

## LEC 00 : Course Introduction

Professor Scott Moura  
University of California, Berkeley

Summer 2017



# Why take ENE 2XX?

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*Learn to view, abstract, and design  
renewable energy systems from an optimization  
point of view.*

# Prerequisite Previous Coursework

- Multivariable calculus (Math 53)
- Linear algebra (Math 54)
- Probability and Statistics (CE 93 or EE 126 or STAT 154)
- Numerical computing (E 7 or CS 61)
- Mechanics (Physics 7A)
- Electricity and Magnetism (Physics 7B)
- Thermodynamics or heat transfer (E 115 or ME 40 or ME 105 or ME 109)

Very Helpful (not required) previous/concurrent coursework

- Optimization (CE 191 or EE 127/227)
- Signals & Systems (EE 120) or Dynamic Systems & Feedback (ME 132)
- Linear Systems Theory (EE 221A/ME 232)

# Who takes CE 295?

**S14 Cohort (19 students):** Some of their current job titles:

- Data Scientist @ Facebook
- Algorithm Engineering @ Nest/Google
- System Engineer @ Northrop Grumman Corp
- Energy Engineer @ Itron
- Boston Consulting Group in London, UK

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**S15 Cohort (48 students):** Some of their current job titles:

- CEO/CTO & Founders of eLum (Energy Data Analytics Start-up)
- Director of Operations @ Lucid Design
- Data Scientist @ STEM (2)
- Data Scientist @ SolarCity
- Data Analyst @ BuildingIQ
- Machine Learning S/W Engineer @ Atigeo
- Applications Engineer @ SunEdison
- Engineering @ Apple
- Mechanical Engineer @ NRG Energy

# Who takes CE 295?

**S16 Cohort (45 students):** Some of their current job titles:

- Data Scientist @ AutoGrid
- Data Scientist @ UrbanSim
- Special Projects Lead @ Bridj
- Lead Analyst @ Advanced Microgrid Solutions (AMS)
- Utilities Engineer @ CPUC
- Engineer @ SRT Consultants
- Energy Engineer @ Partner Energy
- Energy Consultant @ Navigant
- Data & Analytics Consultant @ Deloitte
- Project Engineer @ McCarthy Building Companies
- Sustainability Project Consultant @ Thornton Tomasetti

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**Exclusive access to alumni above:** Join the CE295 LinkedIn Group:

<https://www.linkedin.com/groups/7068321>

**S17 Cohort ( $\approx$ 60 students):** Ugrad degrees:

CEE, ME, EECS, MSE, EnergyE, Math, Physics, ChemE, PetroleumE,  
Environmental Science, Econ, Spanish and more

# Outline

1 Syllabus

2 Motivation

# Class Format

**Lectures:** July 3-7 & July 10-12, 14:00-15:35, Zhiyuan Bldg C3-2011

**Website:** <https://ecal.berkeley.edu/files/ene2xx/>

Professor Scott Moura  
smoura@berkeley.edu

WeChat: scott-moura

Office Hours: 15:45 – 17:00 @ C2-F15

TA: Zhou Zhe  
zhouzhe.20080808@163.com

WeChat: Danrhette

Office Hours: 09:20–12:00 @ C2-F15

Attendance is required to perform well

# Technical Content

**Lectures/Notes** provide control system tools for analysis & management of energy systems.

**HWs/Project** facilitate motivation and application of control system tools.

Assignment	<b>System &amp; Control Tool</b>	<b>Energy Application</b>
HW Project	Linear Program. & Robust Program. Second Order Cone Program.	Power System Microgrids

# Textbooks

**No textbooks are required. Course notes have been developed specifically for CE 295, and will be distributed through the semester online.**

The following is officially recommended for additional background:

- G. M. Masters, Renewable and Efficient Electric Power Systems, John Wiley & Sons, 2013
- S. Boyd and L. Vandenberghe, Convex optimization. Cambridge University Press, 2009.

Lecture format:

- Mostly slides, occasionally blackboard
- Slides will be available online
- Supplemental reading materials will be available online

# Grading

Straight scale (we may curve up, but probably won't need to):

Homework	20pts	One assignment due Friday July 7
Project	30pts	Assignment due Friday July 14

