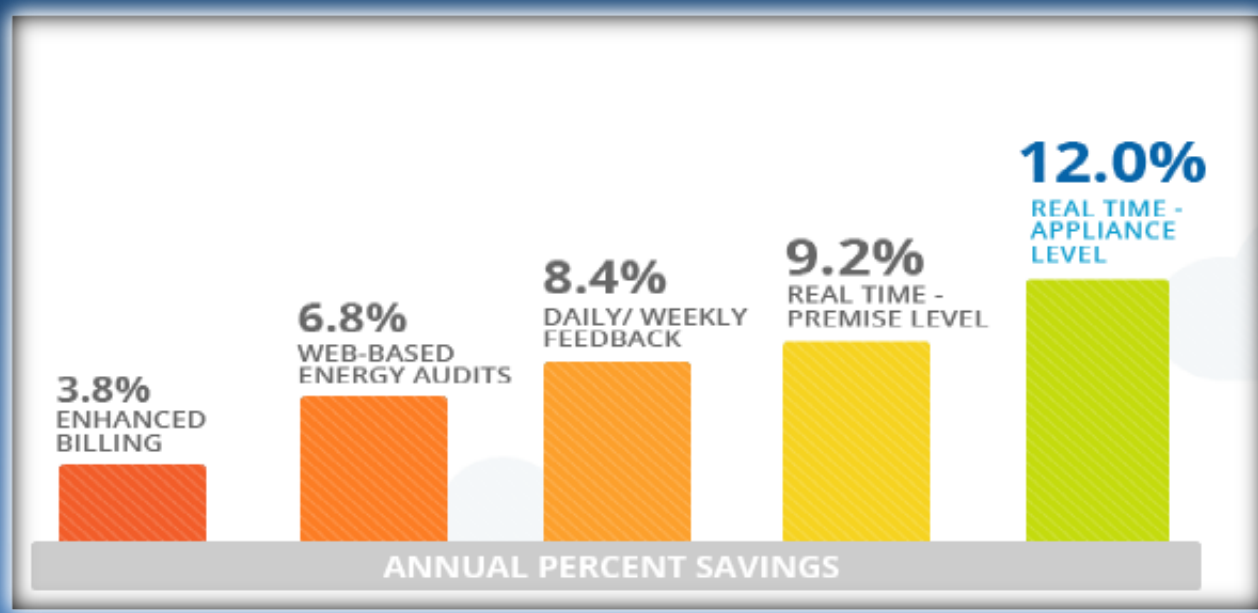


## Motivation

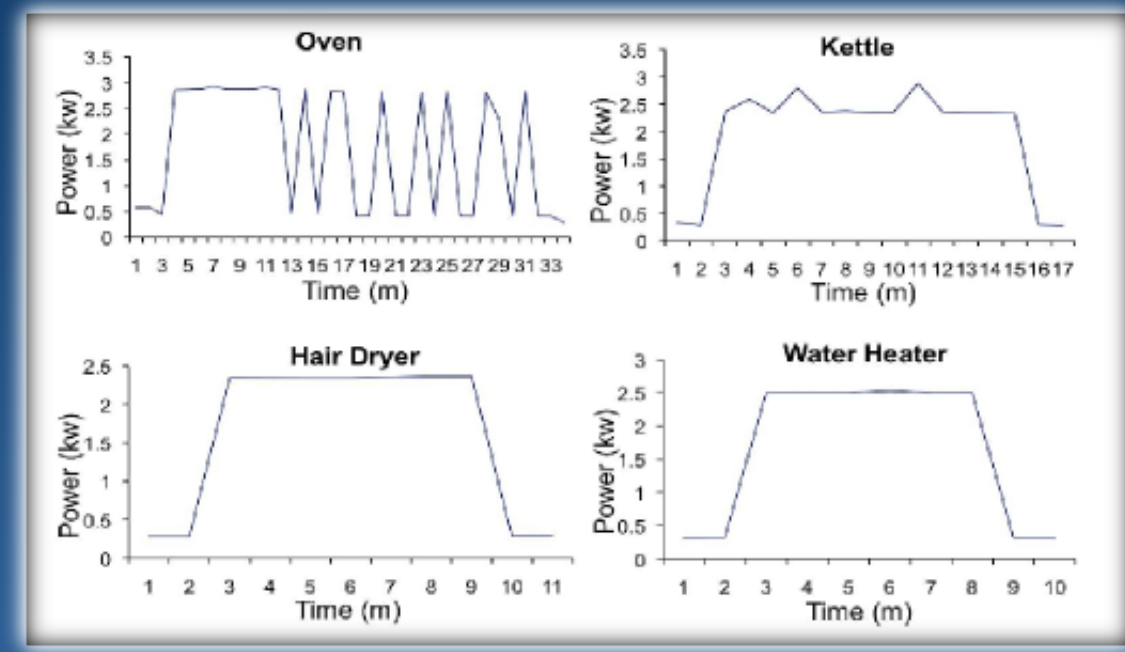
Real time appliance level information can save upto 12% energy annually  
Instrumenting each appliance

