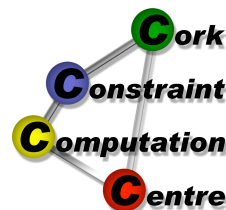


Automated Energy Usage Optimization for the Residential Sector: Impact of Price Tariffs

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Motivation

- Energy consumption in residential sector accounts for significant proportion of national usage.
- Ireland (2008):
 - 32% of total energy usage
 - 44% of thermal energy usage
- Influx of electric vehicles will increase consumption in residential sector.

Motivation

- Utilities can influence user behavior.
- Time-variable pricing tariffs to reduce peak demand.
 - Time-of-use Pricing (*TOUP*)
 - Real-time Pricing (*RTP*)
- **Problem:** User often unable to react to price changes.

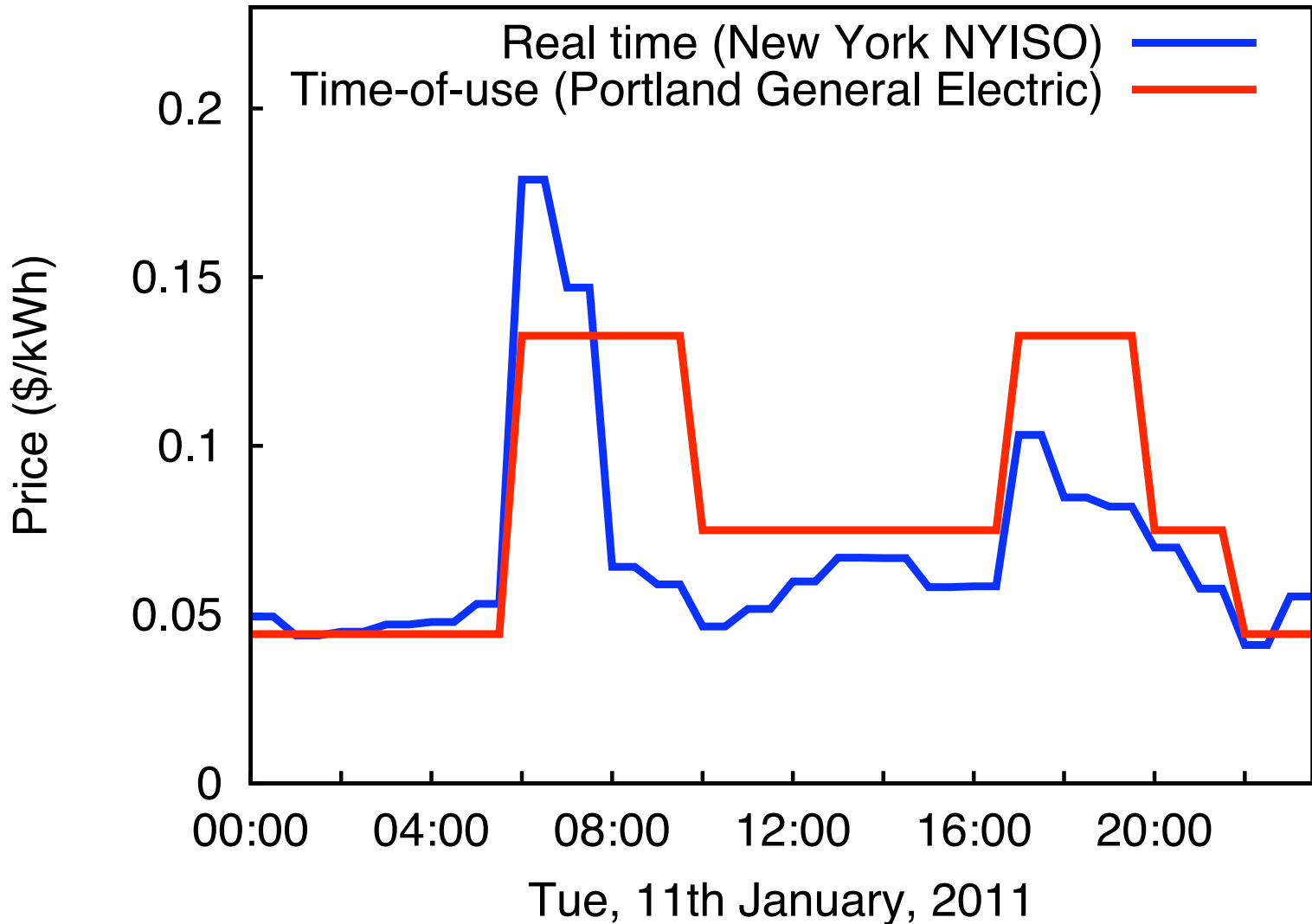
Motivation

- Home Energy Management System (*HEMS*)
 - Automate usage of flexible energy consumption appliances in the home.
 - Optimize scheduling w.r.t. cost and user comfort.
- Benefits:
 - **User** – Reduction in electricity costs, contribution to environment.
 - **Utility** – Reduction in peak energy usage; more balanced demand.
 - **Environment** – Large-scale, carbon-intensive, generators required less.