A total of 50pts are possible. **Philosophy: Consistency and transparency**

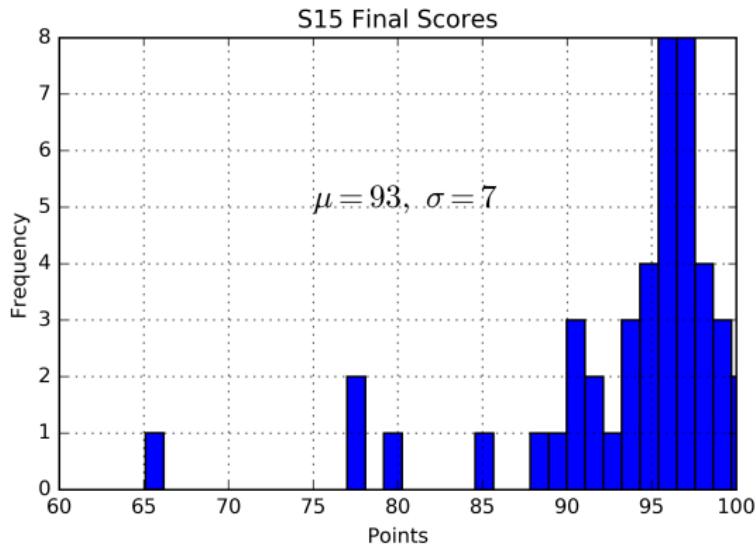
# Previous Semester Grades

**S14 Grades:** Mean: 90% (A-) High: 98.5% (A+) Low: 83% (B)

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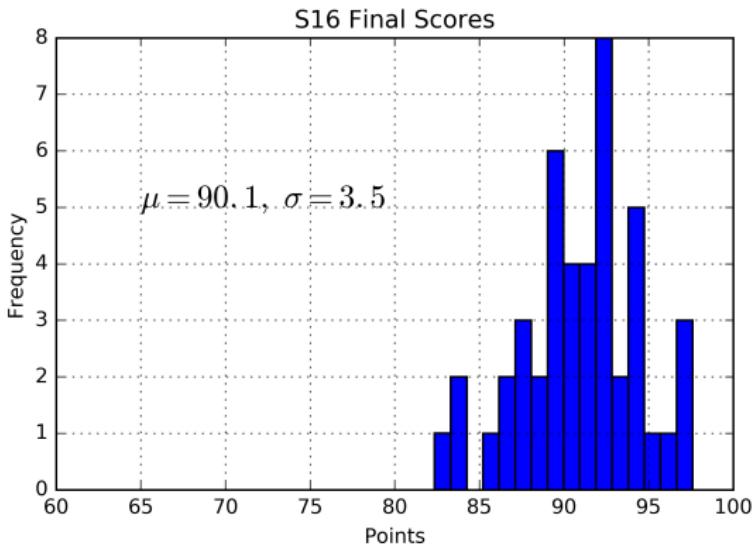
**S14 Grades:** Mean: 90% (A-) High: 98.5% (A+) Low: 83% (B)

**S15 Grades:** Mean: 93% (A-) High: 99.8% (A+) Low: 65% (D)



# Previous Semester Grades

<b>S14 Grades:</b>	Mean: 90% (A-)	High: 98.5% (A+)	Low: 83% (B)
<b>S15 Grades:</b>	Mean: 93% (A-)	High: 99.8% (A+)	Low: 65% (D)
<b>S16 Grades:</b>	Mean: 90.1% (A-)	High: 97.6% (A)	Low: 82.4% (B-)



**Remark:** SU17 Grades are NOT guaranteed to match S14, S15, S16 distributions

# Numerical Computing

Homework assignments require use of MATLAB or Python (you pick).

## **MATLAB 2017** MATLAB Academy

<<https://matlabacademy.mathworks.com/>> is recommended to learn/refresh.

## **Python 2.7** is FREE for download at <<https://www.python.org/downloads/>>.

We recommend Anaconda distribution for SciPy packages

<<https://www.continuum.io/>>, and IPython Notebook

<<http://ipython.org/notebook.html>> for an interactive computational environment. Code Academy <<https://www.codecademy.com/>> is recommended to learn/refresh Python.

**Common Question:** Can I use another programming language (e.g. R, C++, Java, Fortran, counting on my toes) for the HWs and/or project?

**A:** Yes. However, the instructional staff will only support MATLAB/Python.

# Policies - I

**Late Submissions:** Two points are subtracted for each 24 hours submitted late (rounded up to nearest integer).

**Q:** *Do I lose points if I submit at 5:02pm PT?*

**Regrade Policy:** If you feel a problem was graded incorrectly, you may submit a regrade request to Prof. Moura. This request MUST be submitted within one week of receiving the graded assignment, with a short paragraph justifying the regrade. Any regrade request is subject to a full regrade, i.e. points may be lost.

## Policies - II

**Planned Absences:** You may request to submit assignments early or late. E-mail me your request three days prior to the assignment due date. Requests due to extended holidays will not be granted. Requests due to emergencies will be handled case-by-case.