- \* Costly (Proportional to # appliances)
- \* Intrusive
- \* Difficult for loads such as lighting



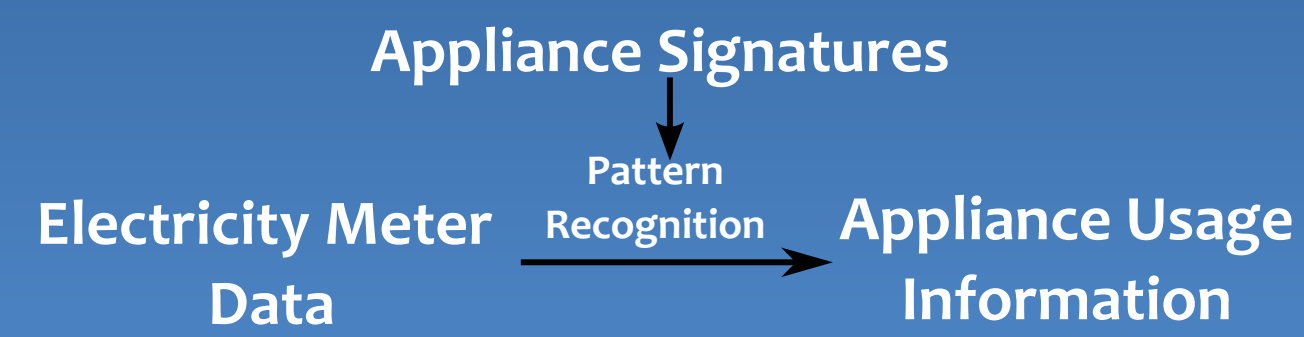
## Appliance Signatures

Each appliance has a unique power signature  
Pattern recognition techniques can be used to find appliance usage from meter level data



## Problem Definition

"Analyzing changes in the power going into a house to deduce what appliances are used in the house"

