

# CAE 465/526 Building Energy Conservation Technologies

## Fall 2023

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**August 31, 2023**

Building energy consumption patterns and  
performance analysis

Built  
Environment  
Research  
@ IIT



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# **ANNOUNCEMENTS**

# Announcement

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- Assignment 1 is posted

# INTRODUCTION

# Introduction

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- Understanding energy consumption patterns in:
  - Campus buildings
  - Residential/Commercial buildings
- Starting to look into calculating and predicting energy consumption patterns using building energy models

# Classify Buildings

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- Understand approaches to analyze building energy consumption patterns
- Use a classification procedure
- Characterize weather data
- Consider a building selection criteria
- Capture all energy consumption commodities
- Utilize different energy modeling methods

# Understand Energy Use Pattern of Buildings

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- Select buildings with different ages, shapes, and occupancy patterns
- Install sensors to track energy consumption of buildings and weather data
- Clean the monitored energy and weather data
- Establish a procedure to analyze and classify buildings based on their energy use pattern

# **CAMPUS BUILDINGS**



# Why Campus Buildings

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- Campuses Typically:
  - Have sustainability programs that monitor energy consumption of buildings. Record energy commodities with different level of granularity such as 15 minutes, hourly, monthly
  - Open to share monitored energy consumption of buildings with the research community
  - Operate with different energy commodities such as electricity, natural gas, steam, and chilled water, enabling better disaggregation of end-uses without sub-metering end-uses.
  - Spend close to \$2 billion each year on energy\*
  - Endeavor to construct new buildings or renovate existing buildings to meet the requirements for energy efficient buildings

\* Sub-metering for higher education campuses with EnergyStar <http://www.aashe.org/files/aashe2011-materials/p515311.pdf>

# Campus Buildings Are Unique

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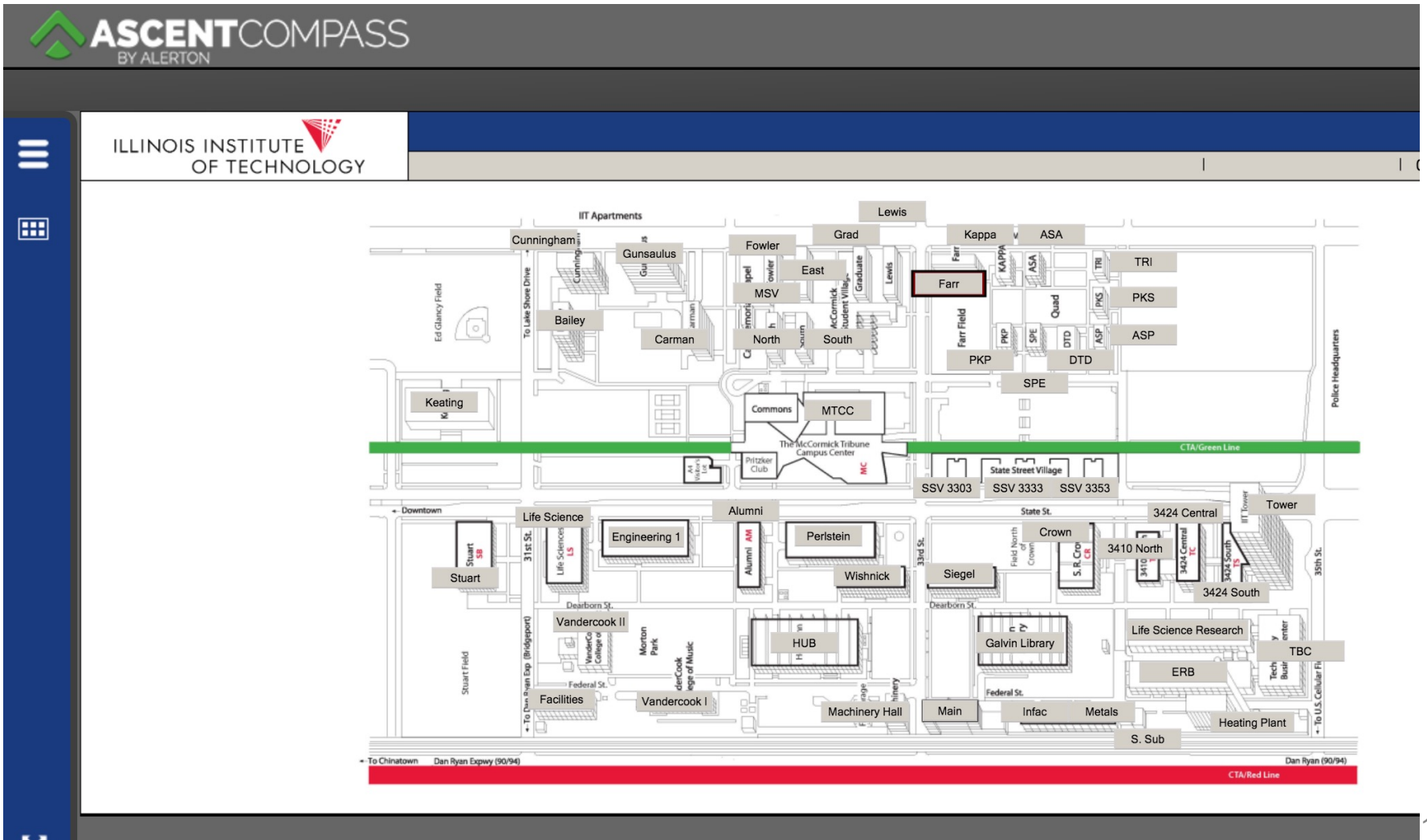
- Campus buildings are unique due to the existence of:
  - Buildings with different ages with different HVAC systems (e.g., baseboards, VAV with reheat)
  - Buildings with different sizes and shapes
  - Buildings with different principal activity (e.g., offices, classrooms, laboratories), meaning buildings have different occupancy pattern.
  - Energy intense laboratories (e.g., laboratories with fume hoods, bio-safety cabinet)