**Late Enrollment:** Students require instructor permission to enroll after the first week of classes. Missed assignment deadlines will result in zero credit, unless otherwise arranged with the instructor.

*Q: Can I submit HW next week, just before final grades are submitted? I enrolled late.*

**E-mail Correspondence:** Use [ENE 2XX] in your message subject. We typically respond within one day, however our ability to help declines as e-mail volume increases. Please be considerate and concise. Do not wait until the due-date to ask questions, otherwise they may not be answered.

Students must abide the Code of Conduct. For further reference, see the Berkeley Campus Code of Student Conduct at <http://sa.berkeley.edu/code-of-conduct>.

*If you cheat and I catch you, then you'll receive an automatic zero in ENE2XX.*

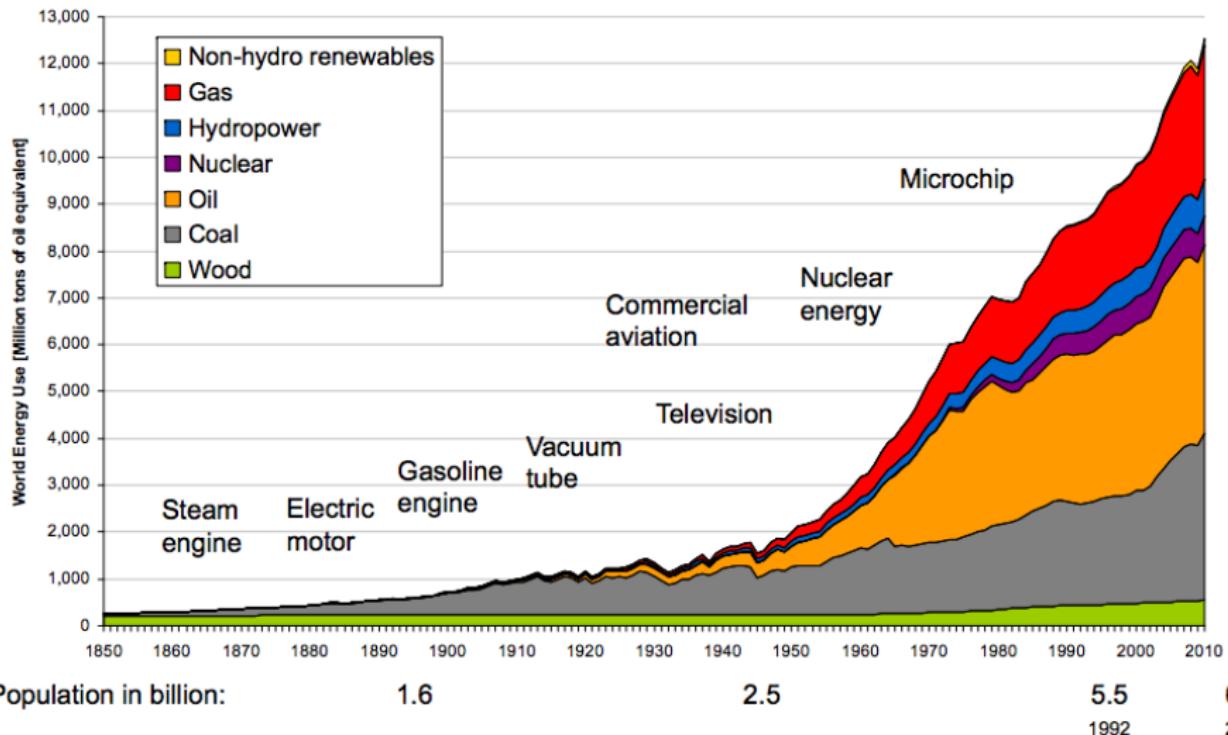
# How to Succeed (in a UC Berkeley or Tsinghua Engineering Course)

- Ask questions in class
- Form a study group
- Read the course notes
- Complete the exercises in the course notes
- Start HW assignments early
- See instructor after class
- See instructor during OH
- See TA during OH
- Send us an e-mail. Use [ENE 2XX] in subject.