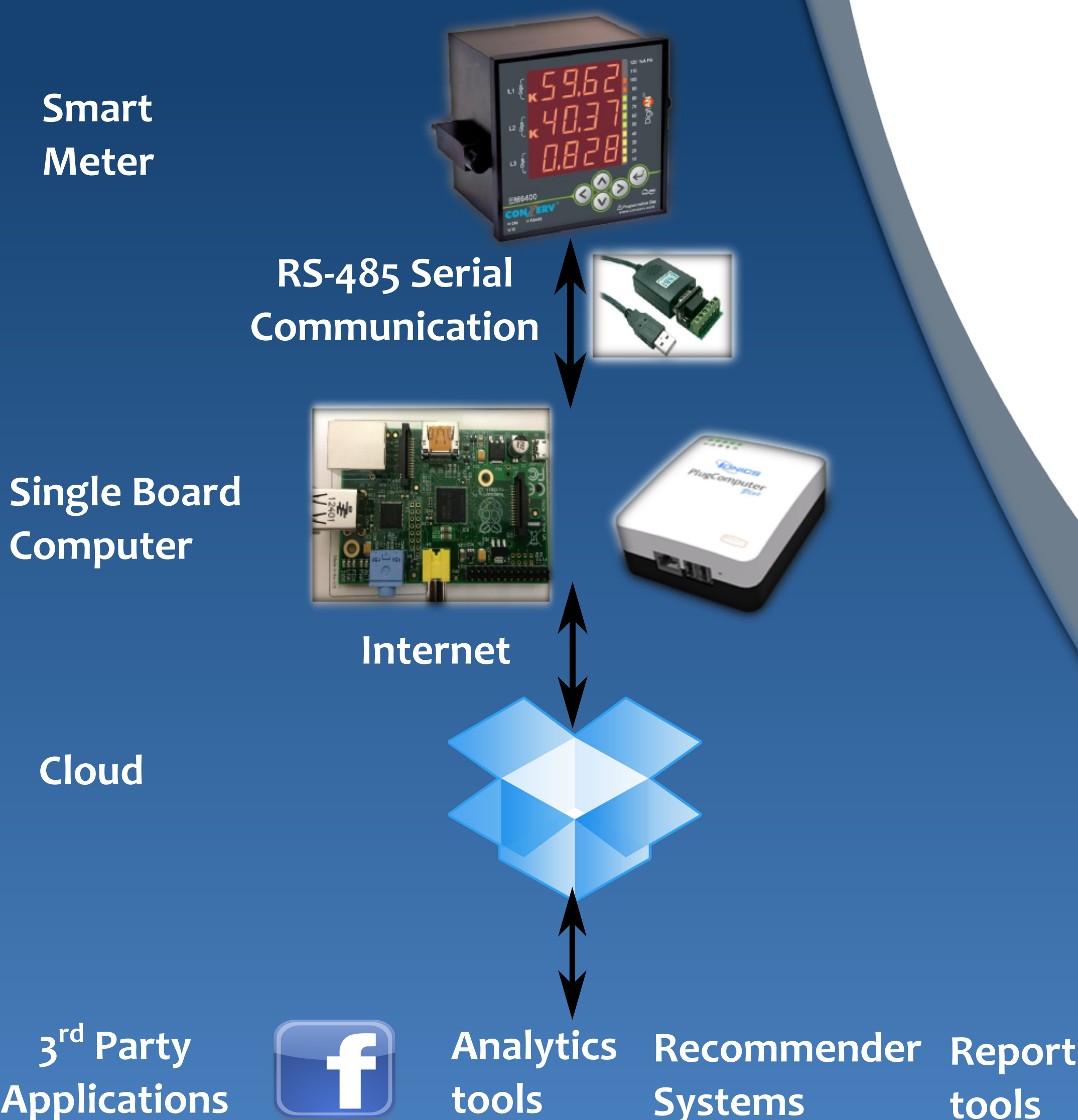


# Non Intrusive Load Monitoring

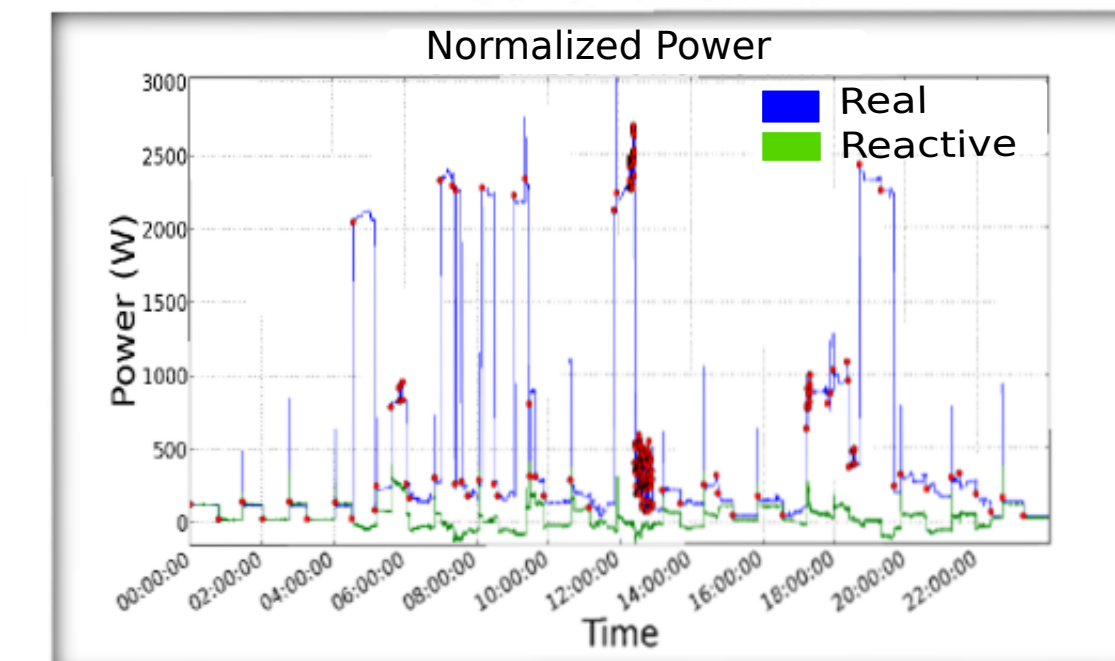
