



# Smart Grid: Status and Challenges

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CCSES Workshop  
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# Outline

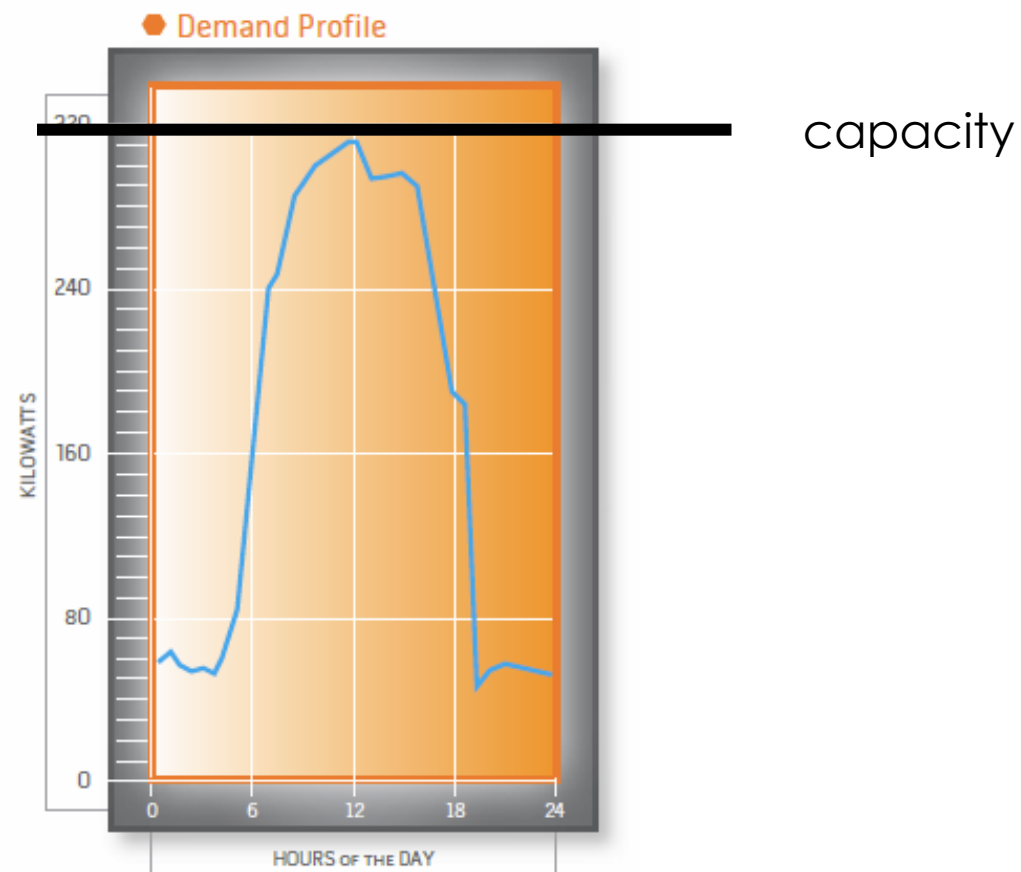


- The grid has **real problems**
  - that smart grids can solve
- These problems are **intrinsic** and **difficult**
  - so progress has been **slow**
- Three areas where changes are **imminent** are **solar**, **storage**, and **sensing**
  - I'll give some **examples** of my work in these areas



The grid has some real problems

# 1. Overprovisioned

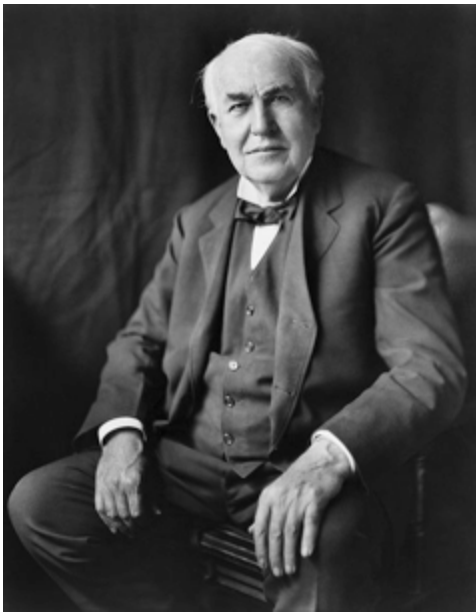


## 2. Inefficient



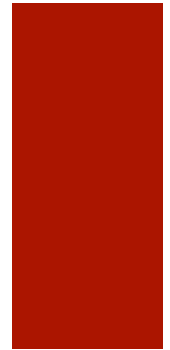
5% better efficiency of US grid  
= zero emission from 53 million cars

# 3. Aging



Post-war infrastructure is reaching **EOL**

## 4. Uneven



	<b>TWh generated</b>	<b>Daily W/capita (2012 est.)</b>
■ China	4,938	395
■ US	4,256	1402