# Outline

1 Syllabus

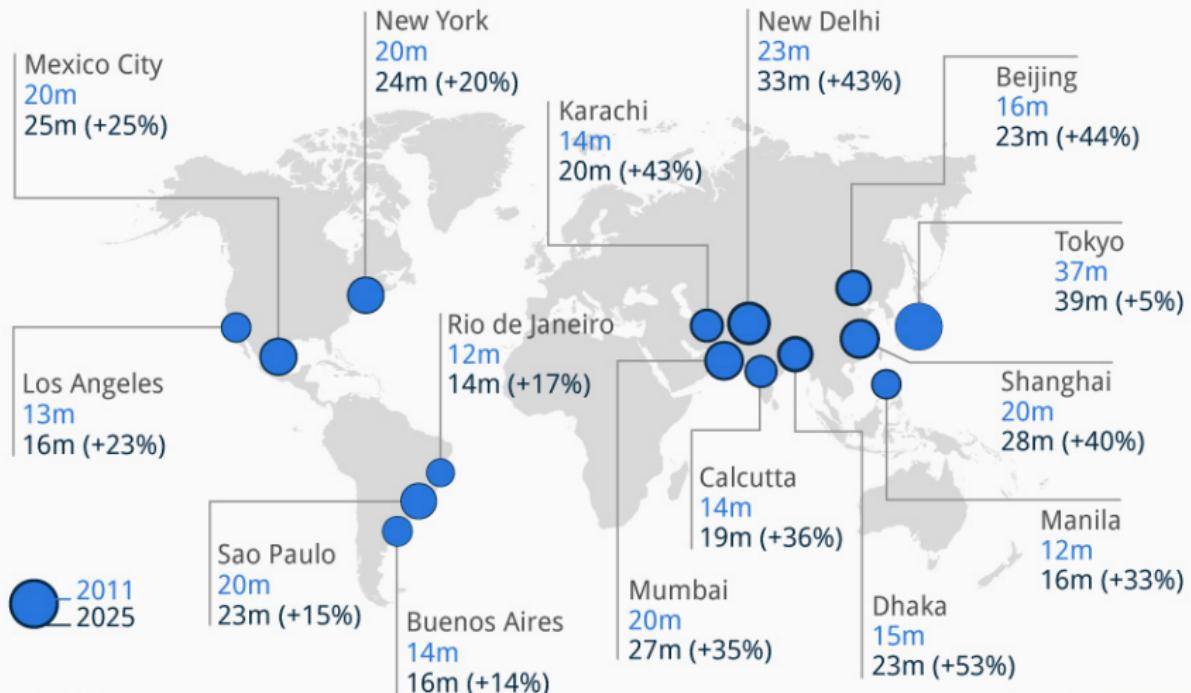
2 Motivation



Compiled from data by Gruebler (1999), BP Statistical Review (2011) Nakicenovic & Gruebler (2000)

# The World's Megacities Are Set for Major Growth

Population growth of the world's top 15 megacities (millions, 2011-2025)