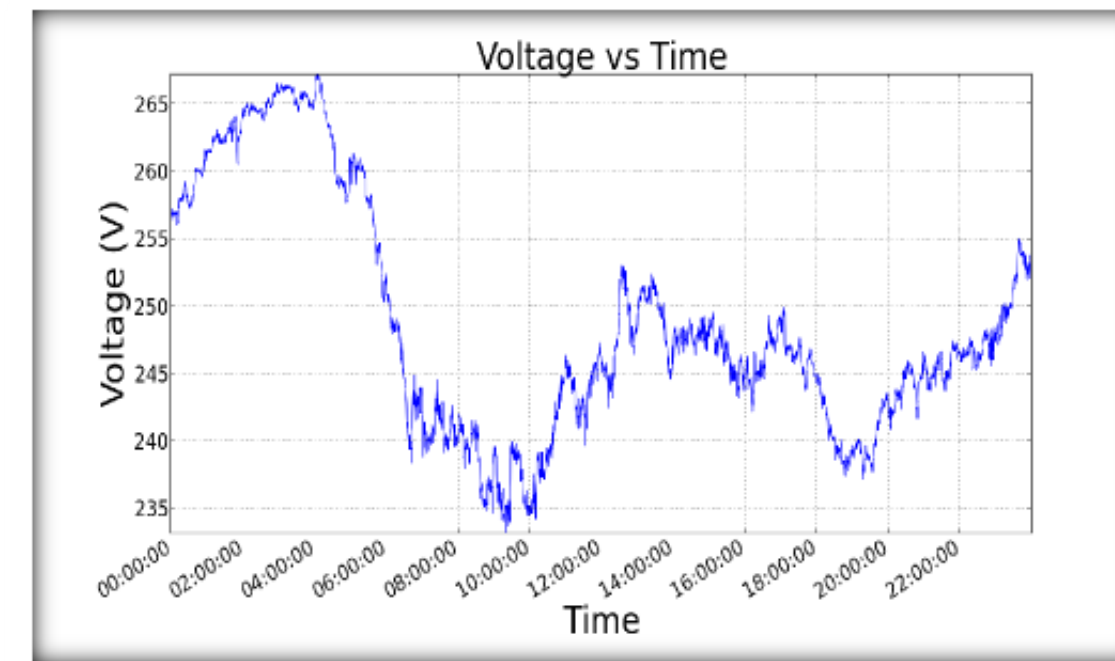
Nipun Batra<sup>1</sup> Ishaan Malhotra<sup>2</sup> Amarjeet Singh<sup>1</sup> Haimonti Dutta<sup>3</sup>

