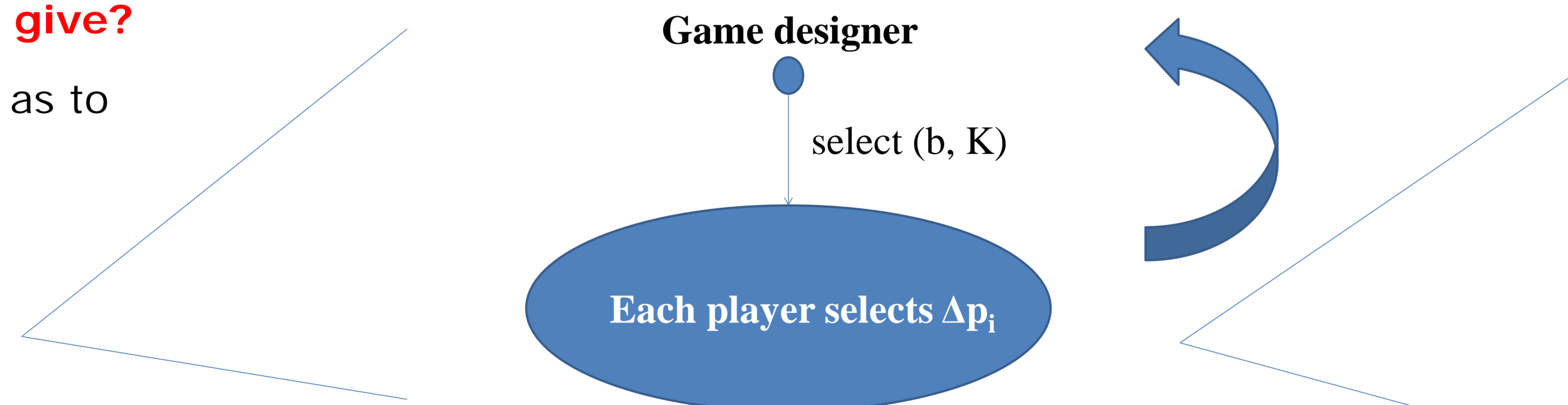
How to split teams and what rewards to give?

Select rewards \vec{b} and number of teams K , so as to maximize total net savings of the building:

$$\max_{\vec{b}, K} \sum_{i \in N} p_i^0 \Delta p_i(\vec{b}, K) - B$$

where $B = \sum_k b_k$

Stackelberg Game Setting



Competitive Gameplay

Employee i chooses Δp_i so as to: $\max_{\Delta p_i} u_i(\Delta p_i, \Delta p_{-i})$

$$\text{where: } u_i(\Delta p_i, \Delta p_{-i}) = \frac{1}{3} (s_i(\Delta p_i, \Delta p_{-i}) + t_i(|G_j|) + r_i(\Delta p_i, \Delta p_{-i})) - d_i(\Delta p_i)$$