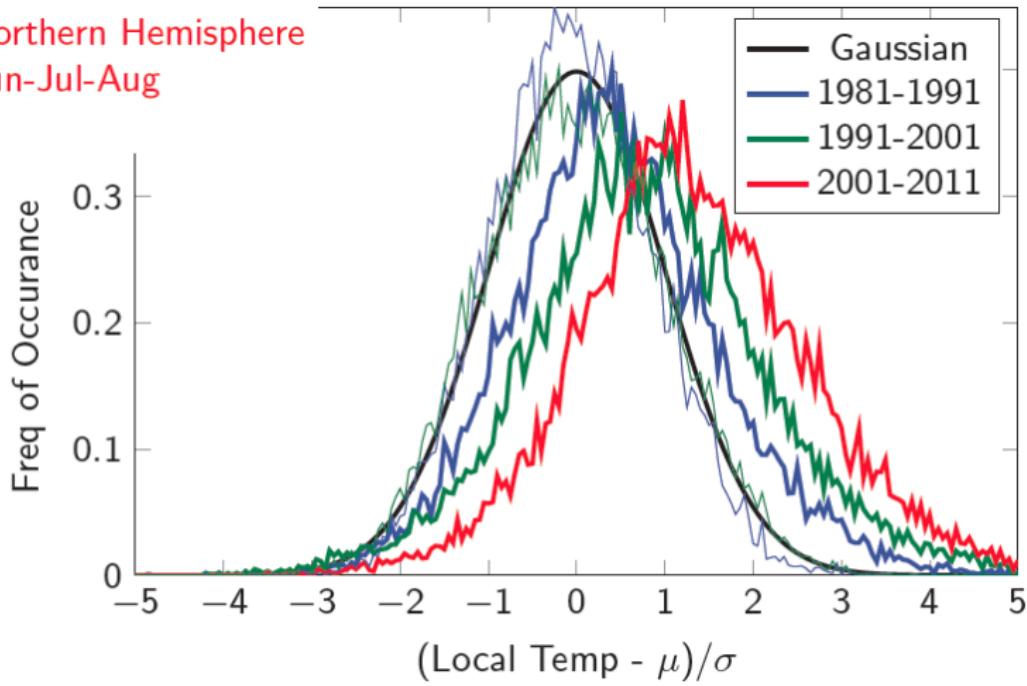
\* including metropolitan areas

Source: UN Population Division, World Economic Forum

statista

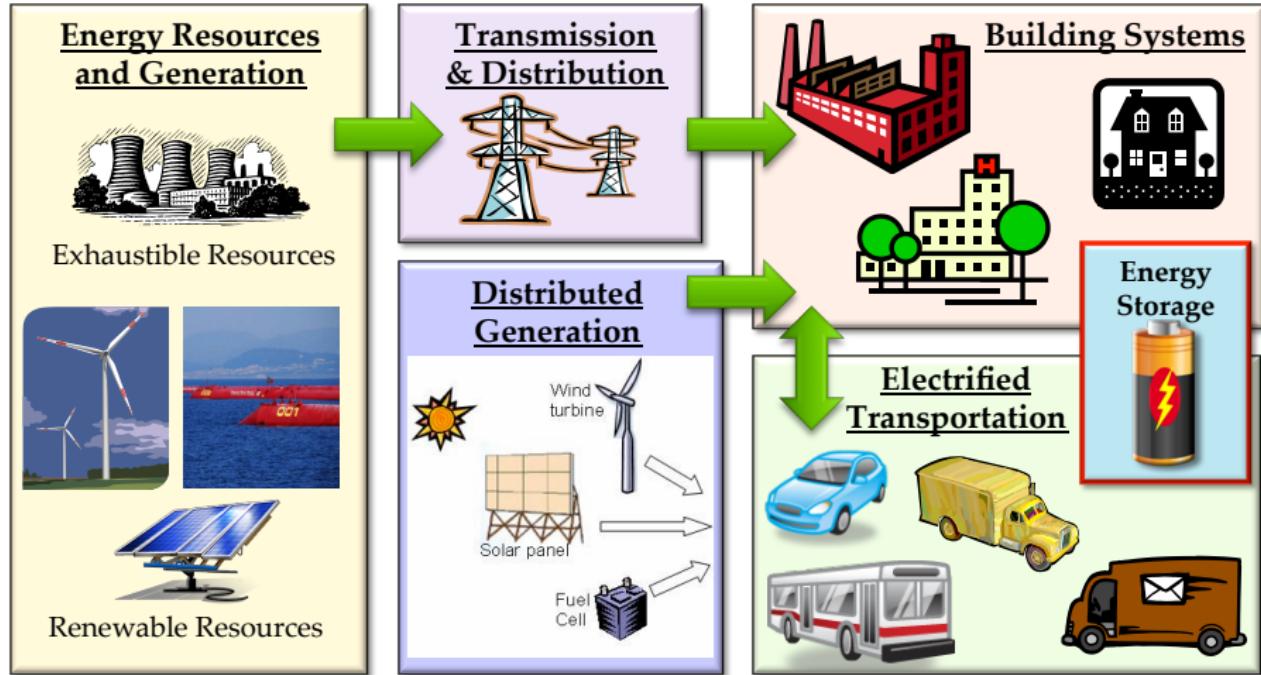
# Global Weather Extremes

Northern Hemisphere  
Jun-Jul-Aug