<sup>1</sup> IIT Delhi <sup>2</sup> DTU <sup>3</sup> CCLS Columbia

## System Architecture

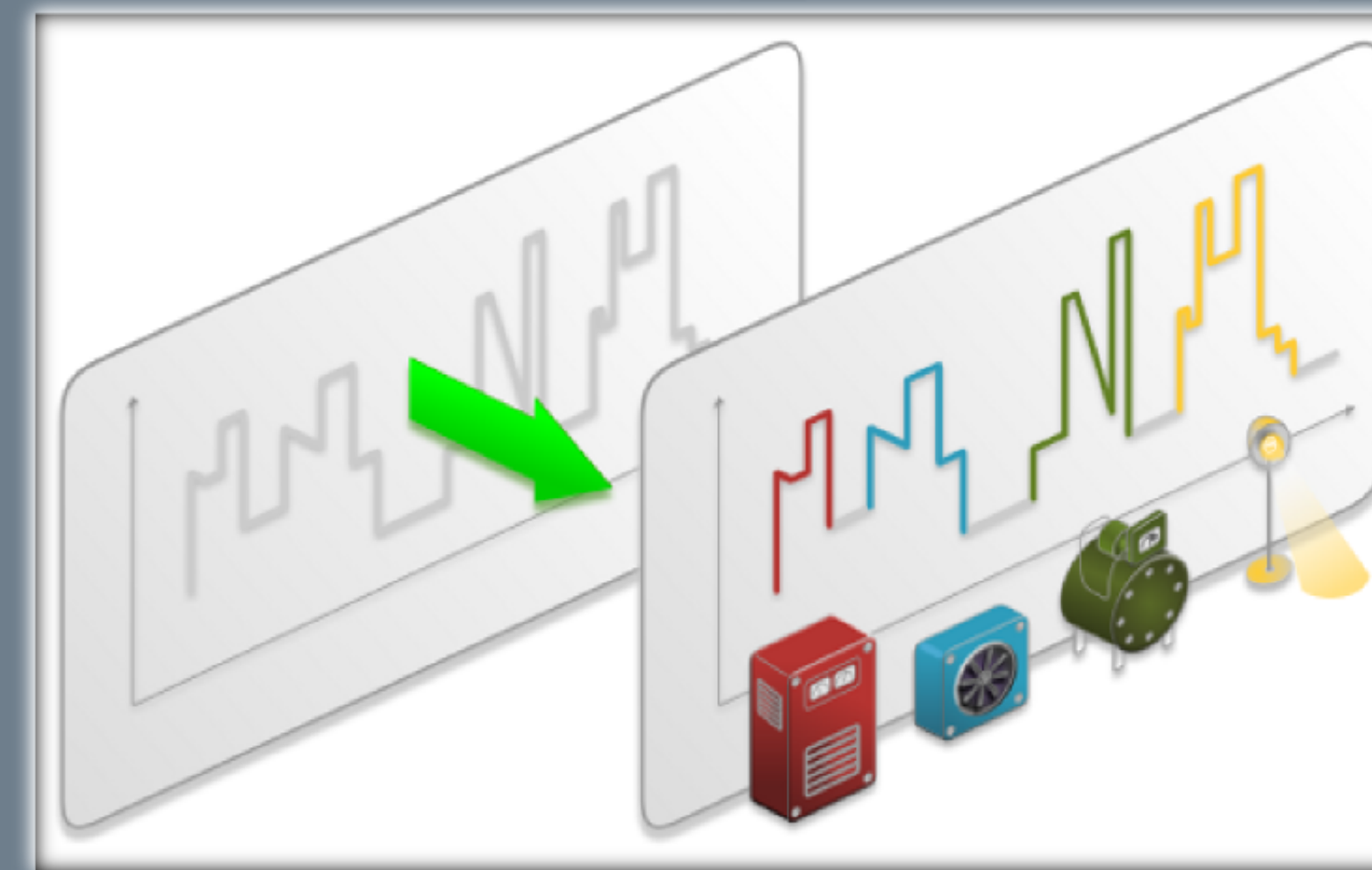
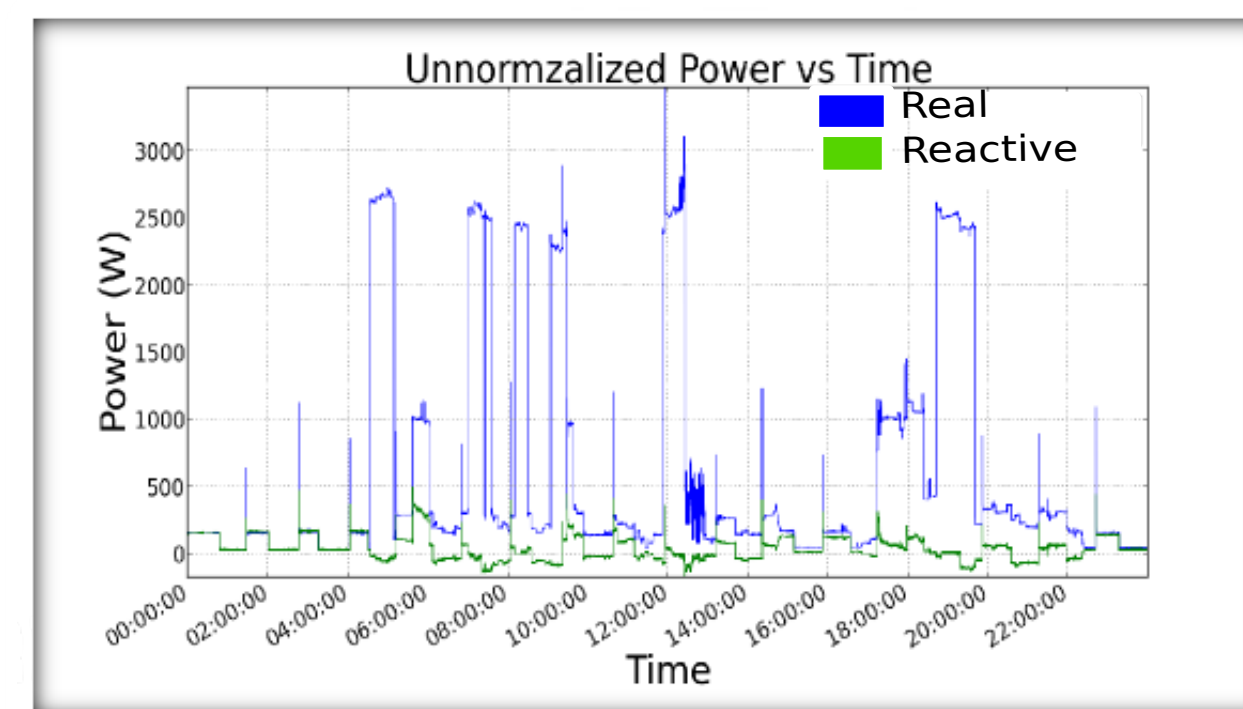


