



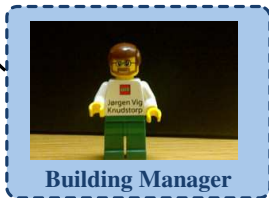
# Incentive Design for S-CPS: A Social Game for Energy Efficiency

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joint with Roy Dong, Henrik Ohlsson, Ming Jin, Ioannis Konstantakopoulos, Sam Burden, and S. Shankar Sastry  
UC Berkeley



# Incentive Design in Energy Systems: A social game



Light Group B

Target: 90.0%

Brighten



22.0%

Other Votes

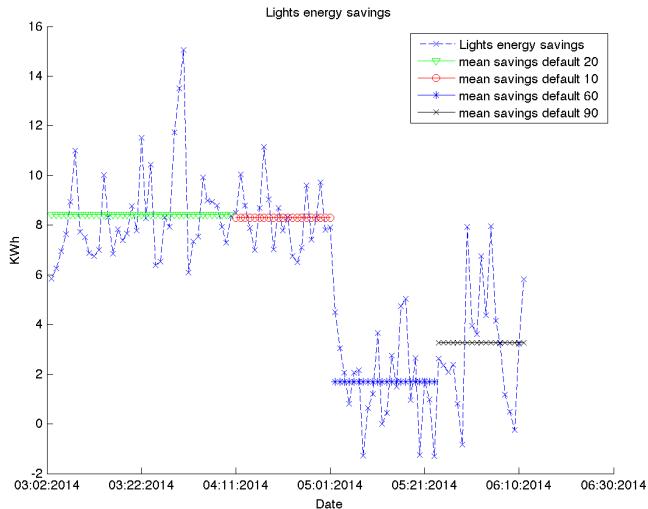
Dim

occupant  
votes



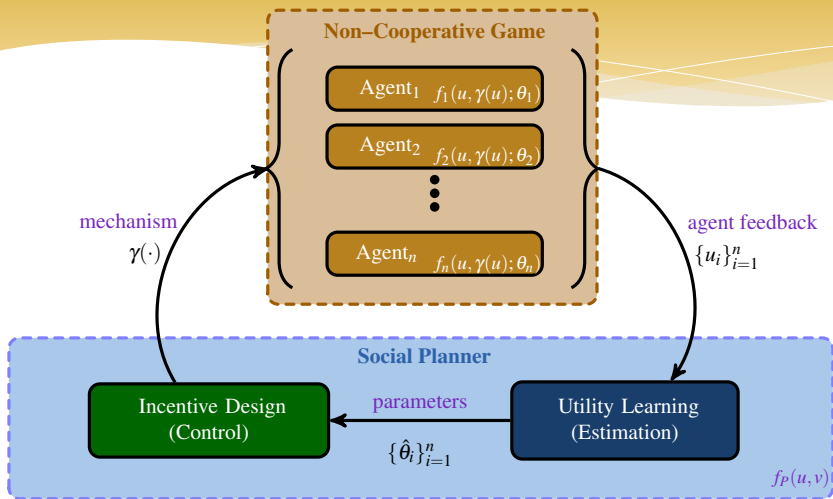
Source: Lego

# Social Game for Energy Savings – Energy Consumption



- ▶ Over the 100 day period, there is a savings of \$70-\$90 depending on price of energy.

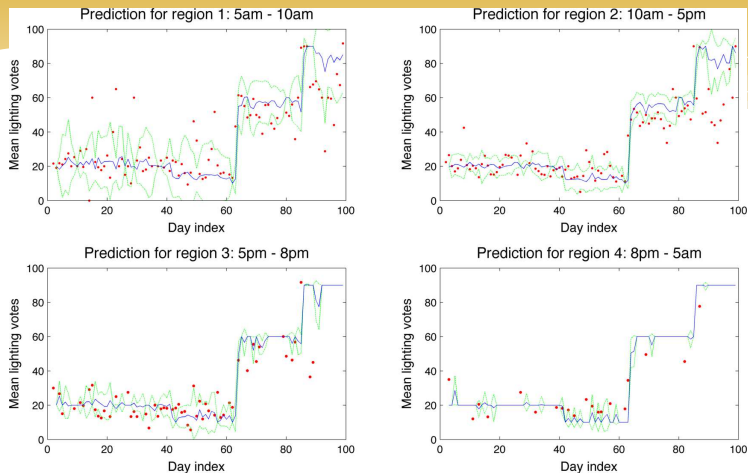
# A Game Theoretic Framework for Societal Scale CPS



Ratliff, Burden, Sastry. Characterization and Computation of Local Nash Equilibria in Continuous Games. Allerton 2013.

Ratliff, Burden, Sastry. Genericity and Structural Stability of Non-Degenerate Differential Nash Equilibria. ACC 2014.

# Social Game for Energy Savings – Estimation and Simulation



Blue: Mean of estimated Nash, Red: ground truth, Green: 1-std dev. of the estimated mean

<i>Model</i>	ARIMA(1,0,1)	Nash	Constant	Persistent
<i>MSE</i>	13.9183	<b>12.4561</b>	16.9585	13.4247

# Social Game for Energy Savings – Future and On-going Work

- ▶ We are in the process of implementing an online utility learning and incentive design algorithm.
- ▶ In addition, we are currently deploying instrumentation that allows us to implement what amounts to a DLC scheme in the office (we can turn on/off large consuming devices at occupants desks).
- ▶ We are designing contracts to be offered to the occupants in which they select when they need power to their devices.

Ratliff, Dong, Ohlsson, Sastry, Incentive Design and Utility Learning via Energy Disaggregation. IFAC 2014.

Konstantakopoulos, Ratliff, Jin, Spanos, Sastry. Social Game for Building Energy Efficiency: Utility Learning, Simulation and Analysis. (Submitted) GameSec 2014.

Ratliff, Jin, Konstantakopoulos, Spanos, Sastry. Social Game for Building Energy Efficiency: Closing the Loop via Incentive Design. (In Prep) Allerton 2014.