Hansen, Sato, Ruedy, Perception of climate change, *PNAS*, Aug 2012

# Vision for Future Energy Infrastructure



# What is a Cyber Physical System (CPS)?

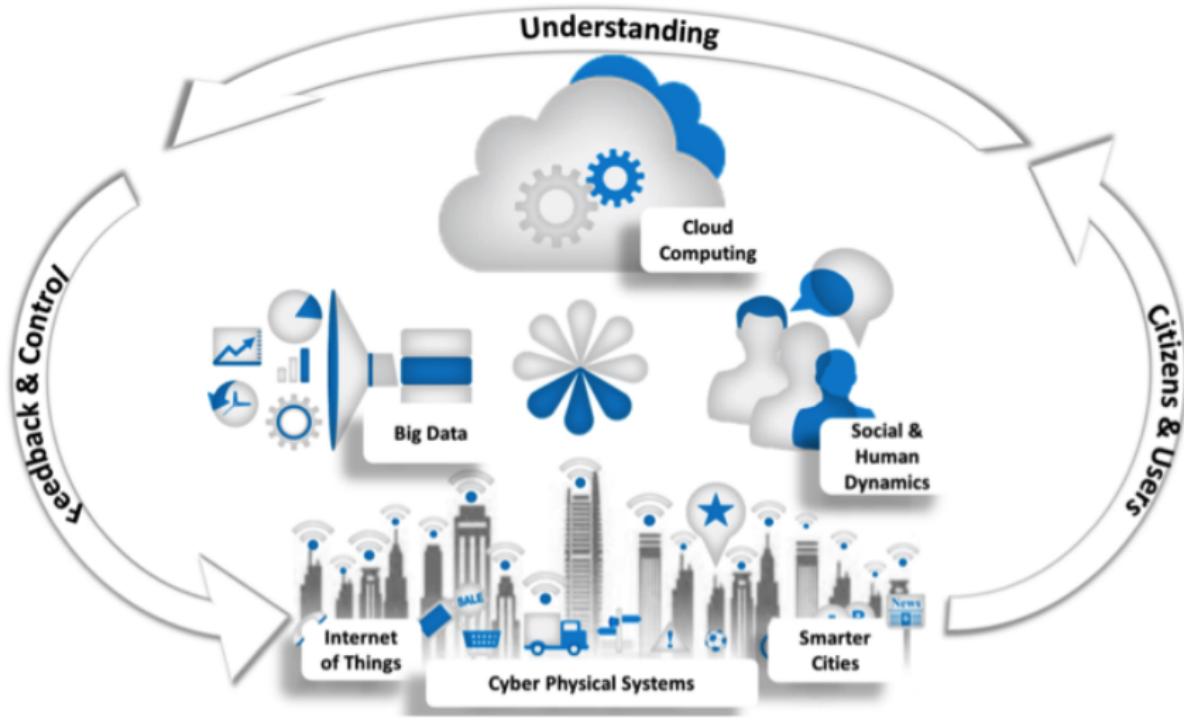
# What is a Cyber Physical System (CPS)?