## Data Preprocessing

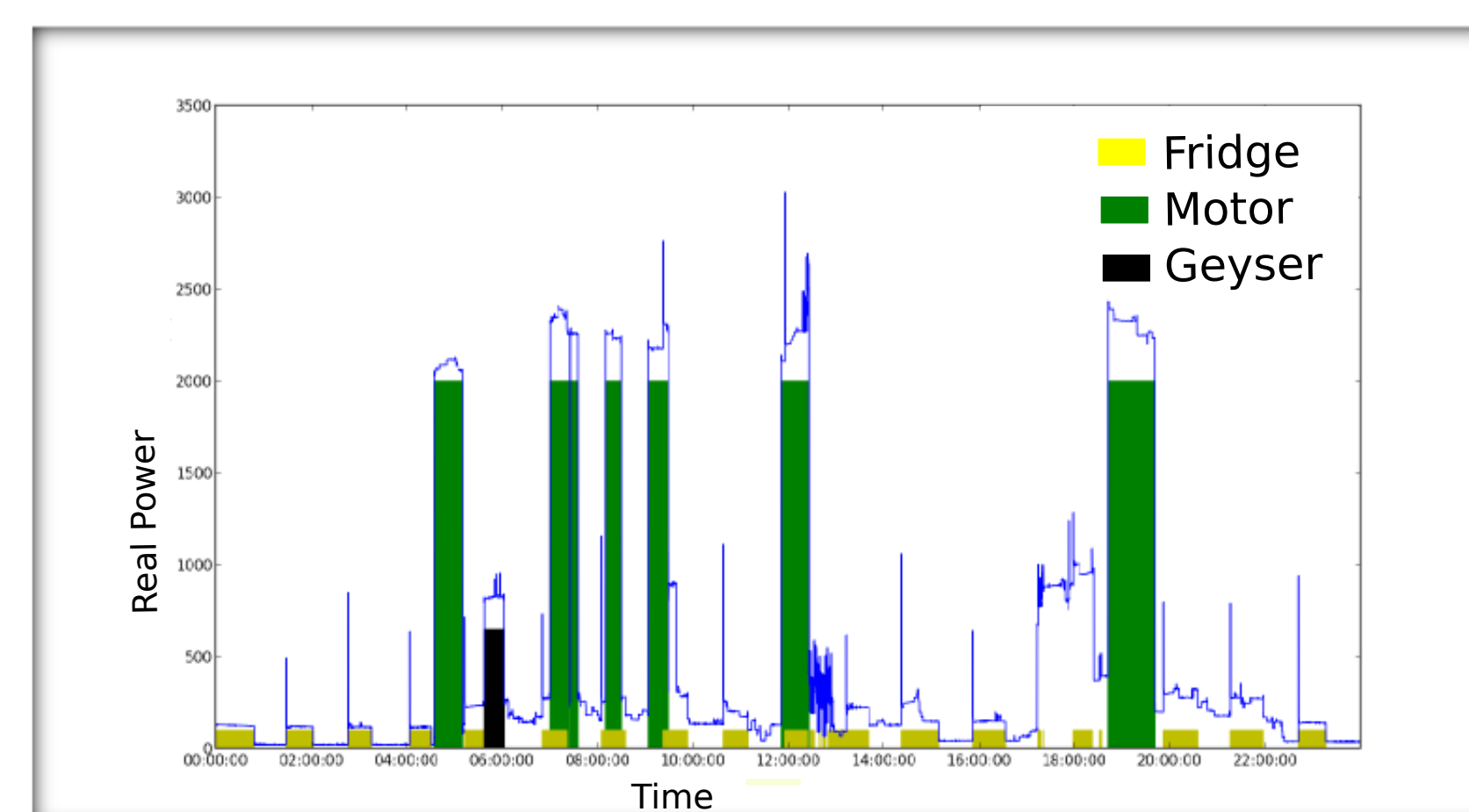


$$P_{norm} = P_{raw} \cdot \left(\frac{230}{V}\right)^2$$

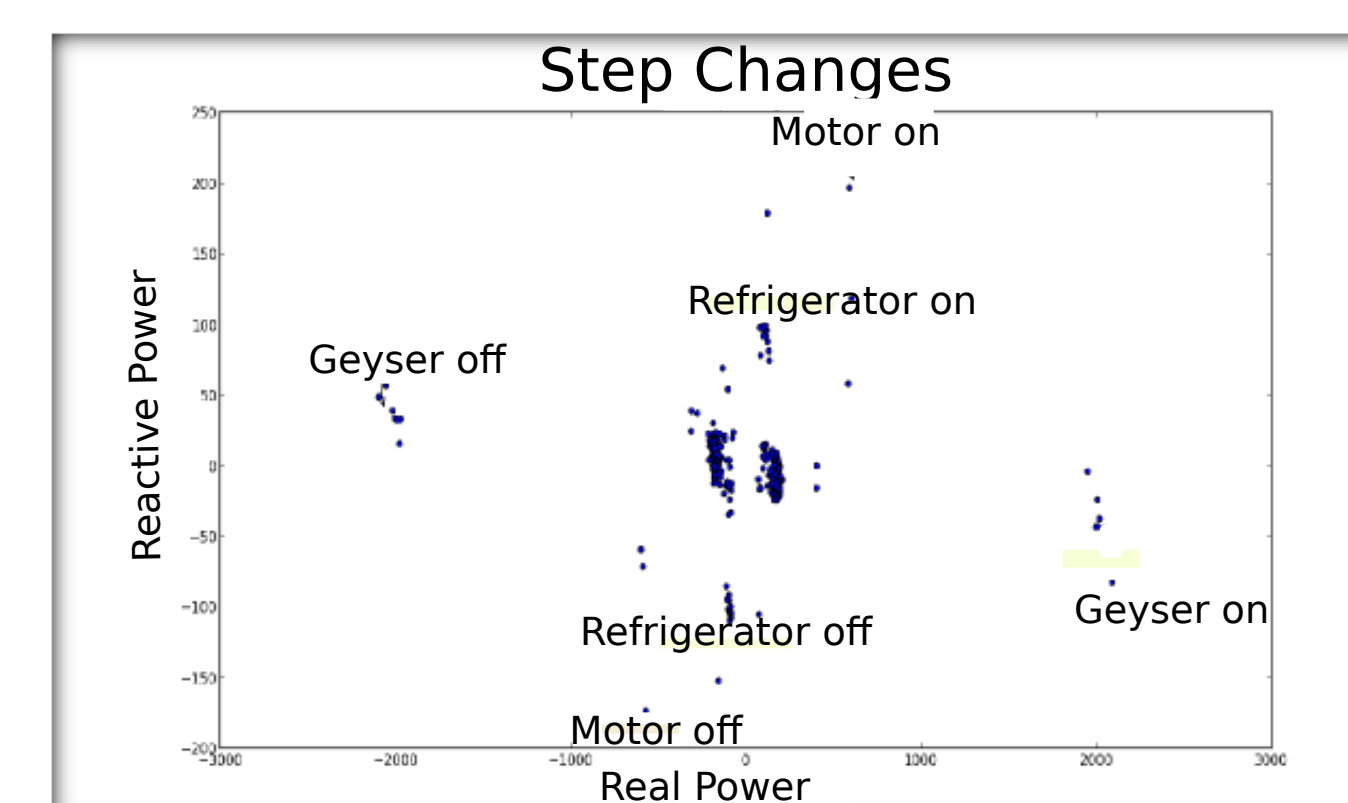
## Raw Power Plot



## Disaggregated Appliance wise Power Consumption

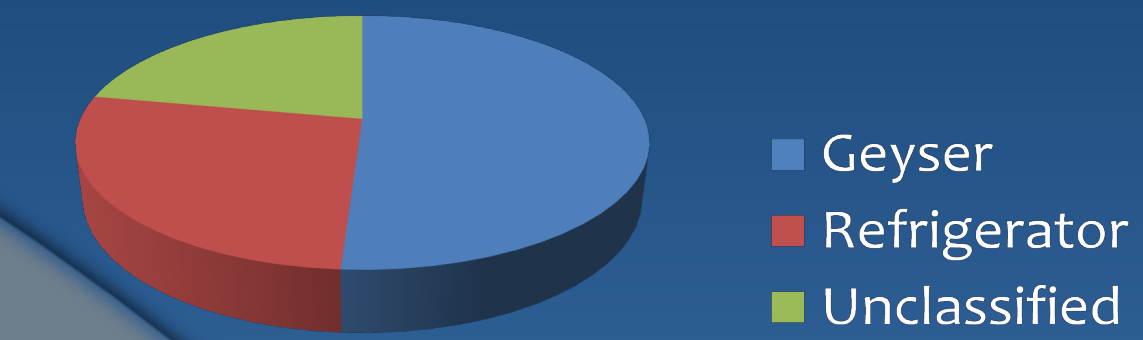


## Appliance Step Change Manual Annotation

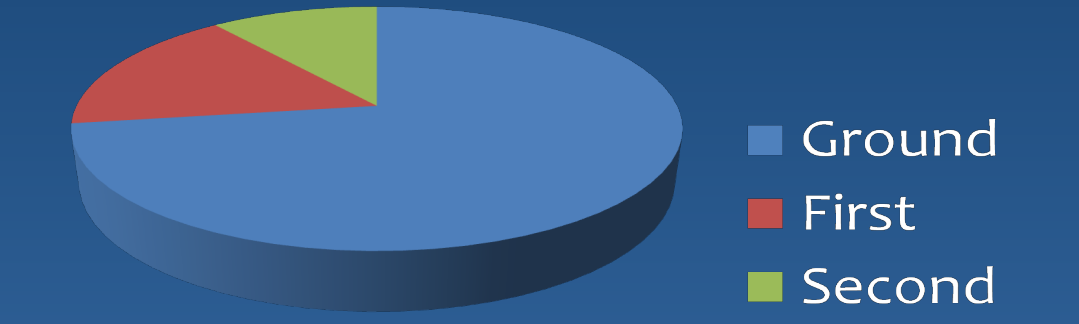


## Insights

### Home 1: Power Breakdown



### Home 1: Floor-wise Power Breakdown

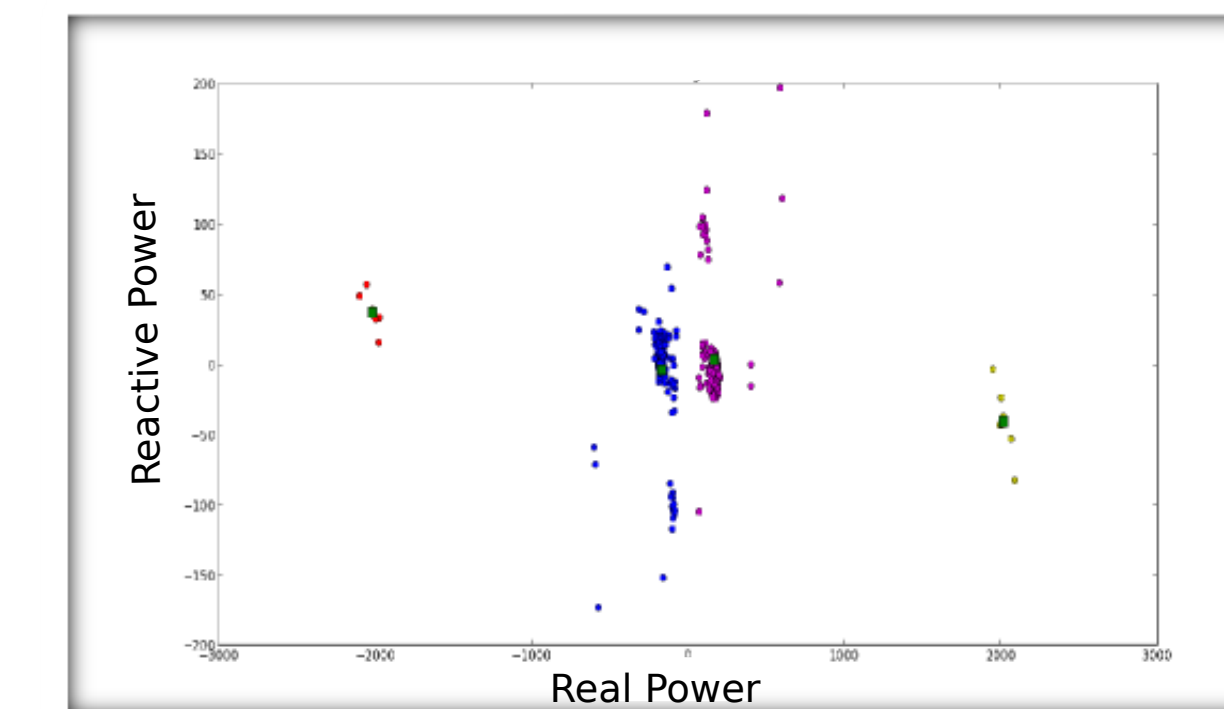