Time-Variable Pricing Tariffs

- Time-of-use Pricing
 - Fixed for duration of contract => customer aware.
 - Price based on season, day of week, and time of day.
 - Day divided into blocks: On-peak, off-peak, shoulder.
- Real-time Pricing
 - “Pay what it costs.”
 - Price based on actual price of electricity in the market at the time point.
 - User does not have advance knowledge of costs, but maximum price charged may be capped.

Time-Variable Pricing Tariffs



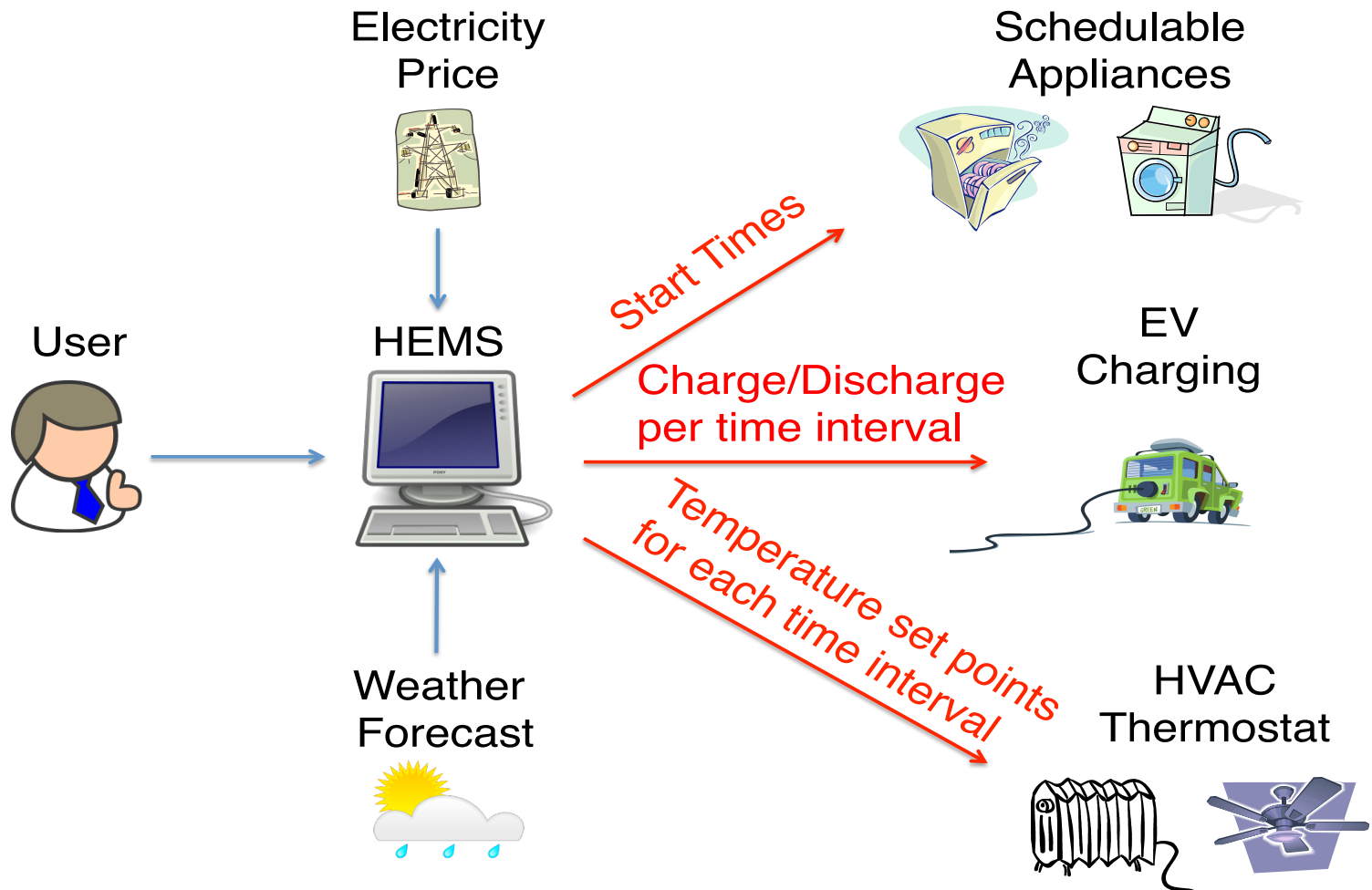
Home Energy Management System

- Fixed horizon discretized into n time intervals (e.g. 24 hour horizon, 30 min time slots).
- Flexible home energy consumers:
 - Electric Vehicle (with vehicle-to-grid capability).
 - HVAC.
 - Schedulable appliances, e.g. dishwasher, washing machine.