*Integration of physical processes with networked computing*

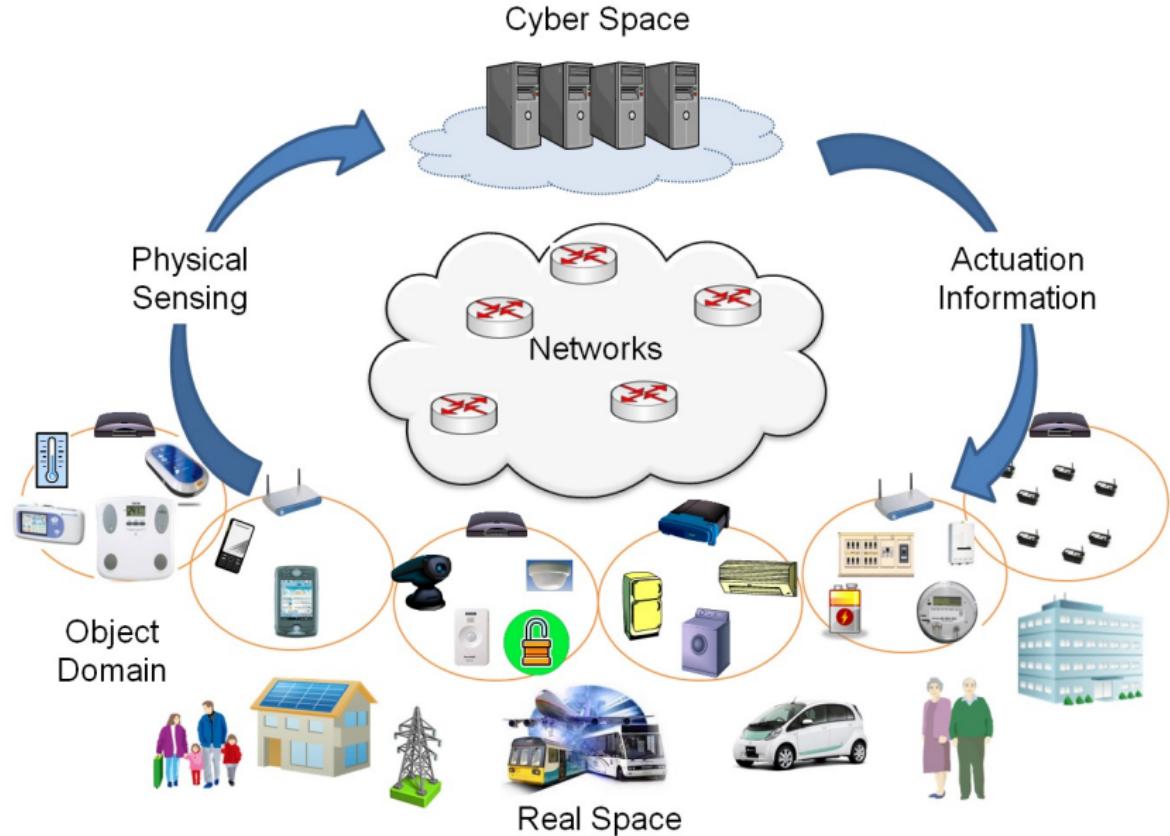


# What is a Cyber Physical System (CPS)?

*Sensing → Understanding → Managing*



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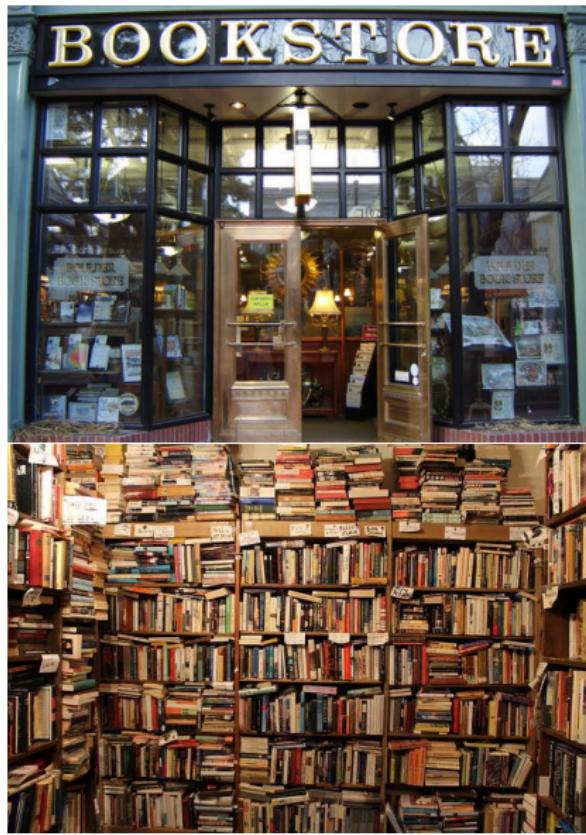
# What is a Cyber Physical System (CPS)?

## *Five Pillars of CPS*

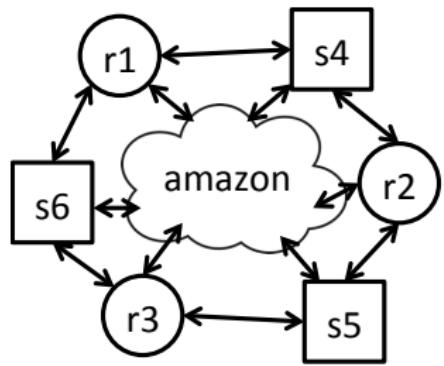
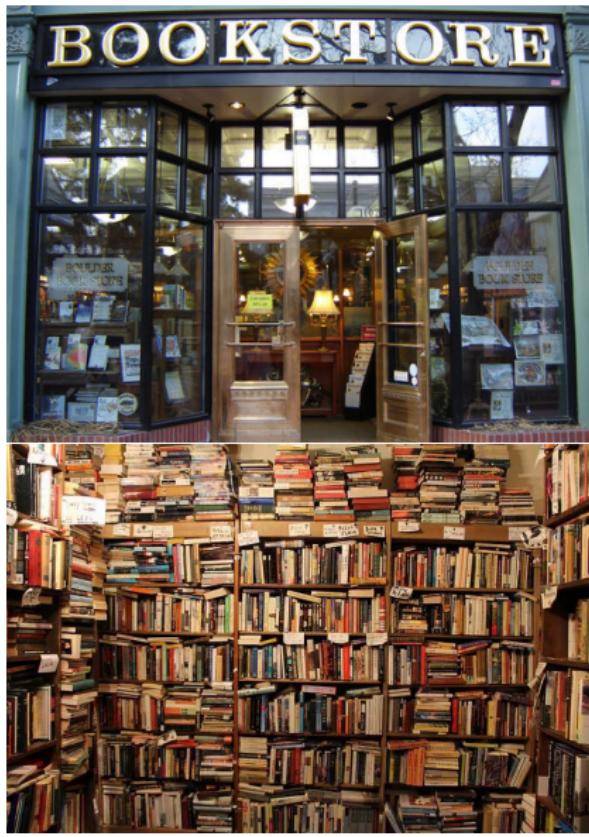
- ① infrastructure systems;
- ② sensing;
- ③ actuation;
- ④ connectivity;
- ⑤ **controls & optimization!**