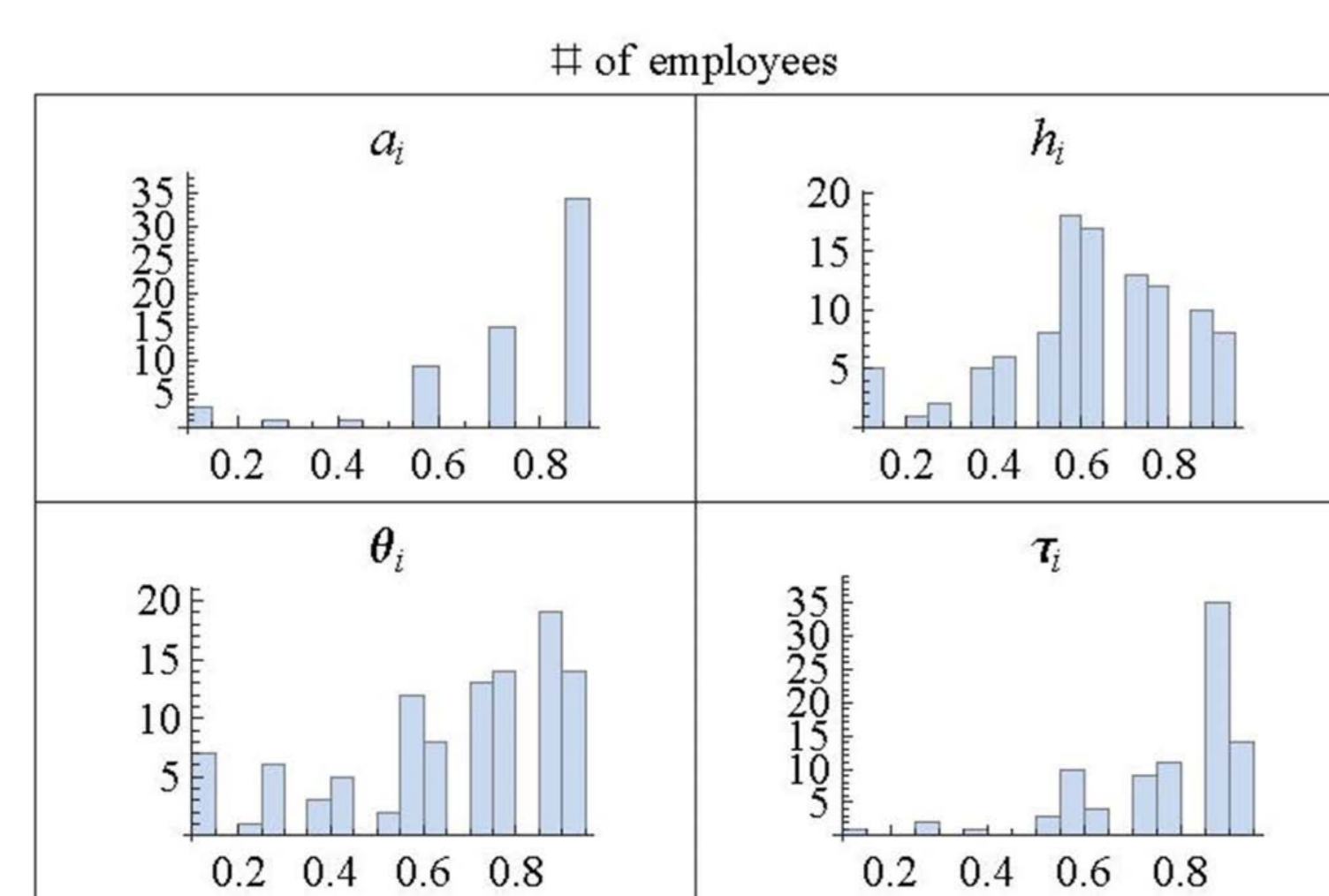
Any competitive equilibrium leads to Pareto-efficient allocation point