Home Energy Management System

- User requests (can be learnt over time):
 - EV - Departure time and required state-of-charge.
 - HVAC - Temperature set points for certain time periods.
 - Schedulable Appliances – Time windows, preferred start time.

Home Energy Management System



Home Energy Management System

- Schedulable appliances: Start time
- For each time interval
 - EV: Charge/discharge power \longrightarrow battery state
 - HVAC: Heating/cooling power \longrightarrow temperature

Home Energy Management System

- User comfort:
 - Difference between requested and actual indoor temperature for time periods.
 - Difference between requested and actual start time of schedulable appliances.
- Penalty function of the form:

$$\sum_i a * \text{Max}(0, x_{i,user} - x_{i,actual}) + b * \text{Max}(0, x_{i,actual} - x_{i,user})$$

Home Energy Management System

- Multi-objective optimization:
Minimize energy cost over the fixed horizon,
while maximizing user comfort.
- Modeled using Mixed Integer Programming.
- CPLEX solver.

Real-time price data

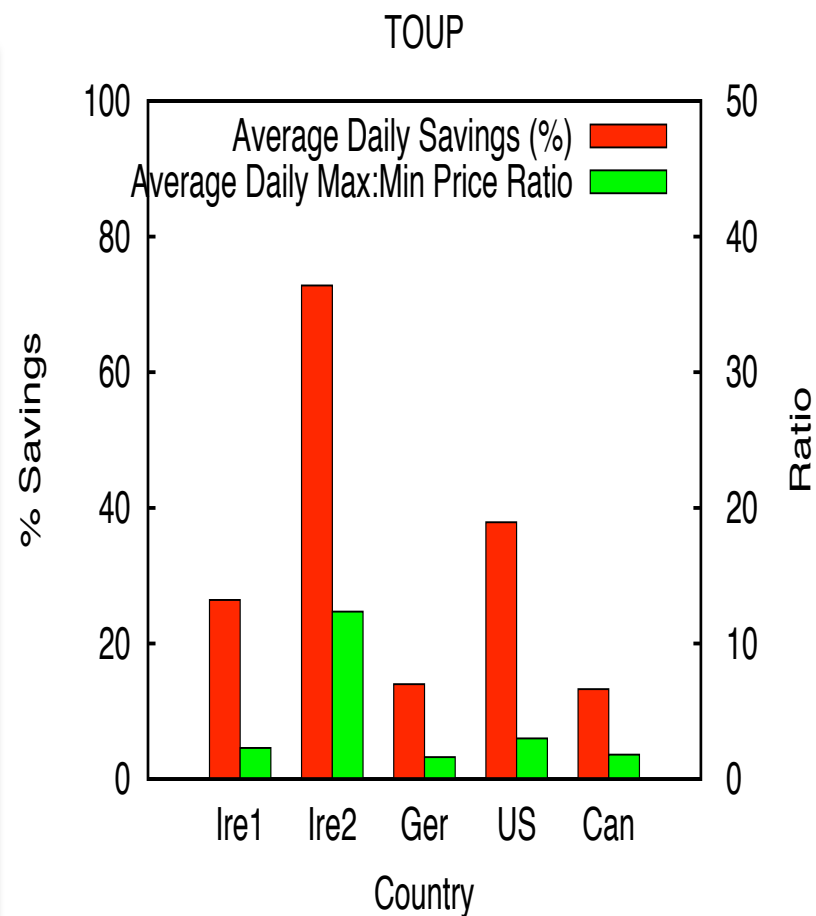
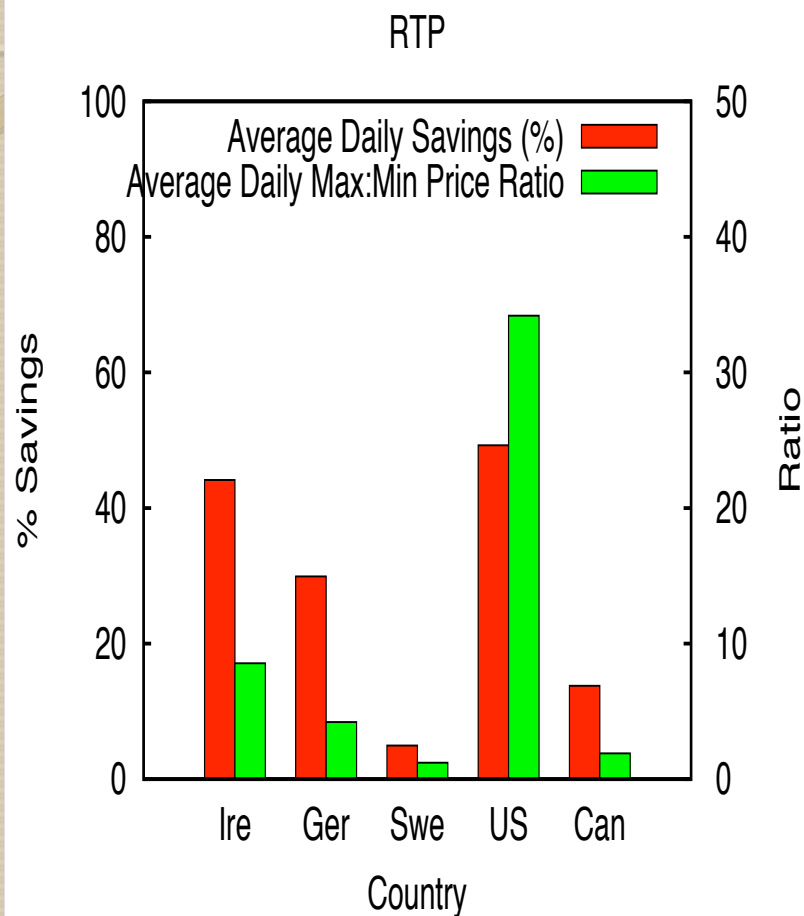
- Markets:
 - Ireland (www.sem-o.com)
 - Germany (www.epexspot.com)
 - Sweden (www.nordpoolspot.com)
 - New York (www.nyiso.com)
 - Ontario (www.ieso.ca)
- 4 weekdays from winter 2011 (10/01/11–14/01/11, midday – midday)
- Weather data for city, in each country for national markets (www.wunderground.com)