## 5. Poorly measured





## 6. Poorly controlled

- Electrons are not addressible



## 7. Huge carbon footprint





# Smart grid vision

# Current grid    “Smart” grid

High carbon footprint    ■ Renewables/low carbon

Little to no storage    ■ Storage rich

Poorly measured    ■ Sensing rich

Poorly controlled    ■ Control rich

Ossified    ■ Flexible

Inefficient    ■ Energy frugal

Centralized generation    ■ Decentralized generation



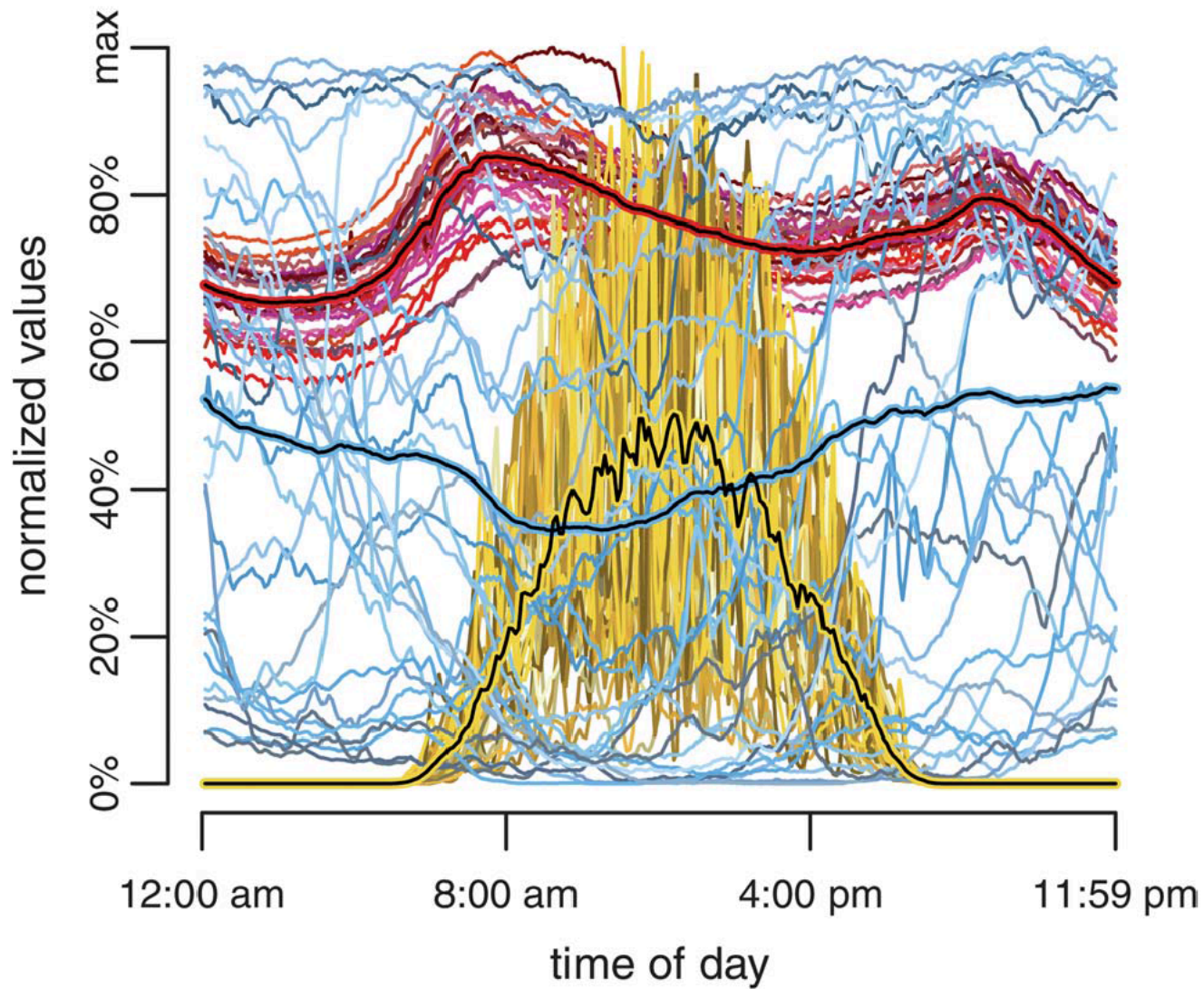


Source: European technology platform: Smart Grids



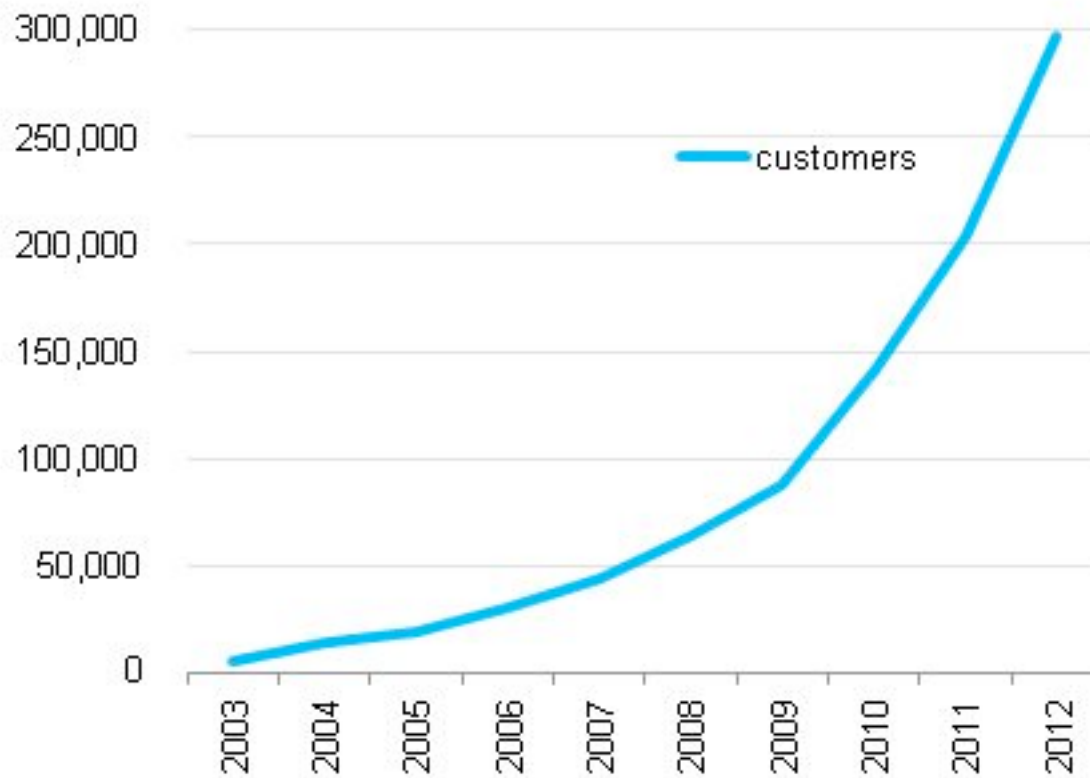
# Intrinsic challenges

# 1. Matching demand and supply



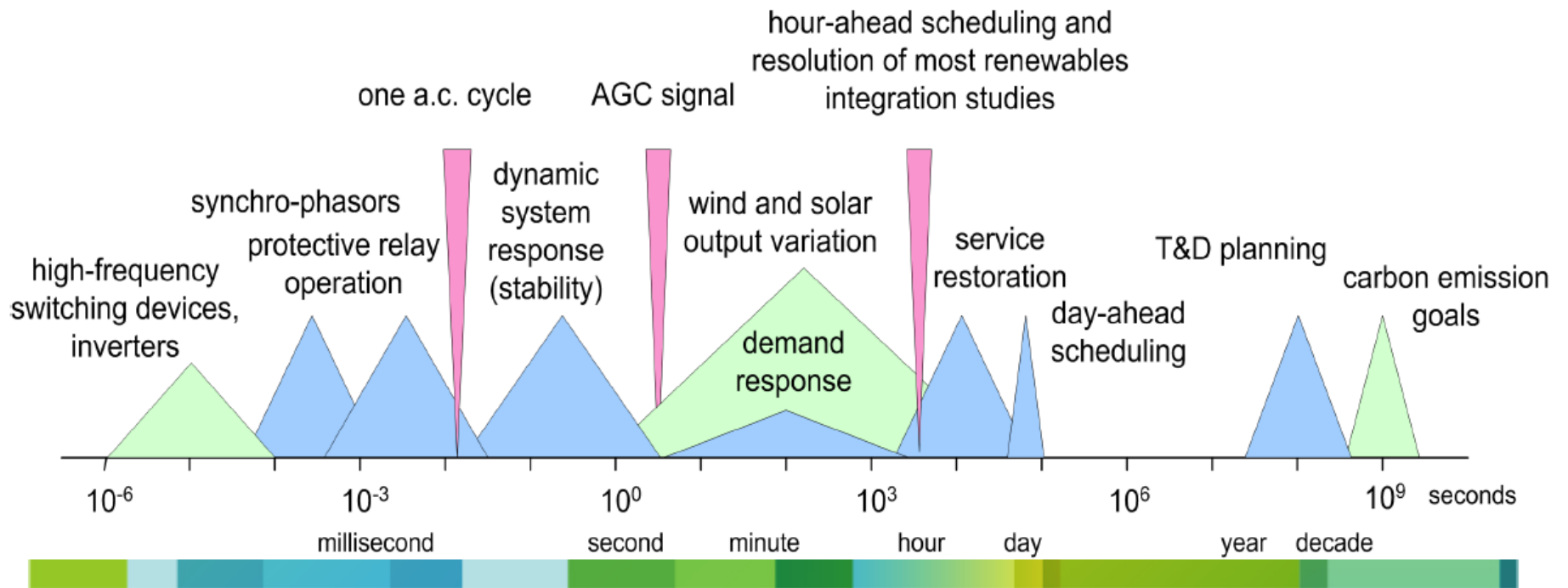
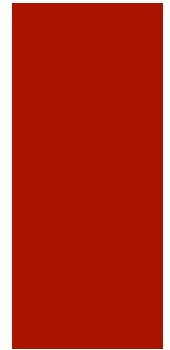
## 2. Controlling distributed generators

Number of residential net metered customers

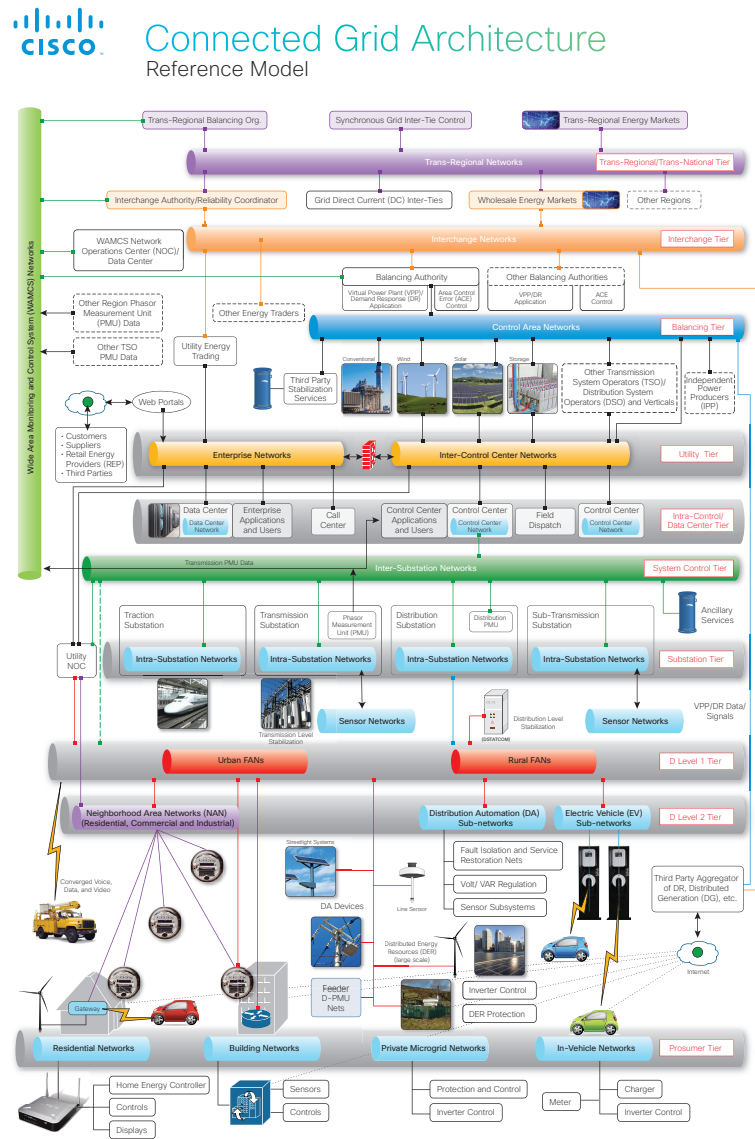




# 3. Control over many time scales



# 4. Complex control architecture



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## 5. Consumers lack incentives