Results

Evaluation Setup

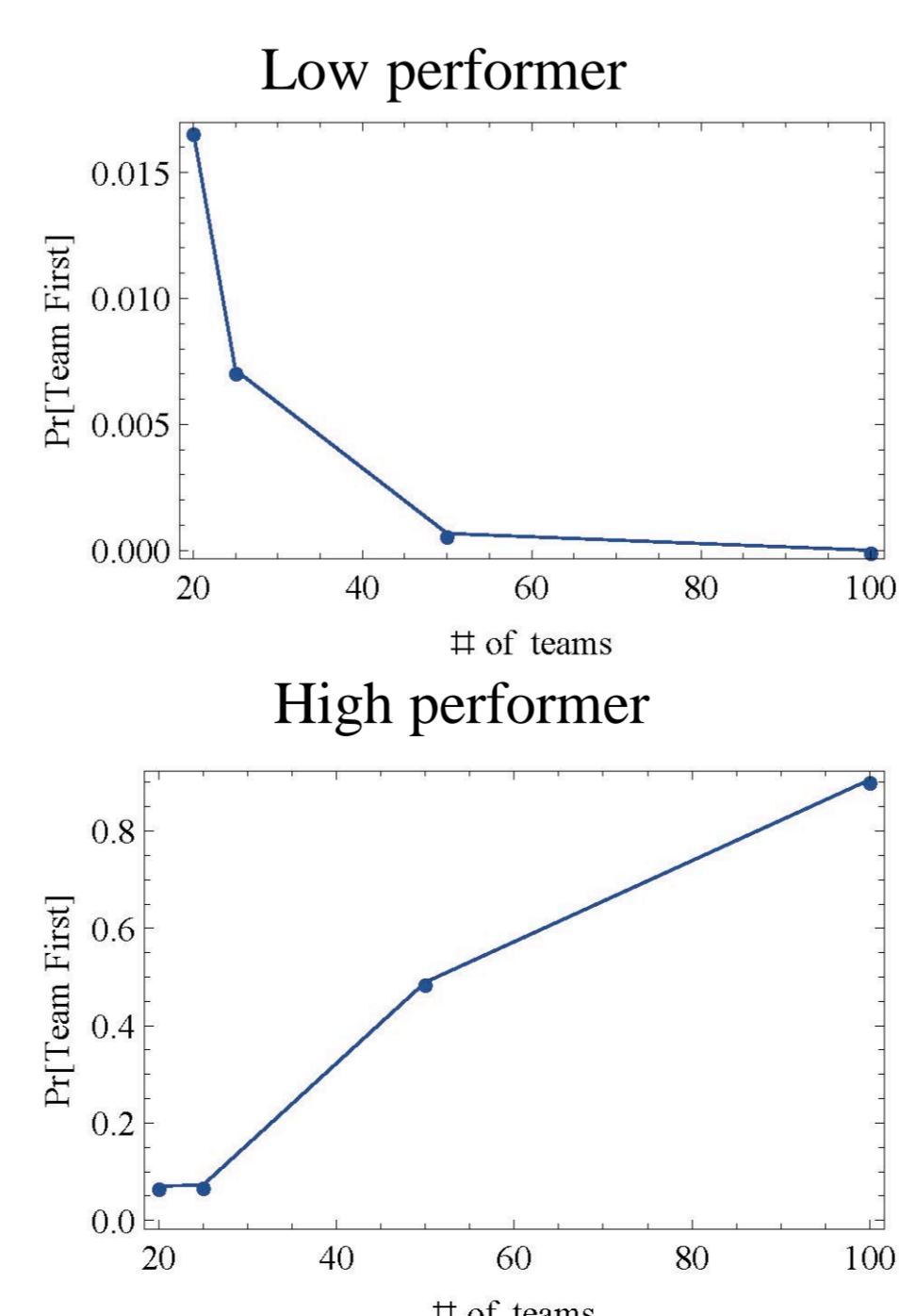
- Real dataset: $N=100$ random out of 115 employees at 3 pilot sites
- Reward b is given to each member of the first team only
- Normal-like prior distribution of individual performance
- Δp_i in $\{0, 0.2, 0.4, 0.6, 0.8, 1\}$
- $p_i^0=1$ for all employees