Time-of-use pricing tariffs

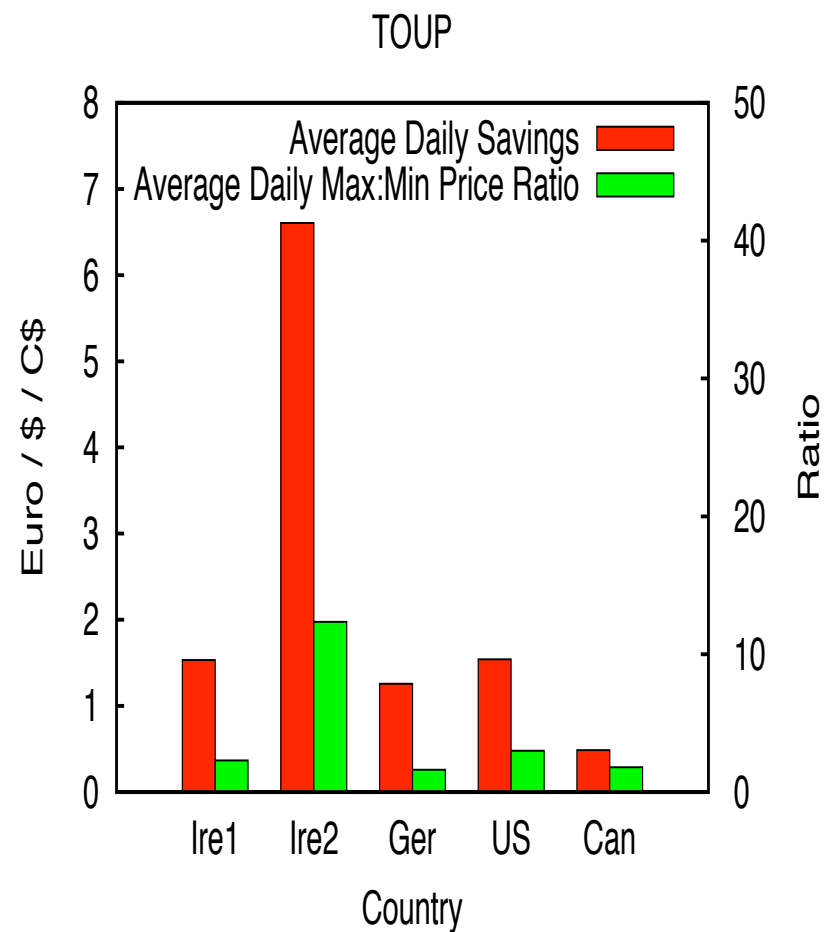
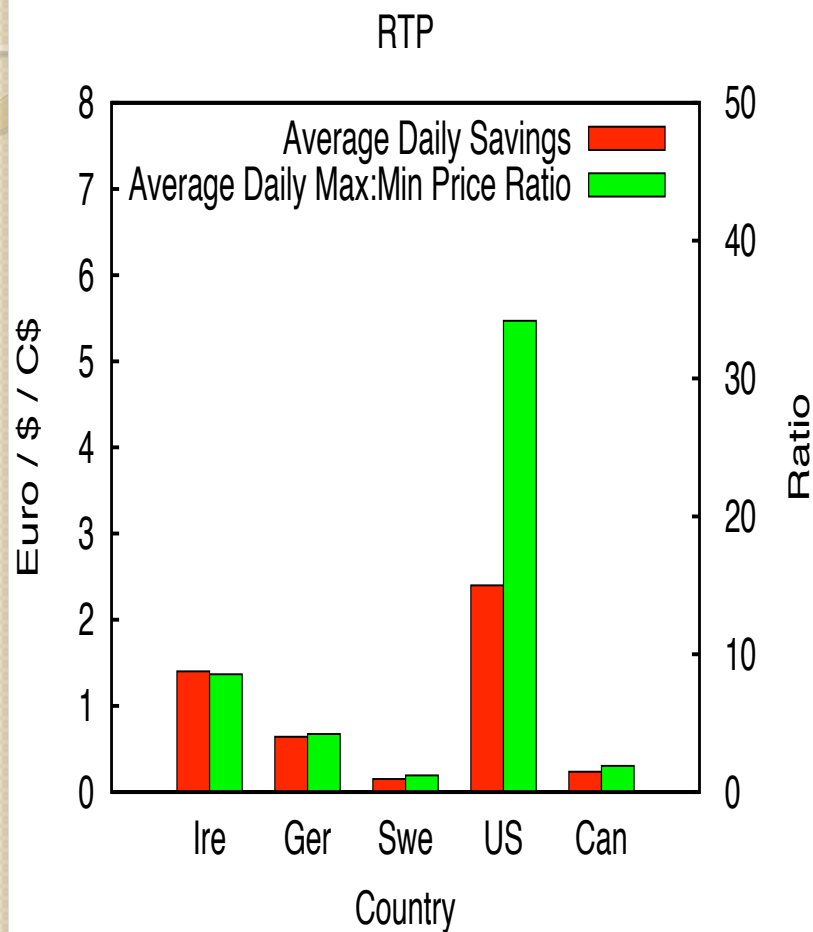
- Tariffs:
 - Ireland, two tariffs proposed in ESB white paper
 - Bielefeld, Germany (www.stadtwerke-bielefeld.de)
 - Portland General Electric (www.portlandgeneral.com)
 - Ontario-Hydro (www.ontario-hydro.com)
- Winter weekday