- Energy savings of 10%
- \$10/month



## 6. Utilities also lack incentives!



## 7. Huge legacy infrastructure



## 8. Storage is complex and expensive



- No clear winner in terms of technology
- Need to balance energy and power



Status

# Depressing...



- A. Demand response – only time of use pricing
- B. Storage - tiny
- C. Smart buildings and homes – demo stage
- D. Microgrids – rare
- E. Electric vehicles – early stage
- F. Security and privacy – mostly missing





# Three inflection points

- Solar
- Storage
- Sensing



## Global cumulative installed PV capacity in MW

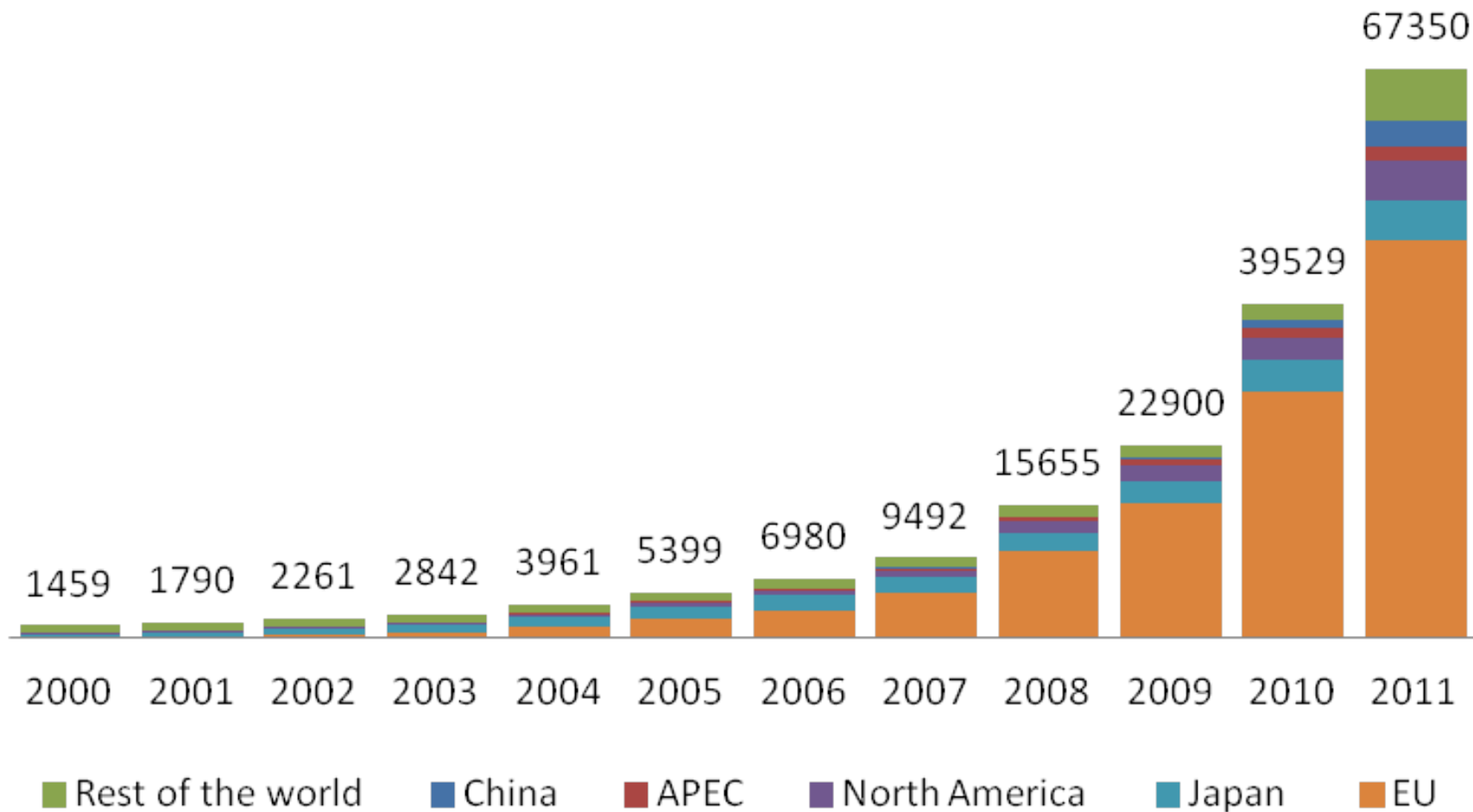




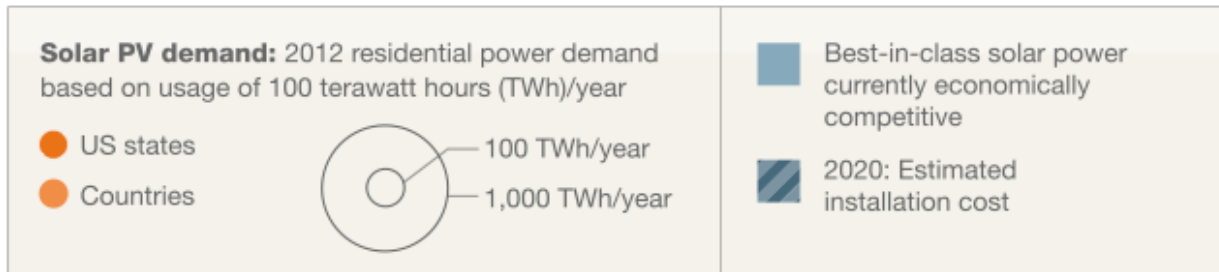
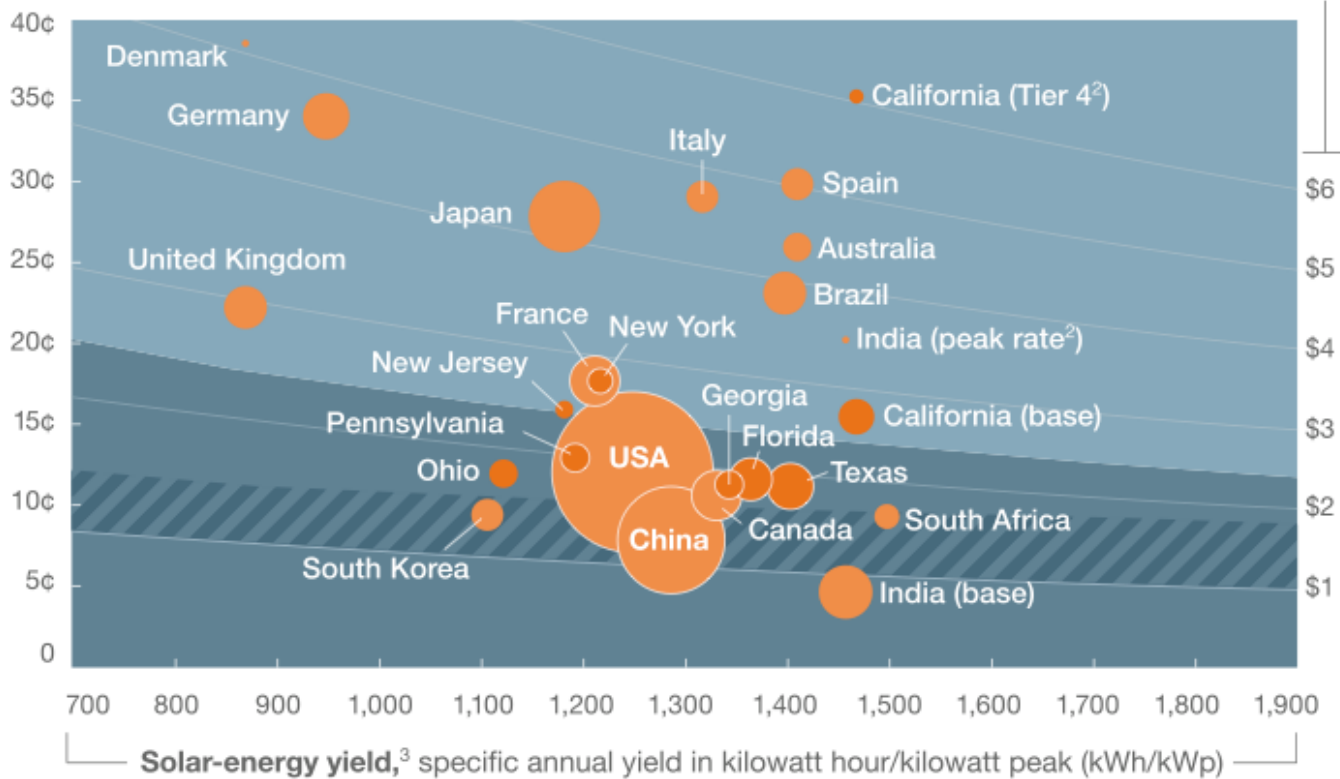
Table showing average cost in cents/kWh over 20 years for solar power panels

