







### Methods for Network-Enabled Embedded Monitoring and Control for High-Performance Buildings

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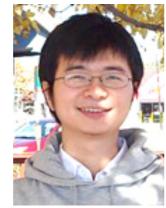
Siddharth Goyal Chenda Liao

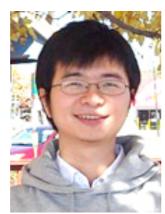


Feb 5, 2010

Kick-off meeting, **East Hartford** 

Kun Deng





March 23, 2010



Adam Tilton



Yu Sun

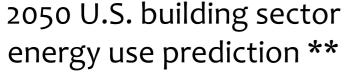


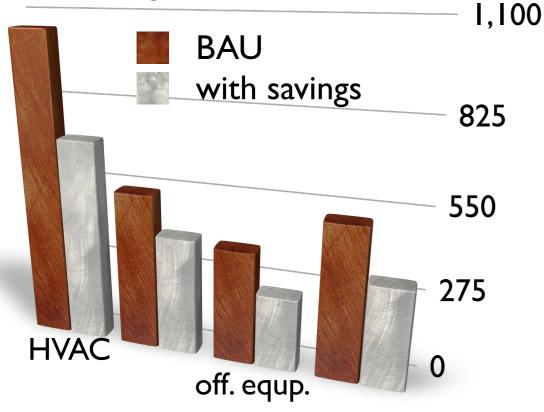
Marcin Szczodrak

project awarded

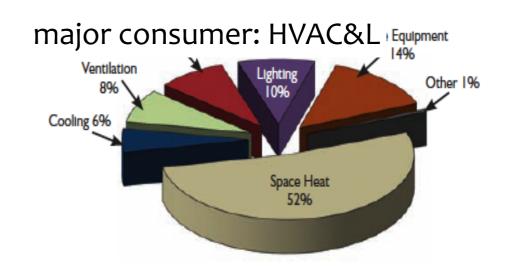
## Buildings and Energy (U.S.)

- > 71% of electricity\*, 39% of total energy use\*, 38% of CO2 emissions\*
- > commercial / residential ~ 1, but growing

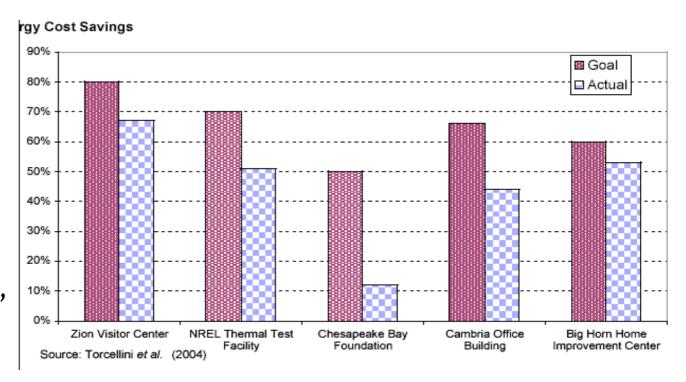




\*\* based on an assumed 55% reduction in HVAC energy use through improved HVAC equipment and controls [source: "U.S. Building-Sector Energy Efficiency Potential", LBNL-1096E, Brown et. al. 2008]



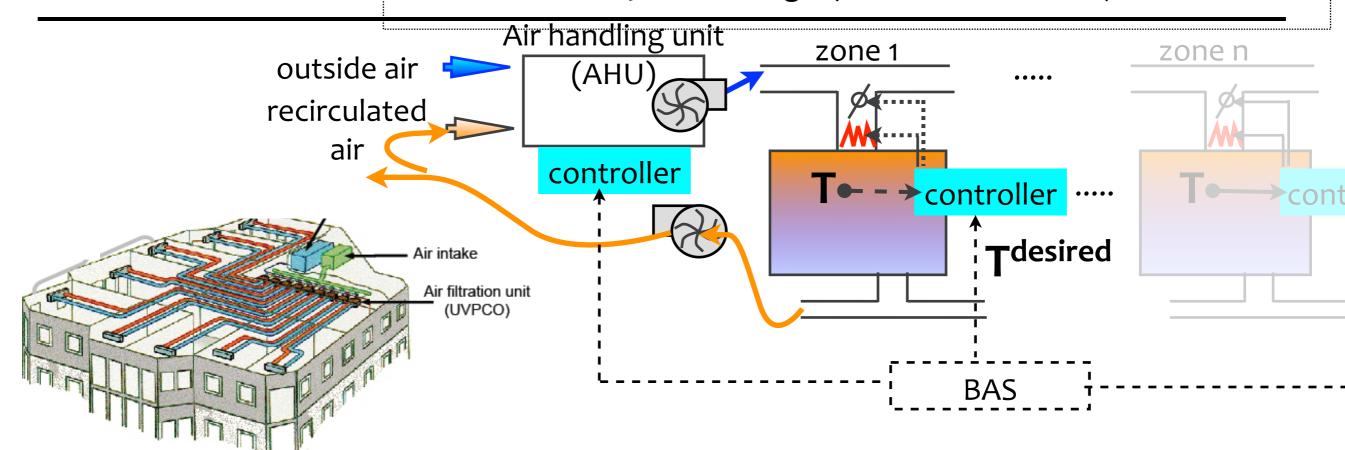
### Gaps between design and actual performance