Real Dataset: Behavioral Traits



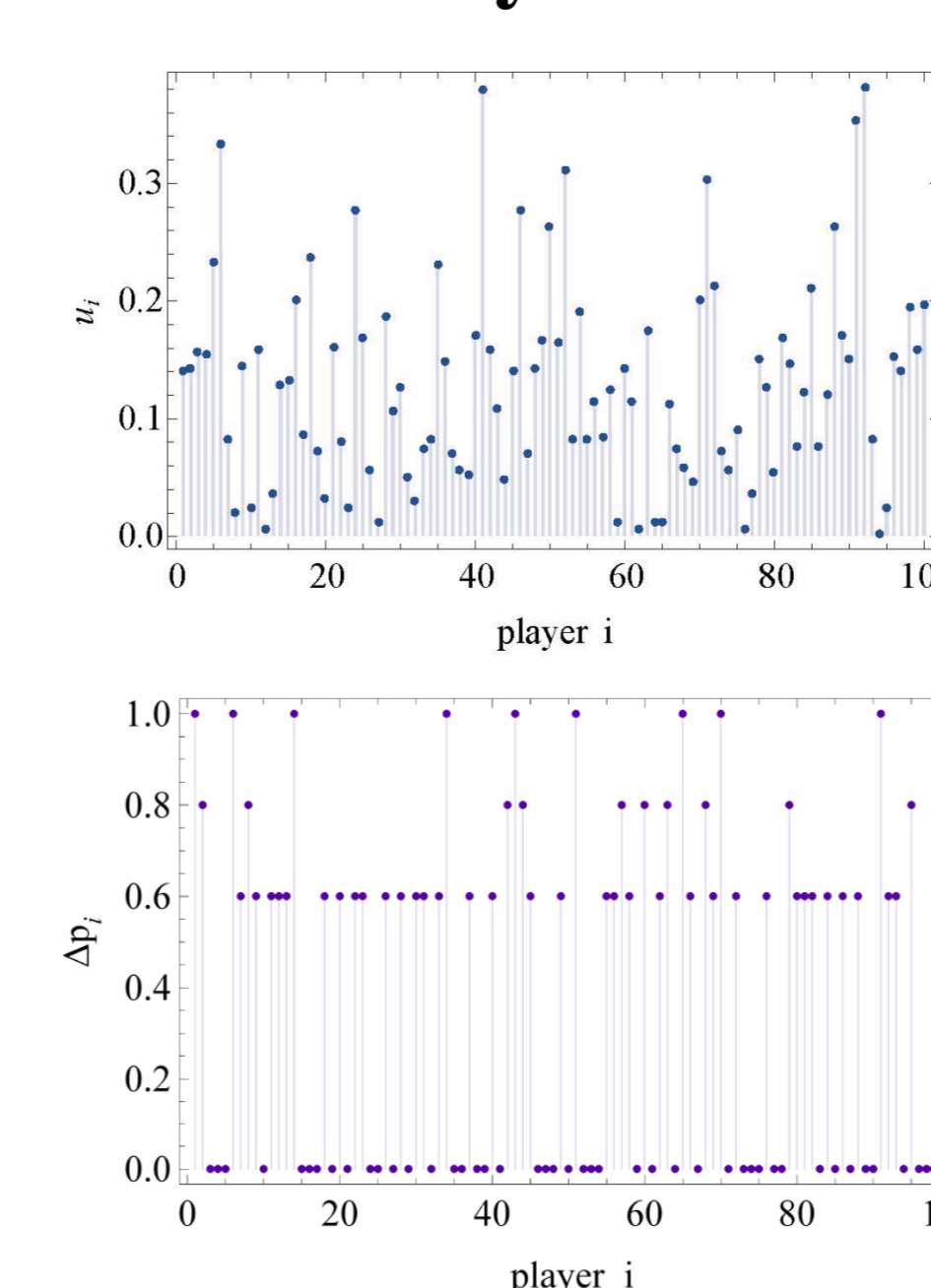
Based on an online survey at 3 office sites