Cost	Insolation								
	2400 kWh/ kWp·y	2200 kWh/ kWp·y	2000 kWh/ kWp·y	1800 kWh/ kWp·y	1600 kWh/ kWp·y	1400 kWh/kWp·y	1200 kWh/kWp·y	1000 kWh/kWp·y	800 kWh/kWp·y
200 \$/kWp	0.8	0.9	1.0	1.1	1.3	1.4	1.7	2.0	2.5
600 \$/kWp	2.5	2.7	3.0	3.3	3.8	4.3	5.0	6.0	7.5
1000 \$/kWp	4.2	4.5	5.0	5.6	6.3	7.1	8.3	10.0	12.5
1400 \$/kWp	5.8	6.4	7.0	7.8	8.8	10.0	11.7	14.0	17.5
1800 \$/kWp	7.5	8.2	9.0	10.0	11.3	12.9	15.0	18.0	22.5
2200 \$/kWp	9.2	10.0	11.0	12.2	13.8	15.7	18.3	22.0	27.5
2600 \$/kWp	10.8	11.8	13.0	14.4	16.3	18.6	21.7	26.0	32.5
3000 \$/kWp	12.5	13.6	15.0	16.7	18.8	21.4	25.0	30.0	37.5
3400 \$/kWp	14.2	15.5	17.0	18.9	21.3	24.3	28.3	34.0	42.5
3800 \$/kWp	15.8	17.3	19.0	21.1	23.8	27.1	31.7	38.0	47.5
4200 \$/kWp	17.5	19.1	21.0	23.3	26.3	30.0	35.0	42.0	52.5
4600 \$/kWp	19.2	20.9	23.0	25.6	28.8	32.9	38.3	46.0	57.5
5000 \$/kWp	20.8	22.7	25.0	27.8	31.3	35.7	41.7	50.0	62.5

Grid-parity potential of solar PV (photovoltaic) power in major markets, residential-segment example

**Price:** for retail power, 2012 average for households, ¢/kilowatt hour (kWh)

**Cost:** solar-system installation,<sup>1</sup> \$/watt peak



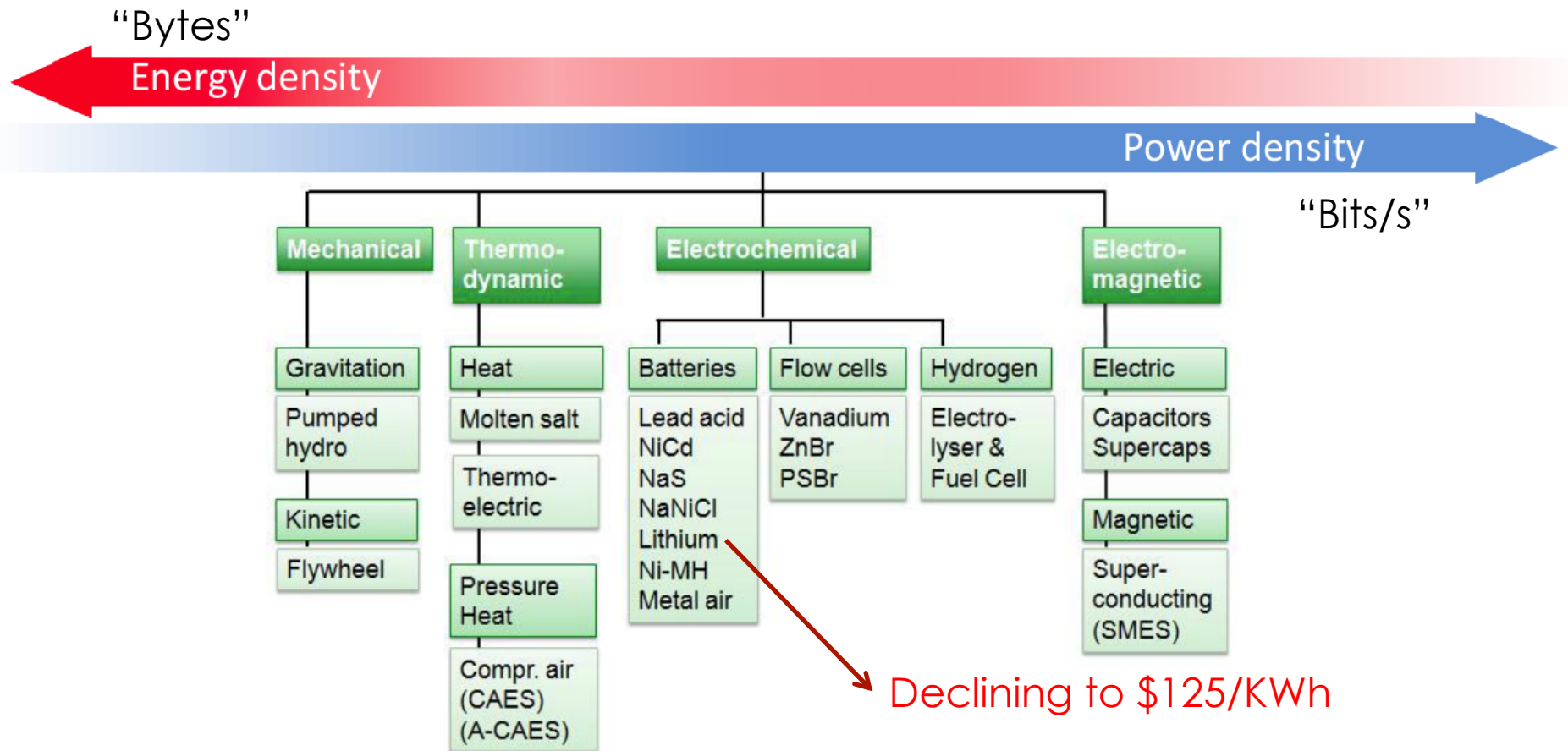
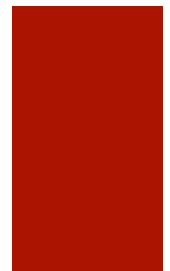
<sup>1</sup>Full cost estimated, based on residential 5-kilowatt c-Si system; levelized cost of energy accounts for solar insulation and assumes 5% weighted average cost of capital, 25-year lifetime, 0.3% annual degradation, and fixed 1% operating and maintenance costs.



# Storage

- Global investment to reach **\$122 Billion** by 2021

# Storage alternatives



Graphs adapted from: A. Oudalov, C. Yuen and M. Holmberg, “Energy Storage is a Key Smart Grid Element” | Cigré Symposium The Electric Power System of the Future, Sept. 13-15, 2011, Bologna, Italy

# Process storage

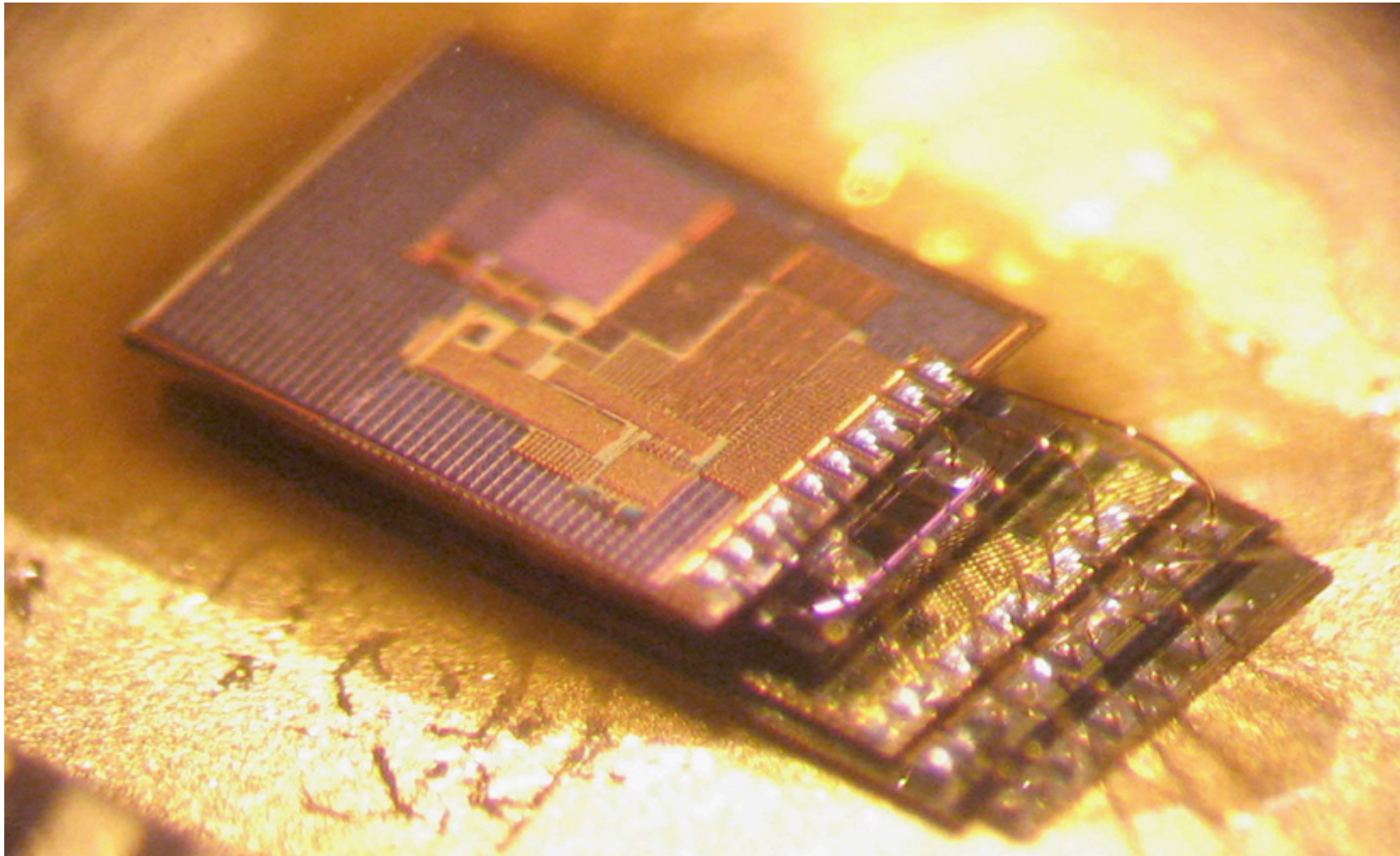


# Thermal storage





# Sensing





So what?