### Monthly Cost

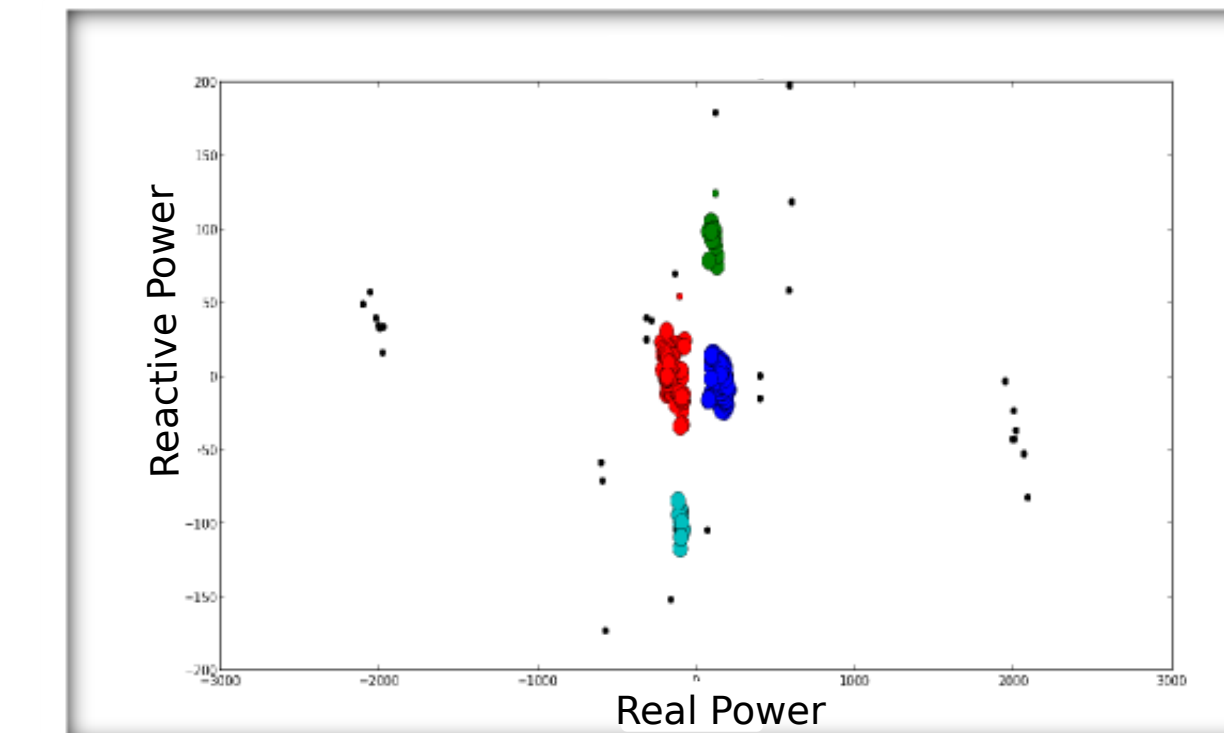
Refrigerator: Rs. 120  
Geyser : Rs. 720

## Appliance Step Change Clustering

### KMeans



### DBScan



## Applications

### Recommendations

"You can save 3 trees from getting cut if you replace your washing machine with a more energy efficient one."

### Fault Detection



### Load Shifting

"Peak demands result in higher transmission losses."

Small reduction in peak usage significantly reduce overall costs.

## Future Work

### Richer Feature set:

- \* Certain appliances likely to be on at certain times of day/season- Using appliance temporal dynamics
- \* Certain appliances likely to be used together- Modeling coupling amongst appliances

Distributed data analysis: Imperative given "big" and "distributed" nature of problem

Using customized Probabilistic Graphical Models to factor dependencies

## Acknowledgements

Work supported by DEITY under Indo-US joint collaboration