Prob. to be first vs. Team size



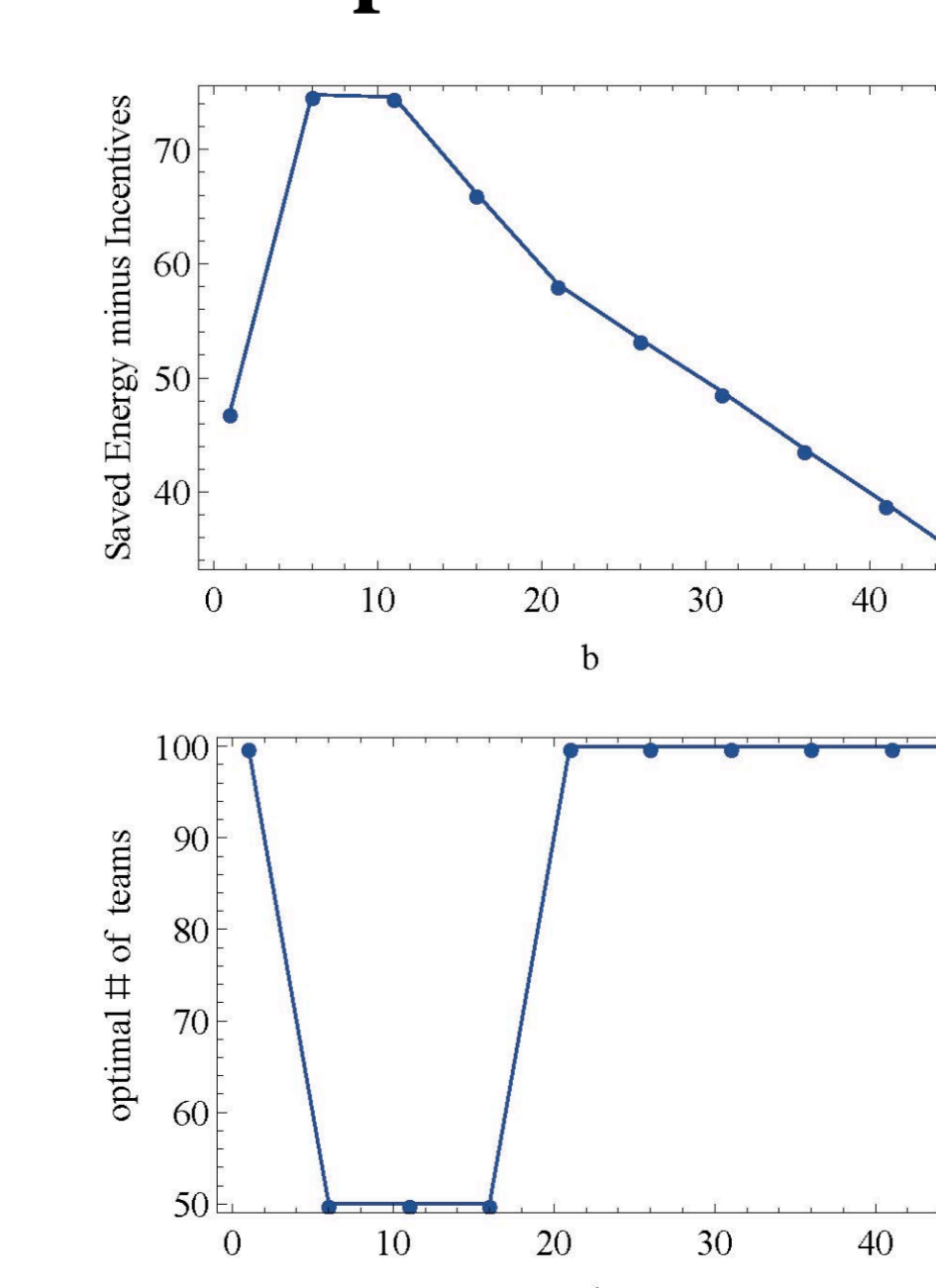
Low performers prefer **big teams**, high performers prefer **playing alone**

User Utility Maximization



38 KWh saved out of 100 at equilibrium for $K=50, b=1$

Game Parameters Optimization



Optimal $K=50, b=6$

Conclusions

- We showed that the number of teams and the amount of rewards play significant role on the effectiveness of this game setting for energy conservation
- As a future work, we intend to investigate bounded demand elasticity, optimal reward allocation and a more detailed user-utility model