# Grid Internet

Solar = Variable bit-rate source

Electrons = Bits

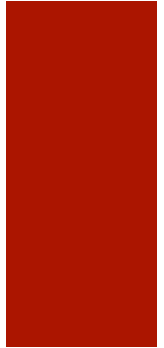
Storage = Buffer

Transmission line = Communication link

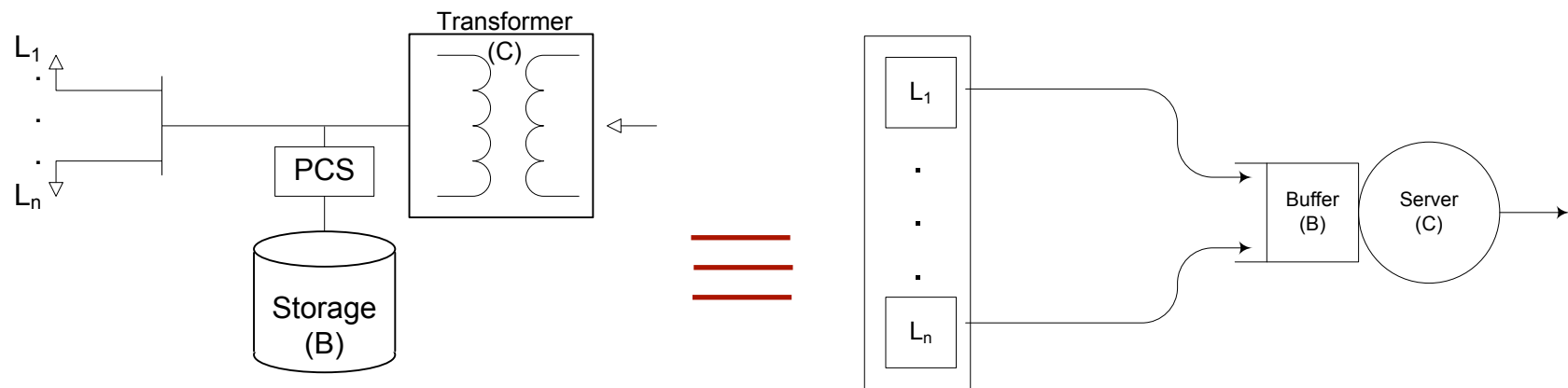
Transmission network = Tier 1 ISP

Distribution network = Tier 2/3 ISP

Demand response = Congestion control



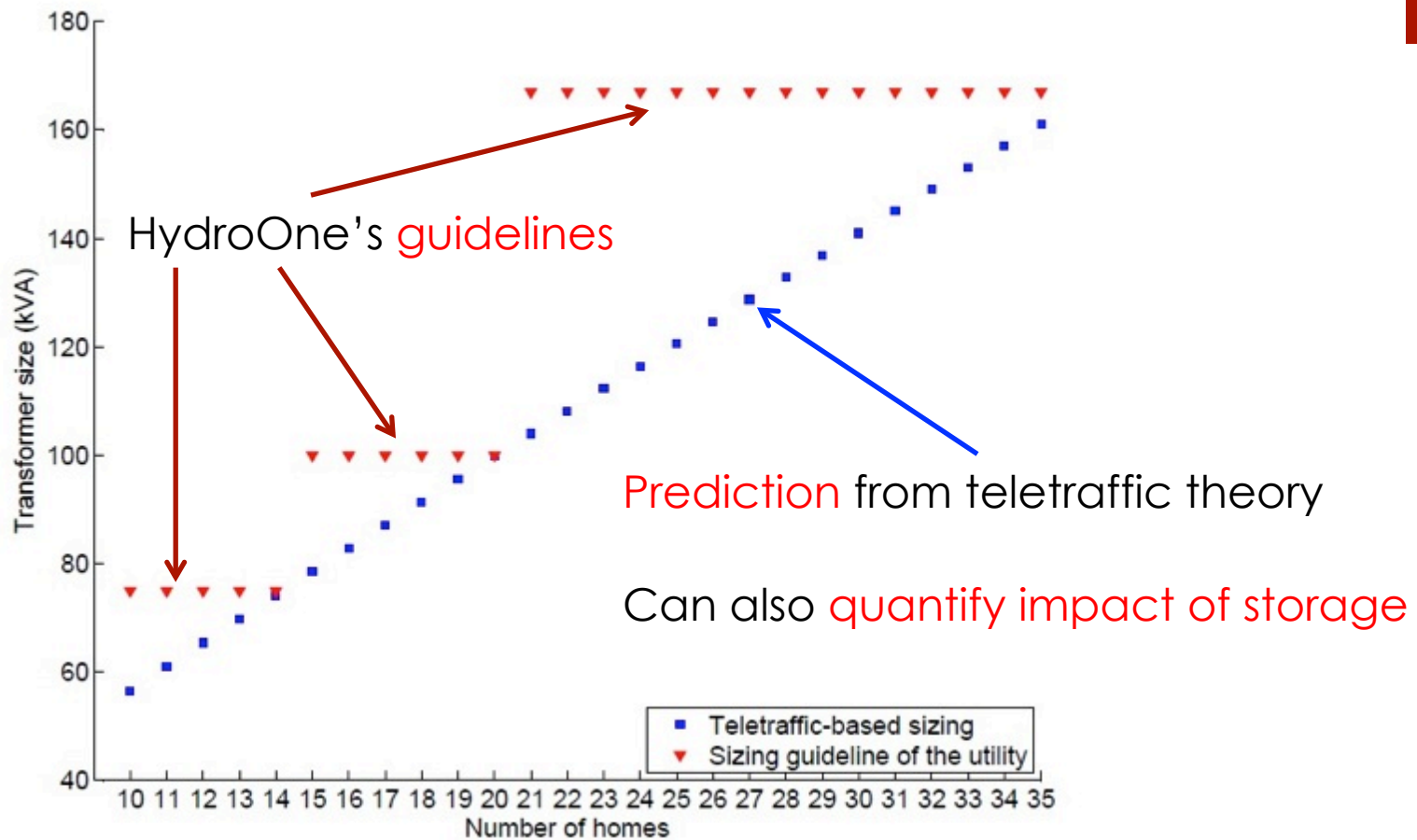
# Equivalence theorem



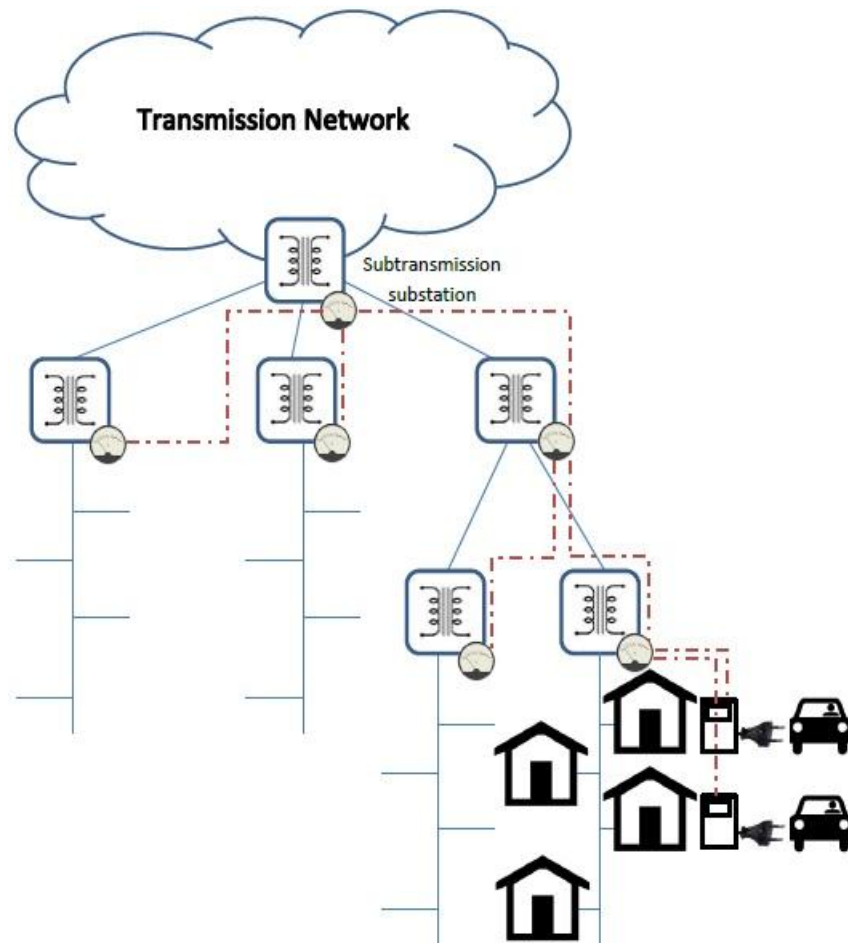
Every trajectory on the LHS has an equivalent on the RHS