- 
- Compared in terms of possible savings over non-optimized algorithm (where no price information is taken into account).

Percentage Savings



Monetary Savings



Summary

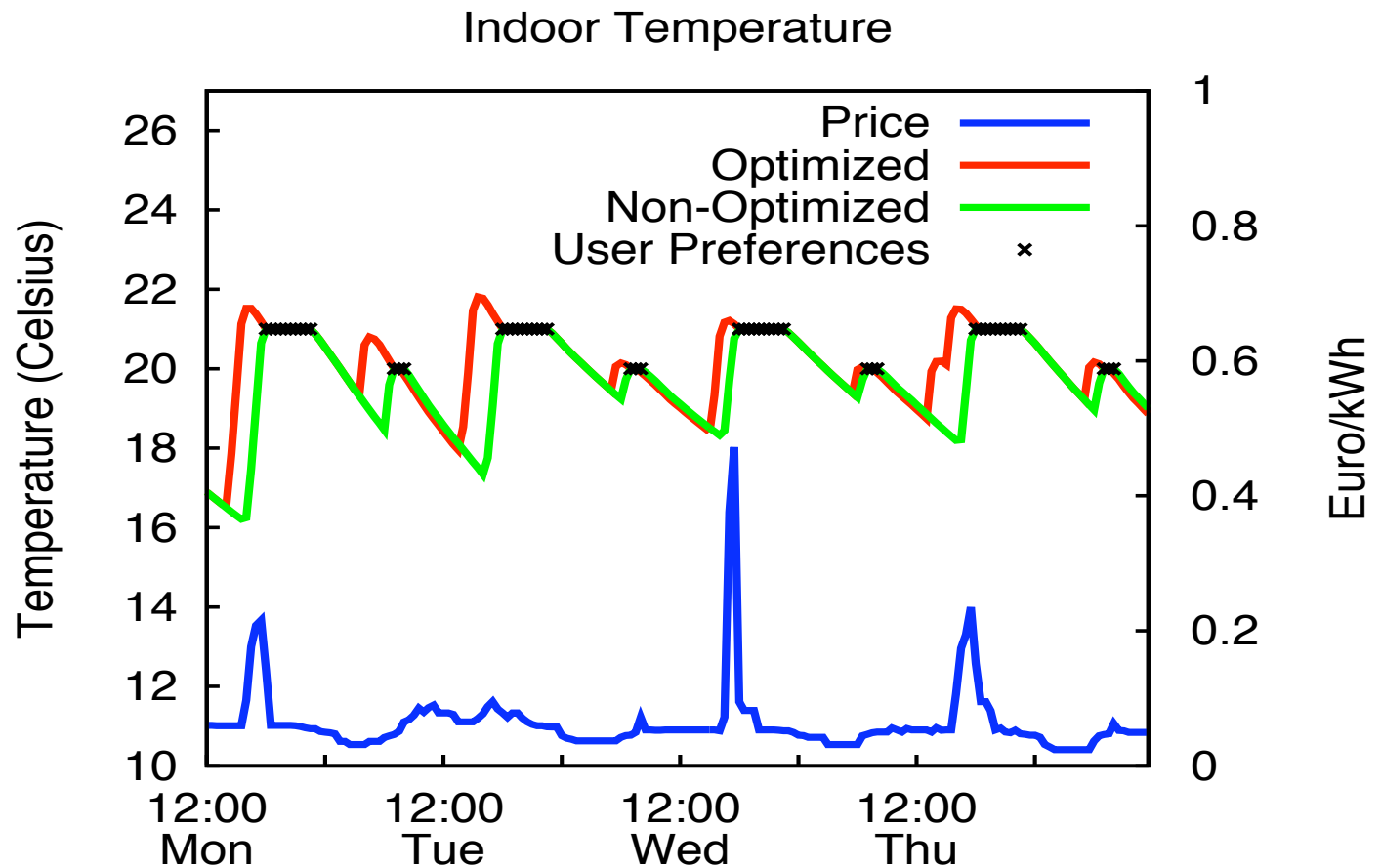
- Significant savings can be made with both.
- TOUP tariffs more consistent in savings achievable.
- High correlation between daily Max:Min price ratio and savings.