# Inefficiency in building HVAC

Sources of inefficiency:

- controls (open-loop schedule + local feedback)
- \* HVAC system design (worst case "load")



- Physics:
  - thermal, contaminant transport, occupants,
- Cyber:
  - thousands of sensors (temp, flow rate, status, CO2, video...)
  - control logics at several scales (zone-level, building-level)

#### attributes:

- time-varying, building-specific
- complex interconnection

## Optimal control?

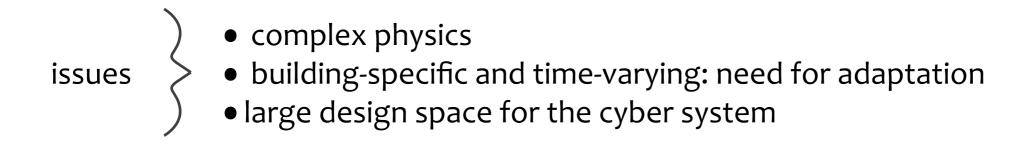
"minimize energy use while maintaining comfort and IAQ"

weather model

Thermal+ IAQ dynamics model

occupancy model

occupancy model



# Design and Implementation

"minimize energy use while maintaining comfort and IAQ"

weather model

Thermal+ IAQ occupancy model

occupancy model

occupancy model

# Design and Implementation

weather model

Thermal+ IAQ min E subj. to ....

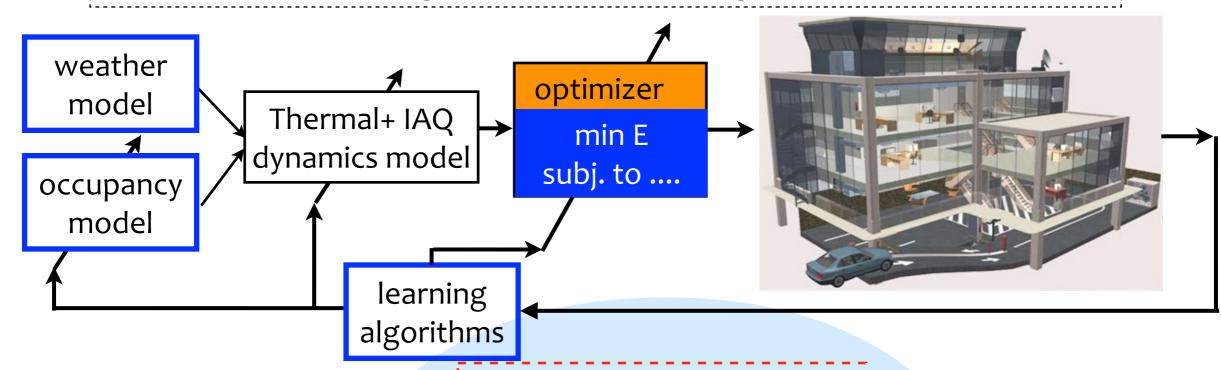
learning algorithms

"minimize energy use while maintaining comfort and IAQ"

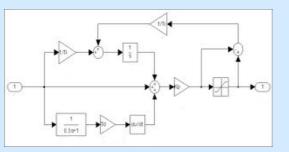
optimizer subj. to ....

# Design and Implementation

"minimize energy use while maintaining comfort and IAQ"



control and estimation computations



stream processing





What to compute
Where to compute?
centralized / distributed
What to communicate, how?