- can use **teletraffic theory** to study transformer sizing

# Guidelines for transformer sizing



# “TCP” for EV charging



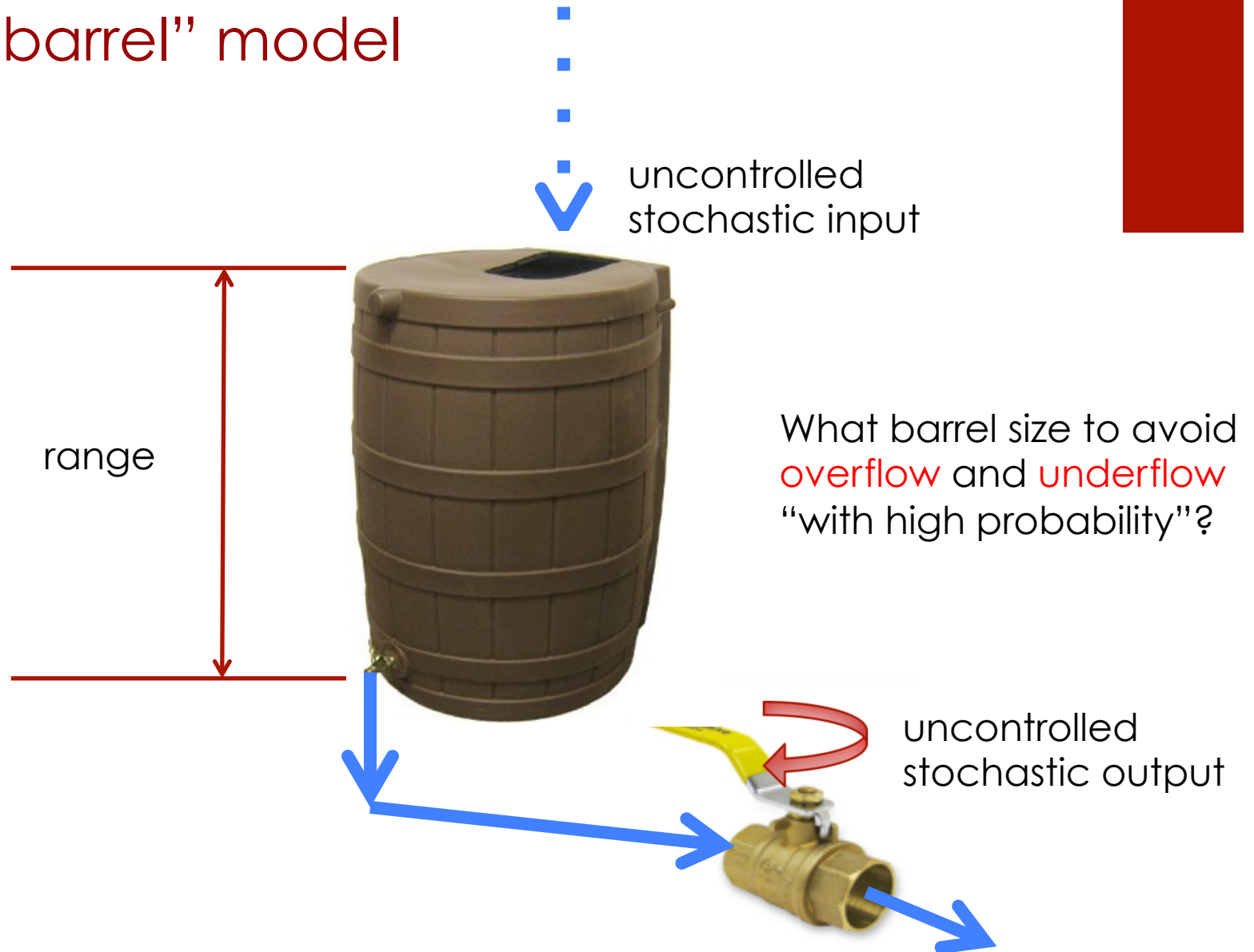
- 1 EV = 5 homes
  - Creates hotspots
- Real-time AIMD control of EV charging rate
- Solution is both fair and efficient



# Stochastic network calculus

Joint work with Y. [Ghiassi-Farrokhfal](#) and C. [Rosenberg](#)

# “Rainbarrel” model

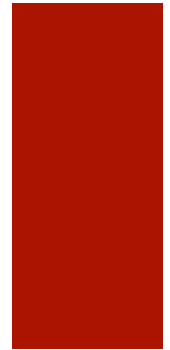




# Envelope idea



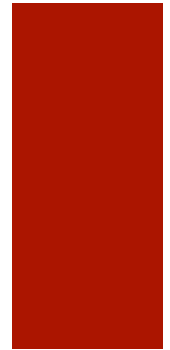
lower envelope  $\leq \Sigma$  input  $\leq$  upper envelope



Envelopes are computed from a dataset of **trajectories**

lower envelope  $\leq \Sigma$  output  $\leq$  upper envelope

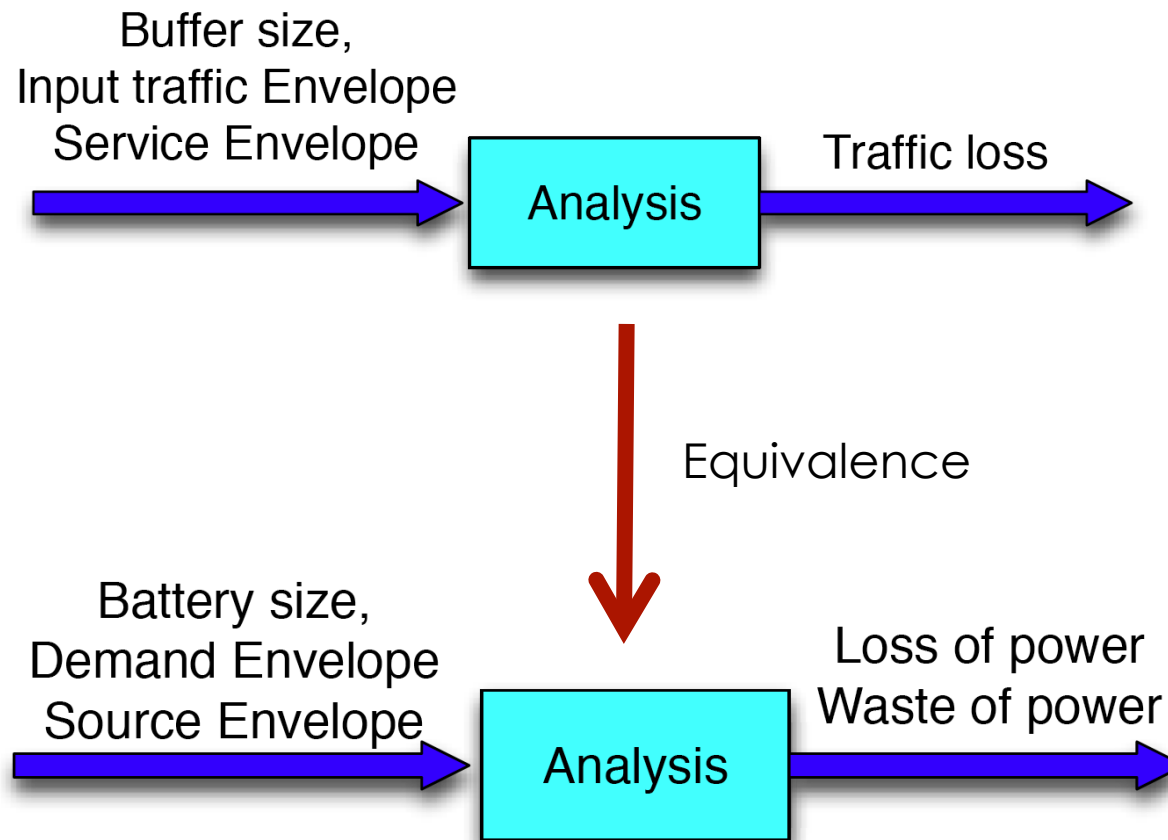
# Stochastic envelopes



$$P((\Sigma \text{ input} - \text{lower envelope}) > x) = ae^{-x}$$

$$P((\text{upper envelope} - \Sigma \text{ input}) > x) = be^{-x}$$

# Stochastic network calculus



Wang, Kai, et al. "A stochastic power network calculus for integrating renewable energy sources into the power grid." *Selected Areas in Communications, IEEE Journal on 30.6* (2012): 1037-1048.