- This enables opportunities to retrofit buildings and save energy consumption of the buildings

# Monitoring System

- IIT monitoring system database:



# Monitoring System

- Stuart building energy data summary:

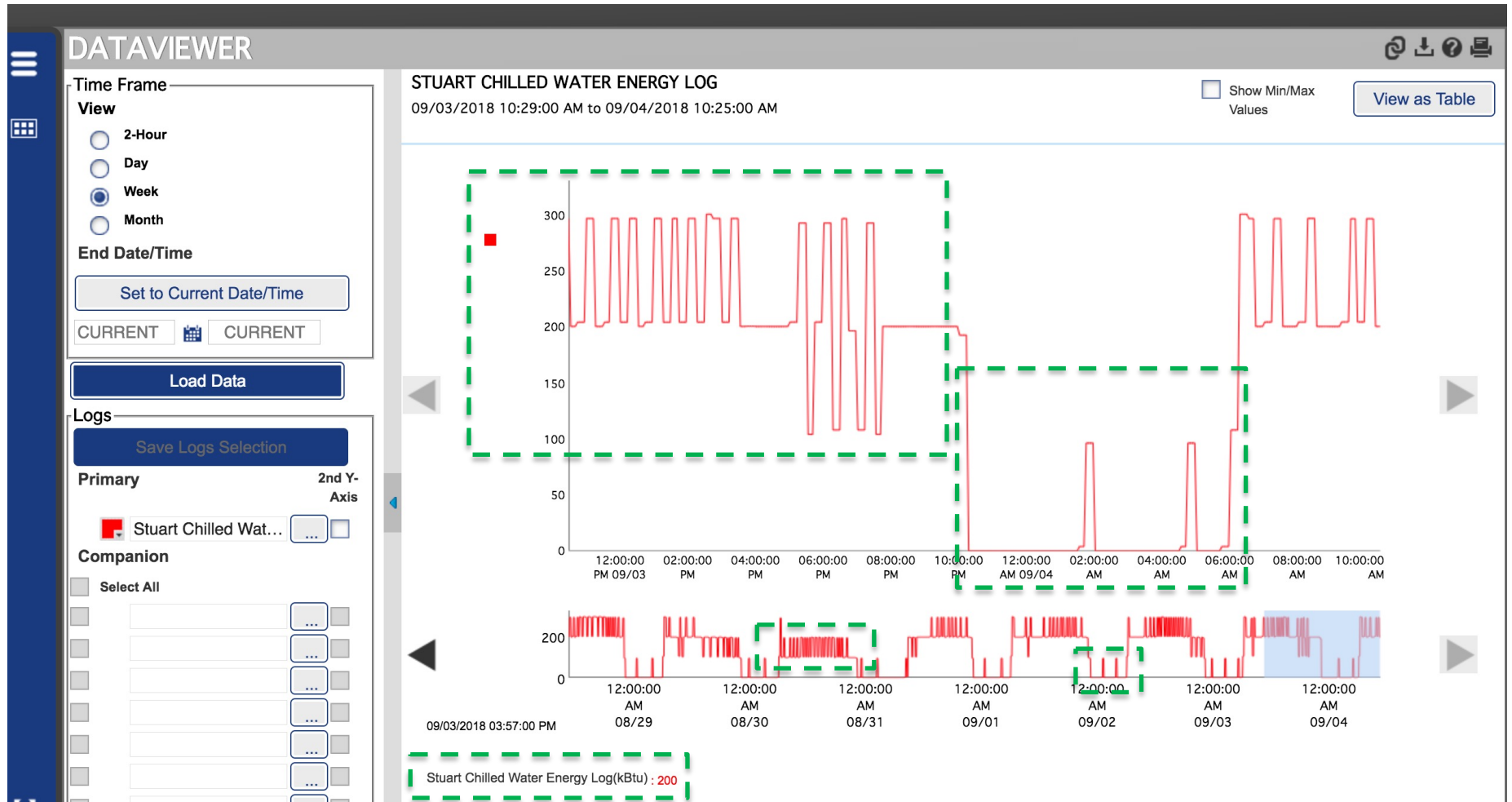
Meter Number	Electric 1 (kWh) Summary	Steam 1 (lbs) 1DD2-1-P01	Chilled Water (kBTU) #1
<b>Current Meter Reading</b>	-	21,356,710 lbs	15,188,800 kBTU
<b>Yesterday's Meter</b>	-	21,356,710 lbs	15,183,500 kBTU
<b>Last Month's Meter</b>	-	21,356,710 lbs	15,140,000 kBTU
<b>Last Hour's Consumption</b>	47 kWh	0 lbs	900 kBTU
<b>Today's Consumption</b>	461 kWh	0 lbs	5,300 kBTU
<b>Yesterday's Consumption</b>	1,078 kWh	0 lbs	14,400 kBTU
<b>Month Consumption</b>	3,672 kWh	0 lbs	48,800 kBTU
<b>Last Month Consumption</b>	30,431 kWh	0 lbs	424,600 kBTU
<b>kBTUs This Month</b>	12,529 kBTU	0 kBTU	48,800 kBTU
<b>kBTUs Last Month</b>	103,835 kBTU	0 kBTU	424,600 kBTU
<b>Cost this Month (\$)</b>	302.43	0.00	835.29
<b>Cost Last Month (\$)</b>	2,506.30	0.00	7,267.74

## Totals

<b>Total Building Cost (\$)</b>	<b>1,137.72</b>	<b>kBTUs/Sq. Ft this Month</b>	<b>0.77</b>
<b>Last Month Cost (\$)</b>	<b>9,774.03</b>	<b>Total Building kBTUs</b>	<b>61,329</b>