wired/wireless

### **Processing Elements**





### **Communication Elements**

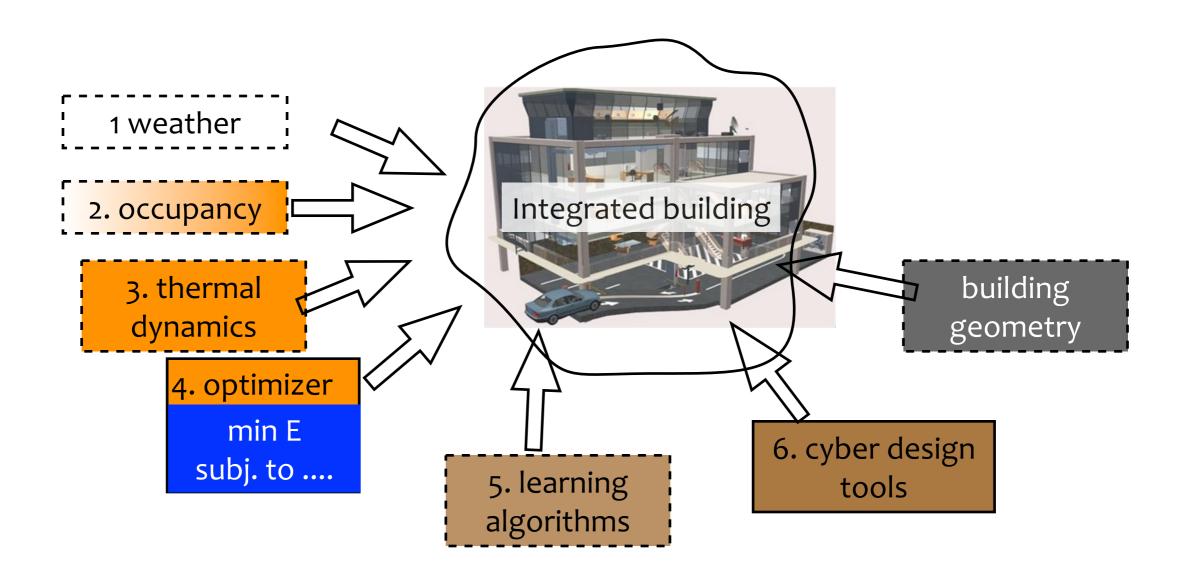






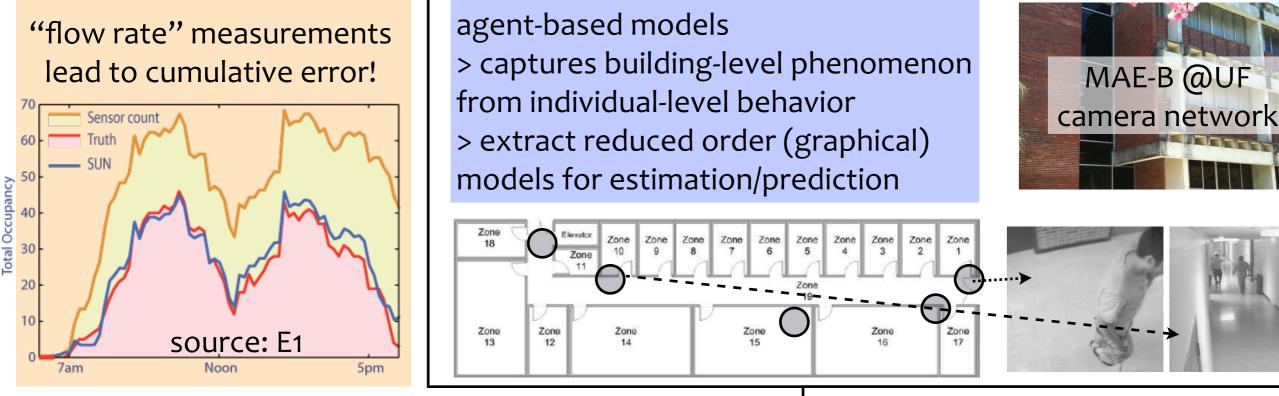
Building physical constraints

## Integrated buildings: networked CPS

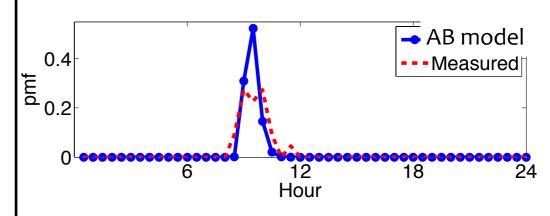


# 2. Occupancy (modeling, estimation,..)

measurements + model of dynamics + (computation) => estimation and prediction



E1. Meyn, Surana, Lin, Oggianu, Narayanan and Frewen, IEEE Conference on Decision and Control, 2009