# Analytic results

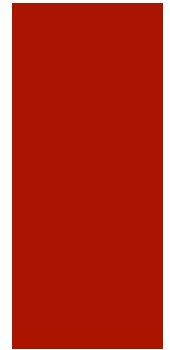


- **Minimizing storage size** to smooth solar/wind sources
- **Optimal** participation of a solar farm in **day-ahead energy markets**
- Modeling of **imperfect storage devices**
- **Optimal operation of diesel generators** to deal with power cuts in developing countries



# Load reduction using extreme sensing

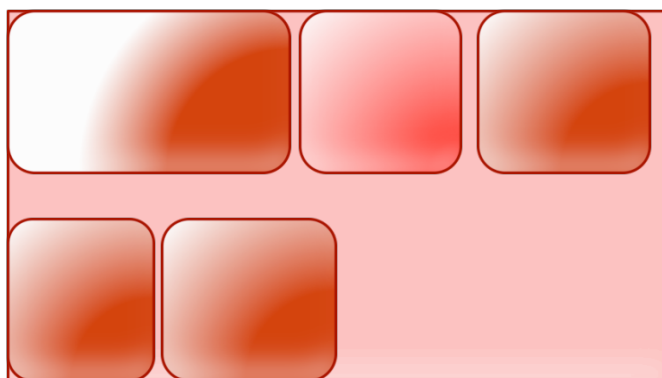
# Smart Personal Thermal Comfort



Fine-grained thermal control of individual offices



P.X. [Gao](#) and S. Keshav, Optimal Personal Comfort Management Using SPOT+, Proc. BuildSys Workshop, November 2013.  
P. X. [Gao](#) and S. Keshav, SPOT: A Smart Personalized Office Thermal Control System, Proc. ACM e-Energy 2013, May 2013.



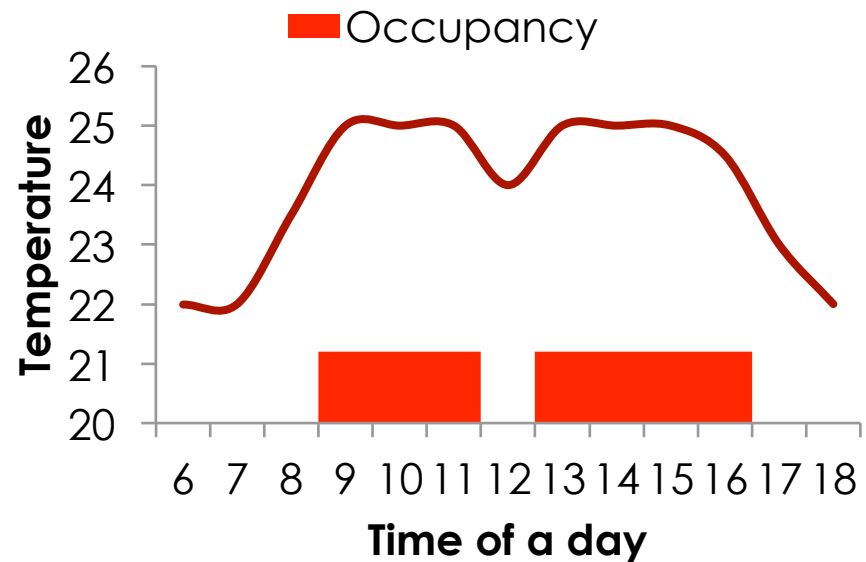
Our *insight*



# In a nutshell

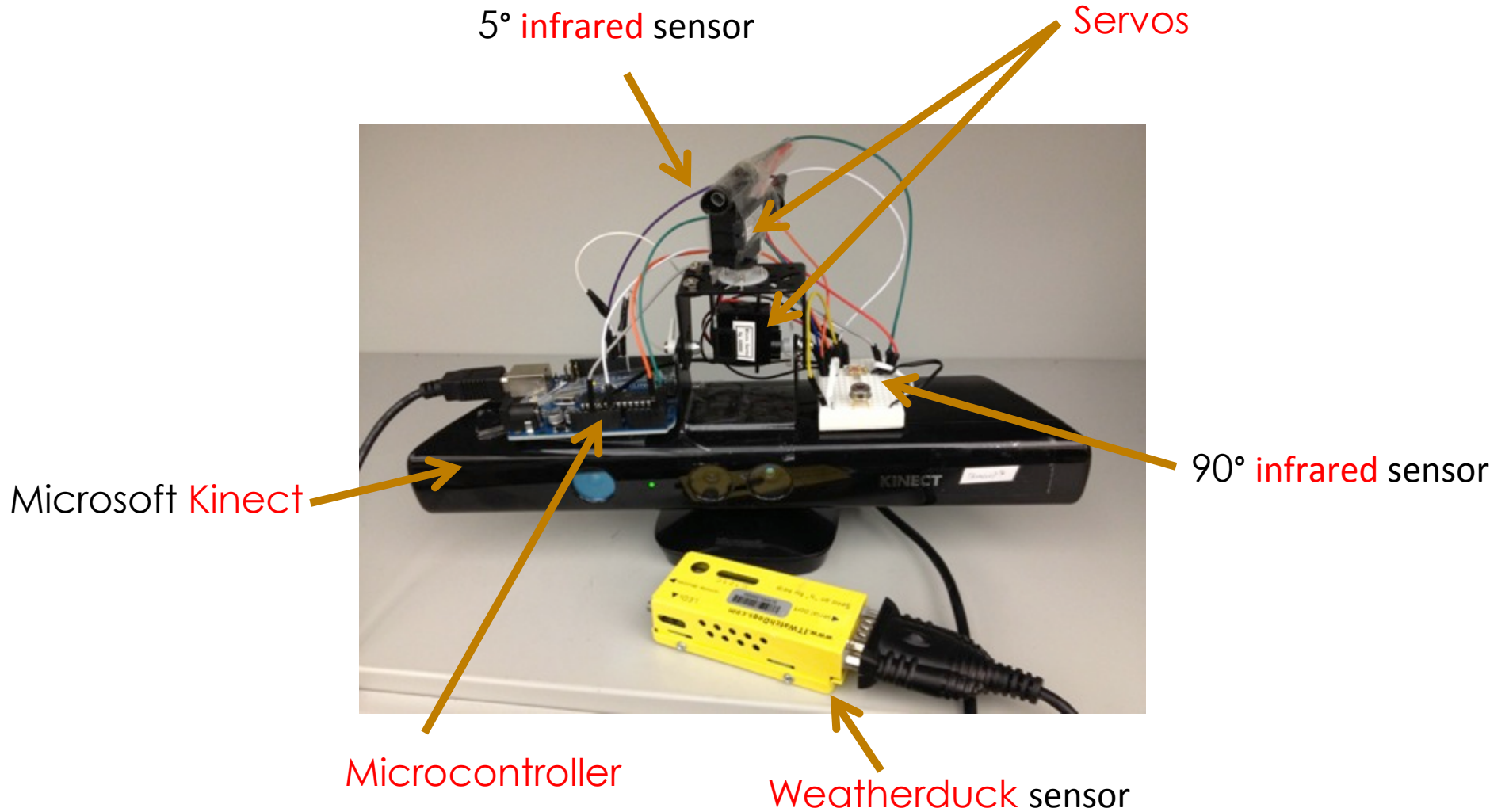


- **Mathematical** comfort model
- When **occupied**, reduce comfort to the minimum acceptable level
- When **vacant**, turn heating off
- **Pre-heat**
- **Optimal** model-predictive control