# EXAMPLES OF TRANSFORMATIVE INNOVATIONS WHEN ADDING A CYBER LAYER

# Retail



# Retail



# Mobility

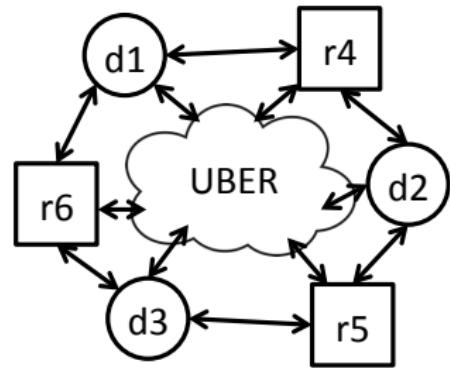


© Getty Images

# Mobility



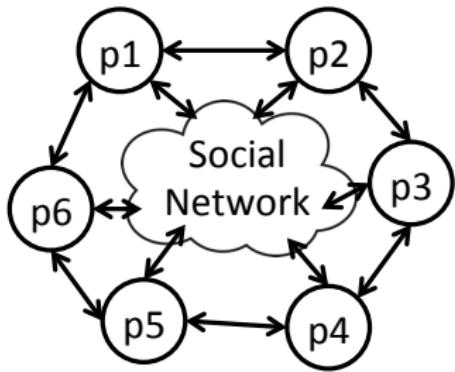
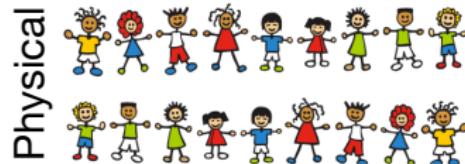
Cyber      U B E R



# Social Interaction



# Social Interaction



# TINDER FOR ENERGY?



# eBay for Energy?

a.k.a. “Internet of Energy”

# APPENDIX

# Related Courses

incomplete list

## **Systems & Control**

- CE 191 (Systems Analysis)
- EE 221A (Linear Systems)
- ME C134 / EE C128 (FB Control)
- ME C231A / EE C220B (Experiential Ctrl)
- ME C232 / EE C220A (Adv Control)
- ME 234 (Multivar Control)
- ME 237 / EE 222 (Nonlinear Control)
- CE 290I (Internet-based Systems)
- CE C291F (Distributed Param Sys)
- CE 271 (Sensors & Signals)
- CE 263N (Scalable Spatial Analytics)

## **Energy**

- CE 107 (Climate Change)
- ER 200 (Energy & Society)
- ER 254 (Power Systems)
- Arch249 / ER 290 (Bldg Energy)
- ER 290-1 (Energy Analysis)
- CE 290:003 (Alt. Fuels)
- CE 256 (Sustainable Trans.)
- EEP 147 (Reg. Energy & Env.)
- ARE 264 (Empirical Energy Econ)
- Law 270.6 Energy Reg. & Env.
- Law 270.7 (RE & Alt. Fuels)

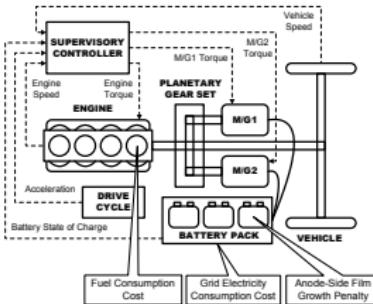
[M.S. Curriculum in Energy Systems \[link\]](#)

[Course Recommendations for eCAL Research \[link\]](#)

# Example 1: Transportation



Model S Battery Pack



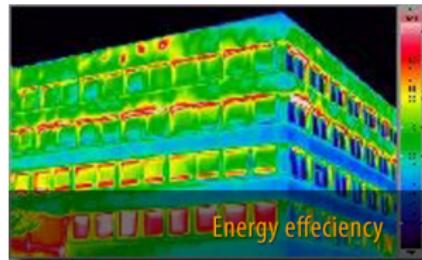
PHEV Drivetrain



Velib Bicycles

- State-of-charge estimation
- State-of-health estimation
- Optimal energy management
- Speed forecasting and adaptation to traffic
- Redistribution problem
- Optimal station location

## Example 2: Buildings



Building Environmental Monitoring



Plug Loads



Nest Thermostat

- Building model identification
- Temperature estimation
- Occupancy estimation
- Energy Management of Plug-Loads
- Machine Learning
- Model predictive control

# Example 3: Smart Grid



Solar and Wind Power



Grid-scale Battery Energy Storage



Smart Meter

- Robust Investment Planning
- Risk limiting dispatch
- Wind/Solar Forecasting
- Management of Energy Storage
- Frequency Regulation
- Load Control
- Model predictive control
- Load aggregation