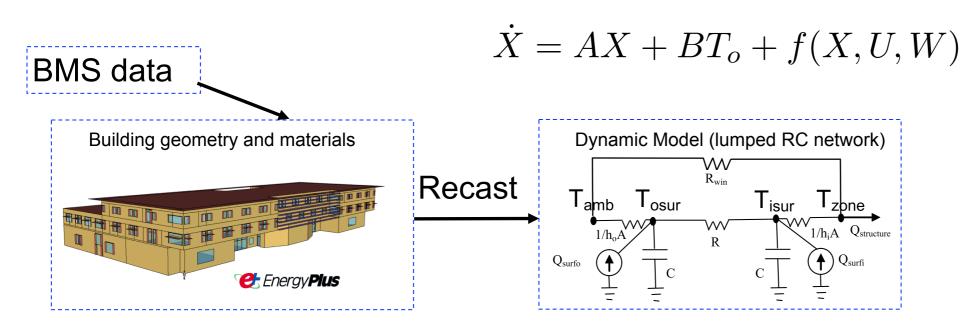


MAE-B @UF

#### **Publications:**

- 1. C. Liao and P. Barooah, American Control Conference, July 2010
- 2. C. Liao and P. Barooah, Journal of Building Performance Simulation (in review)

# 3. Thermal and IAQ dynamics



1 zone - 8 states

4 zones - 42 states

66 zones - 880 states

••••

- standard practice, well validated

- lumped model, but ...

Need further reduction of model order for real-time application

Structure preserving model reduction methods

- > aggregation into a smaller RC-network through a Markov chain
- > (on-line adaption of aggregate R,C values)
- > extension into bilinear form

#### Publication

K. Deng, P. Barooah, P. G. Mehta, and S. P. Meyn. Building Thermal Model Reduction via Aggregation of States. American Control Conf., July 2010

# 6. Integrated CPS design environment

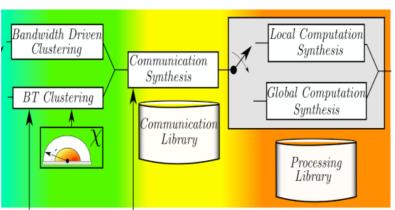
Bridging the gap from specification to implementation: Synthesis-based Design Methodology

### Input

- Application Task Specification •
- **Physical Constraints**
- Libraries of processing and communication elements

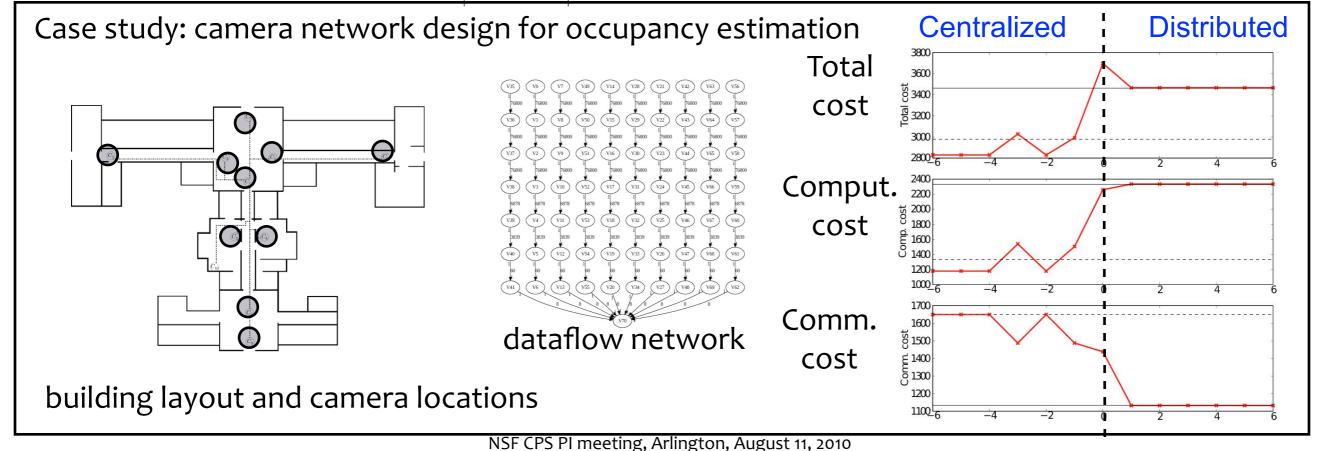
### Design steps

- Task Clustering
- **Communication Synthesis**
- **Computation Synthesis**



#### Output

- Choice of processing elements
- Mapping of actors to processing elements
- Implementation of the interconnection network



# Summary

- Buildings are the largest consumers of energy
- Buildings are complex cyber physical systems
- Computation, communication and control
- Adaptation to time-variations is crucial
- Large (un-utilized) data streams

### Pugh Hall (UF campus)



- 53,000 sq. ft., LEED Silver
- 3 AHUs, 66 VAV boxes,
- > 1000 "points"
- ▶ Value of information: what to measure, what to model?
- ▶ Appropriate CPS performance metrics?
- ▶Information management and longevity?