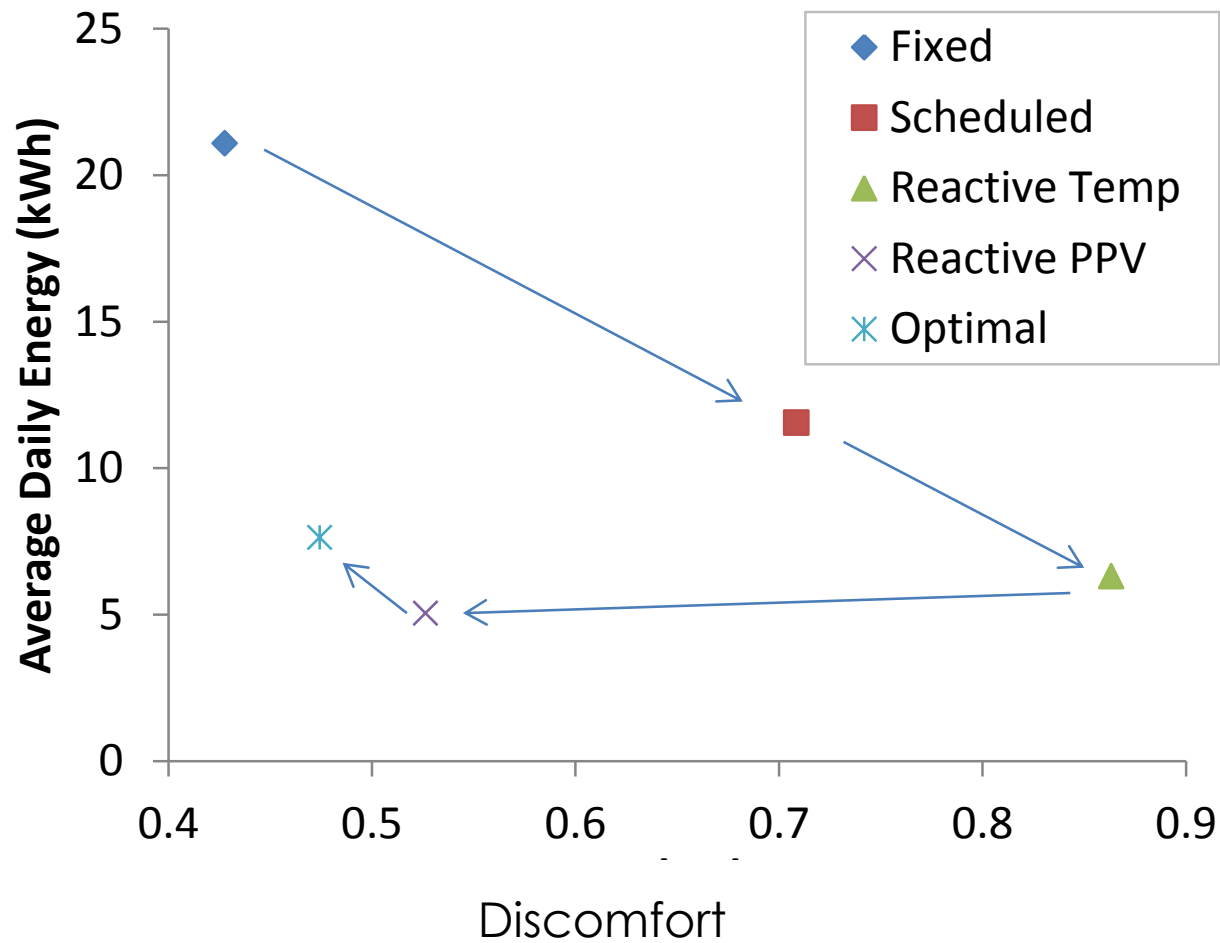
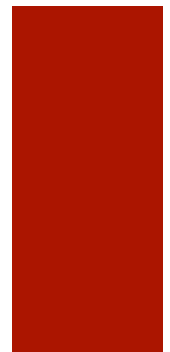




# Extreme sensing



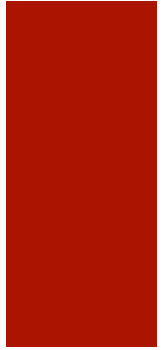
# Comparison of schemes





Reflections on the research area

# Energy research



## Pros

- Rapidly growing area
- Many open problems
- Industry interest and support
- Motivated students
- Potential for impact

## Cons

- Requires learning new concepts and ideas
- Entrenched interests
- Difficult to obtain data
- Field trials nearly impossible

# Many open research problems



- Renewables integration
- Multi-level control
- Non-cash incentive design for consumers
- Energy efficiency policies for utilities
- Storage size minimization in energy systems
- Incentives for EV adoption
- Data mining of energy data sets
- Peak load reduction
- HCI for energy applications
- Data center energy minimization
- Microgrid/nanogrid design
- Building energy use monitoring and reduction

# Many publication venues

## Conferences/workshops

- ACM eEnergy
- IEEE SmartGridComm
- ACM Buildsys
- ACM GreenMetrics
- IEEE CCSES
- ACM Sustainability
- AAAI AAMAS

## Journals

- IEEE Trans. Smart Grid
- IEEE PES magazine
- Energy and Buildings
- J. Solar Power
- J. Power Sources
- Transportation

# ACM e-Energy 2014



- Premier conference at the intersection of Internet technologies and energy systems
- Sponsored by ACM SIGCOMM
- June 11-13, 2014 in Cambridge, UK
- Early registration deadline is Wednesday!



# Conclusions

- The grid has some real problems
- Smart grid offers solutions, but it is still early days
- Three areas to watch out for
  - Solar
  - Storage
  - Sensing



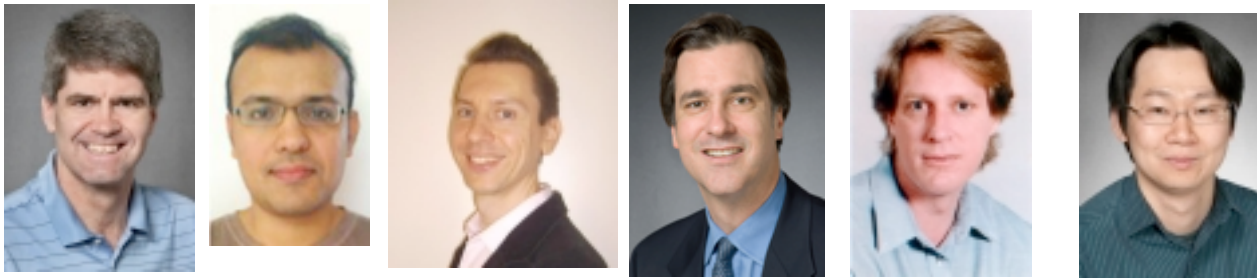


# Acknowledgements

# ISS4E

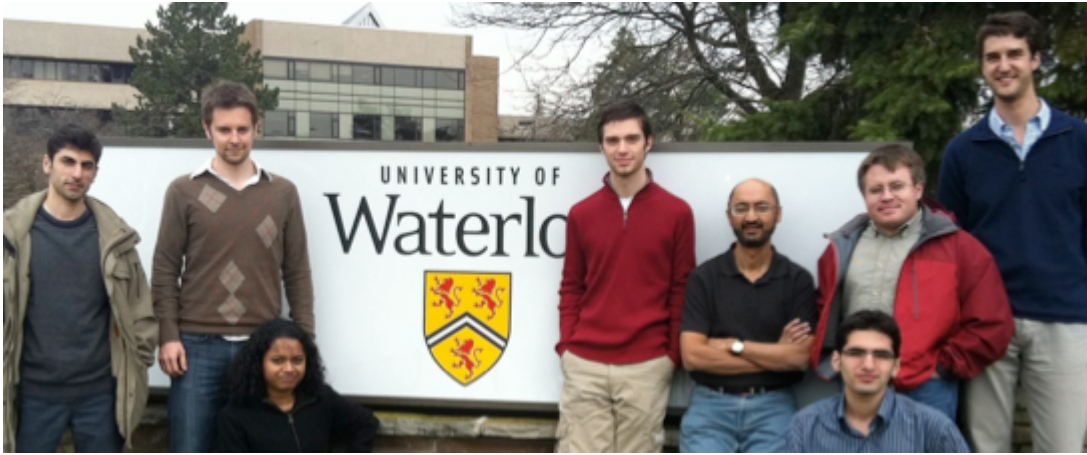


Co-Director

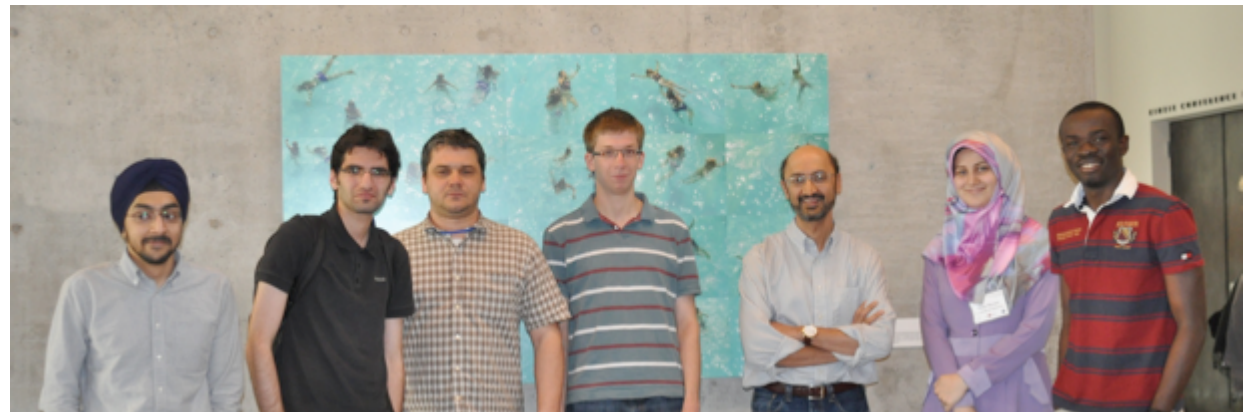


Affiliated faculty

<http://iss4e.ca>



# ISS4E students



Our next project