Price Distribution

- Sufficient deviation in price is required to overcome losses:
 - HVAC: preheating will require more energy to account for heat losses.
 - EV: vehicle-to-grid will incur energy losses due to inefficiencies in charging and discharging the battery.

Preheating (Ireland)

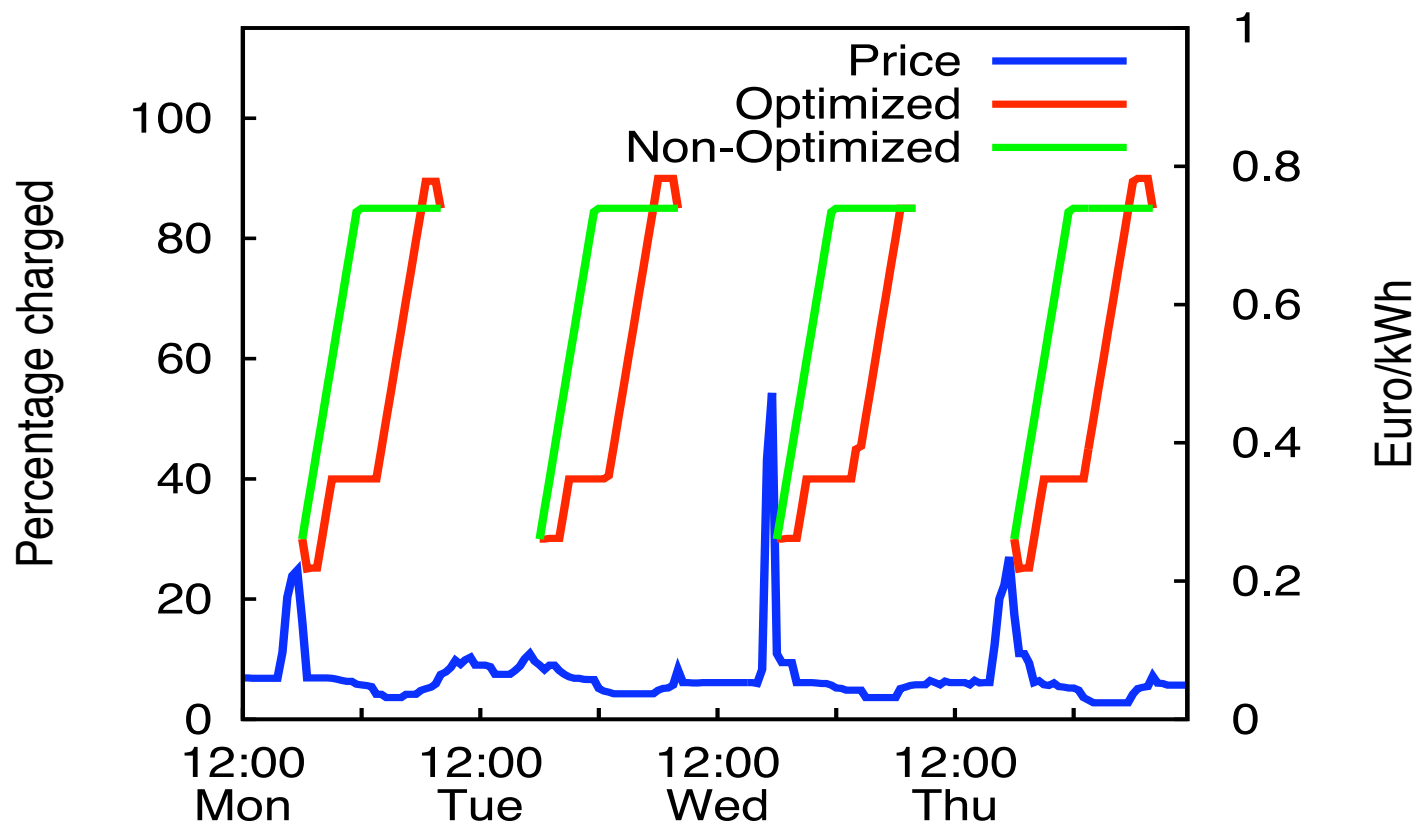
Average Daily Savings: €0.68 / 48.4%



EV Charging (Ireland)

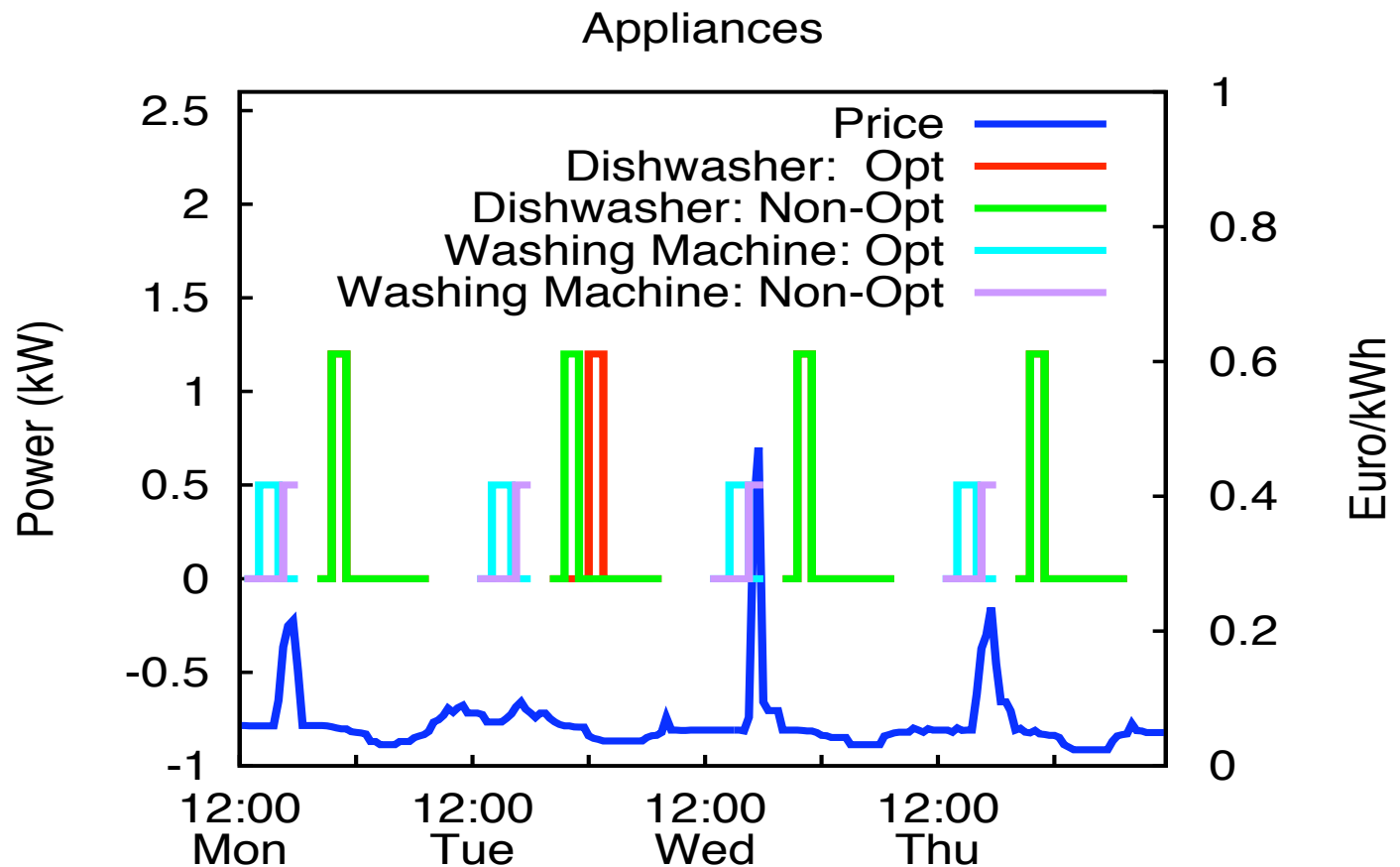
Average Daily Savings: €0.59 / 42.4%

EV - Battery



Appliance Scheduling (Ireland)