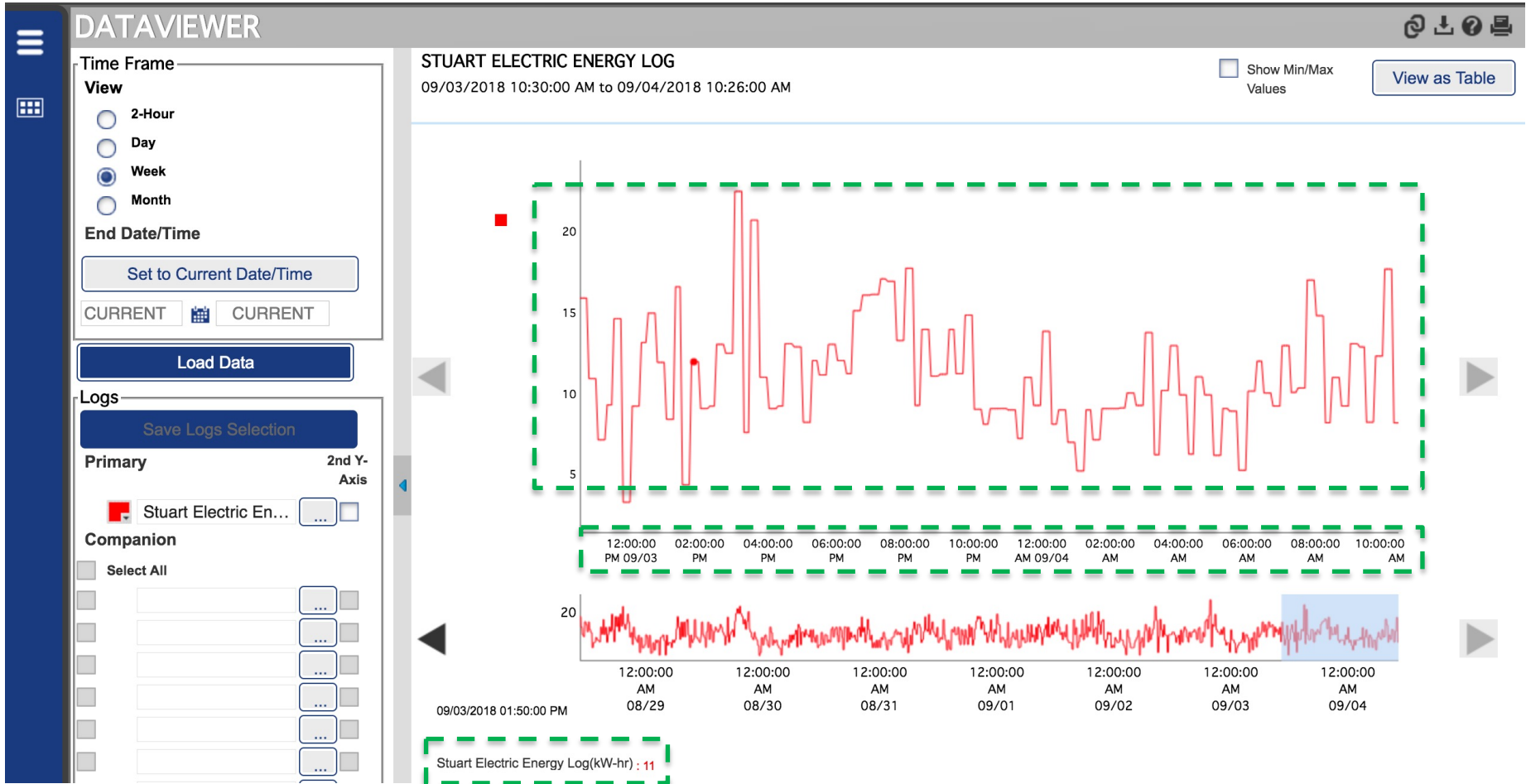
# Monitoring System

- Stuart building chilled water energy pattern



# Monitoring System

- Stuart building electric energy pattern



# Monitoring System

- Some campuses are more open to share the data to public

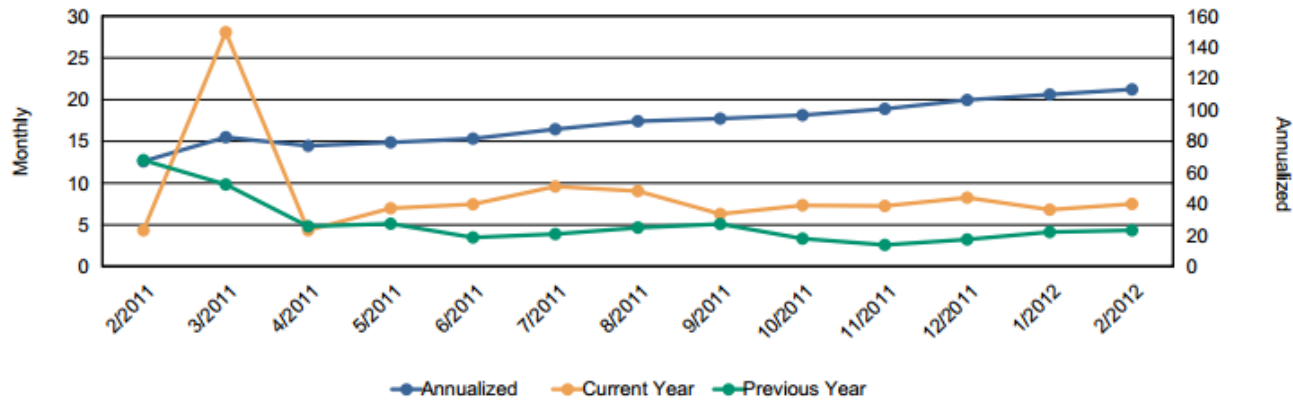
**DIVISION OF ADMINISTRATION  
UTILITIES & ENERGY MANAGEMENT**