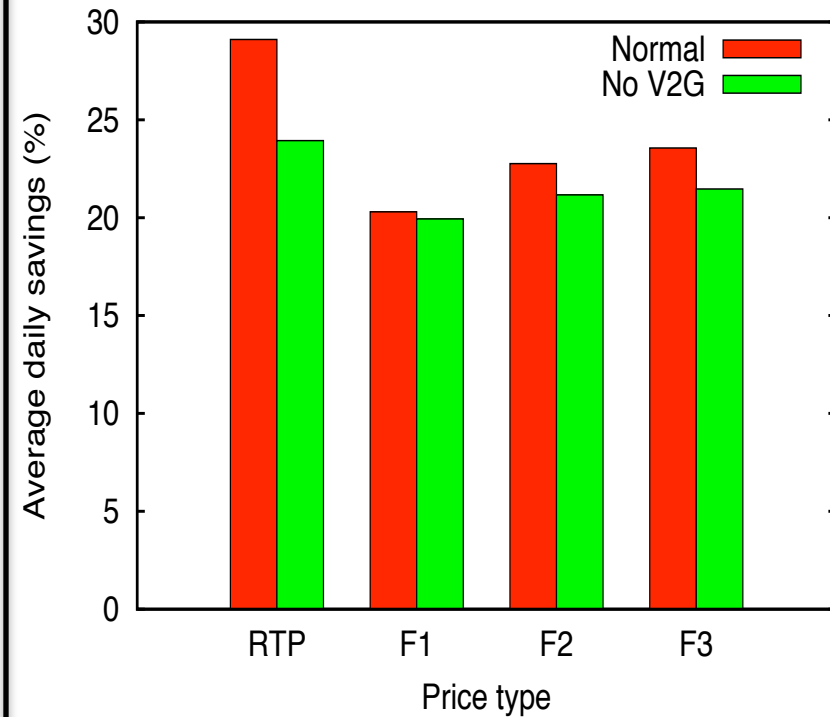
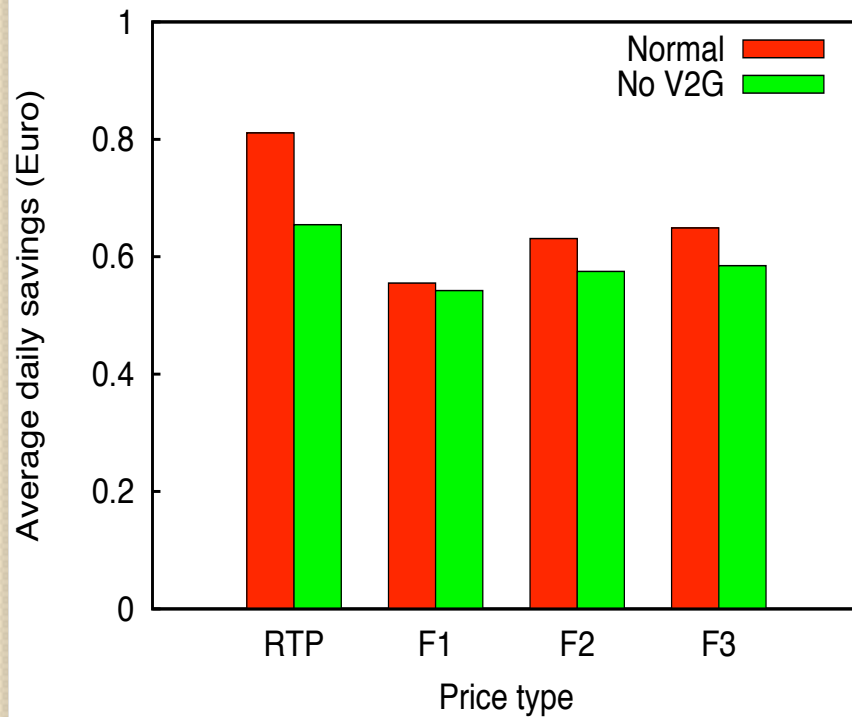
Average Daily Savings: €0.13 / 9.2%



Price Forecasts

- Tested three forecasts.
- 40 weekdays of RTP and forecast for Irish market.
- Also assessed the impact of vehicle-to-grid discharging of EV.

Impact of price forecasts and V2G



Conclusions

- Time-variable pricing + HEMS = savings for user, reduction in peak demand.
- Sufficient deviation in price across horizon necessary.
- Savings primarily due to intelligent EV charging and preheating.
- Forecasts of market price don't need 100% accuracy.
- Vehicle-to-grid can give additional savings, when price peaks are correctly predicted.