Energy Use Index (EUI) Monthly Report Card By Cost  
For the Period Ending February 28, 2012

Buildings >= 2,000 gsf

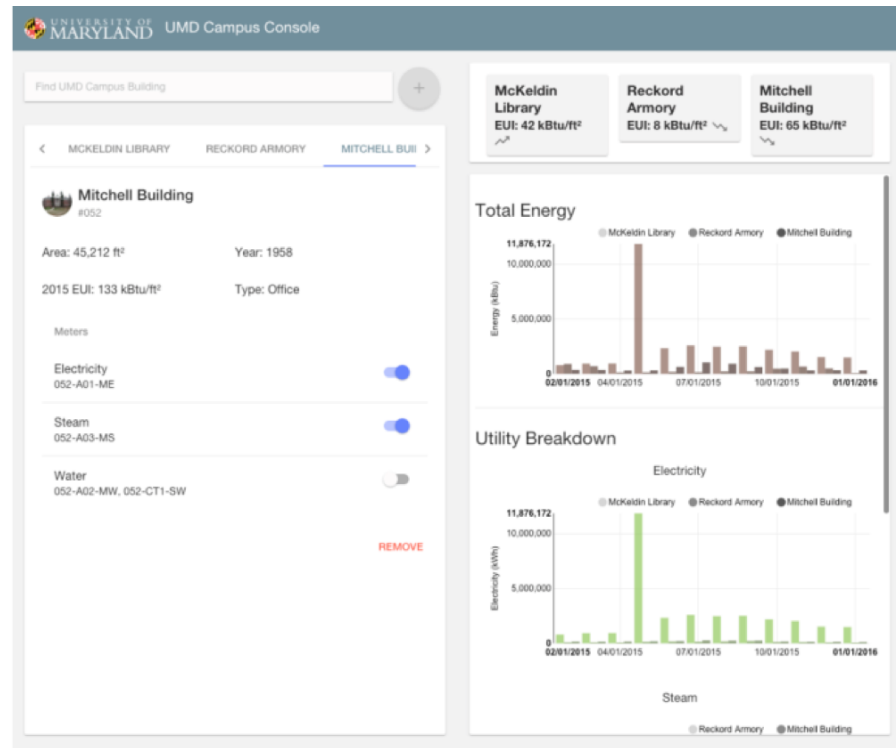
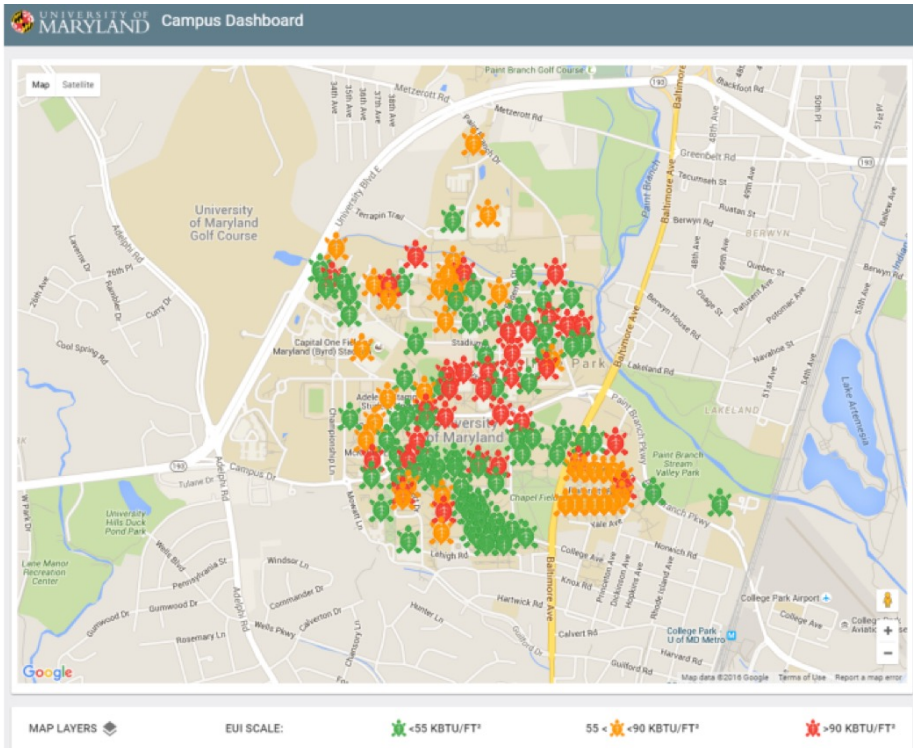
#	Building	GSF	EUI	Annual Cost
0039	aquaculture research teaching facility	4,333	113	\$9,344



#	Building	GSF	EUI	Annual Cost
0040	field lab and office bldg	2,275	134	\$7,548

# Monitoring System

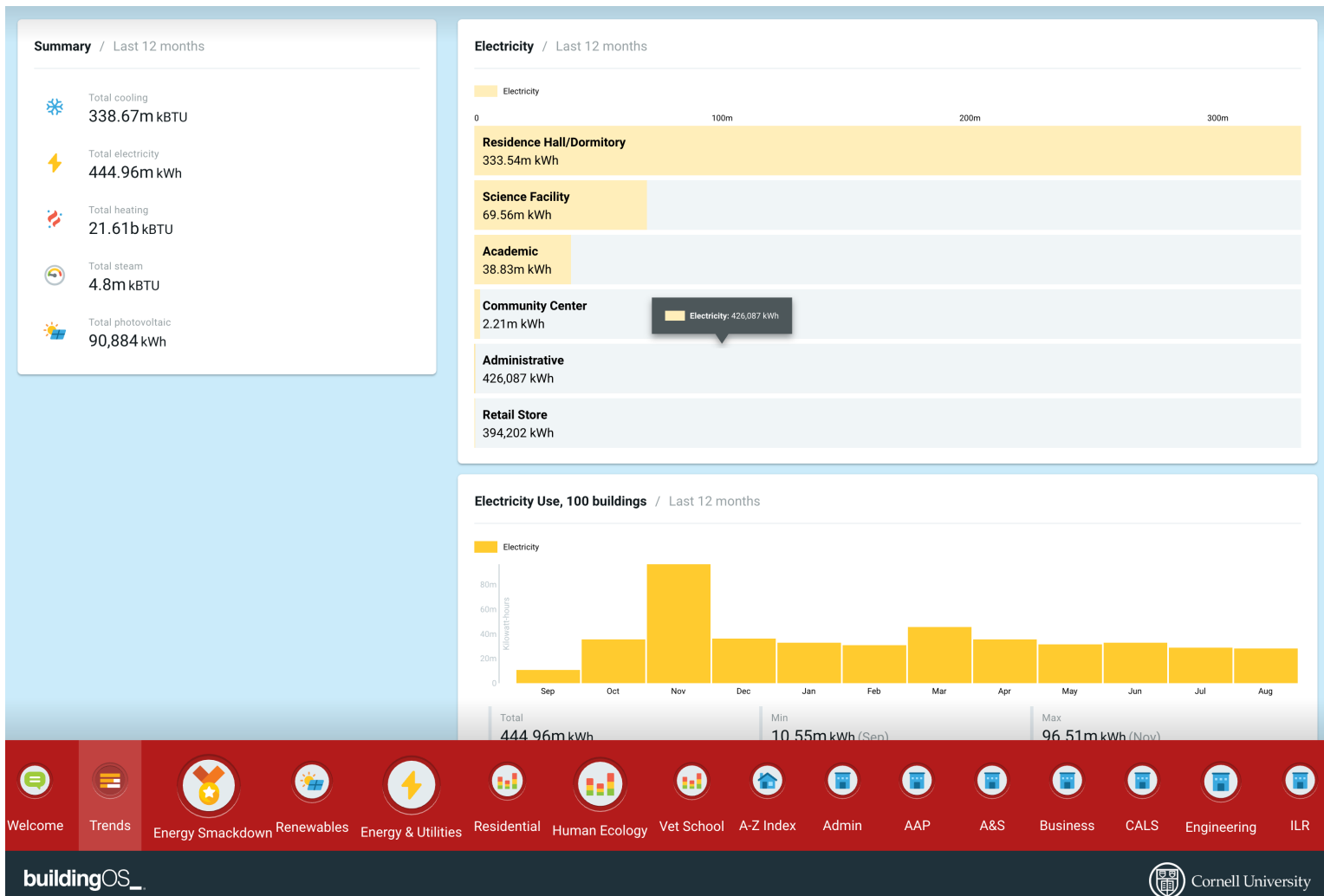
- University of Maryland Energy Dashboard





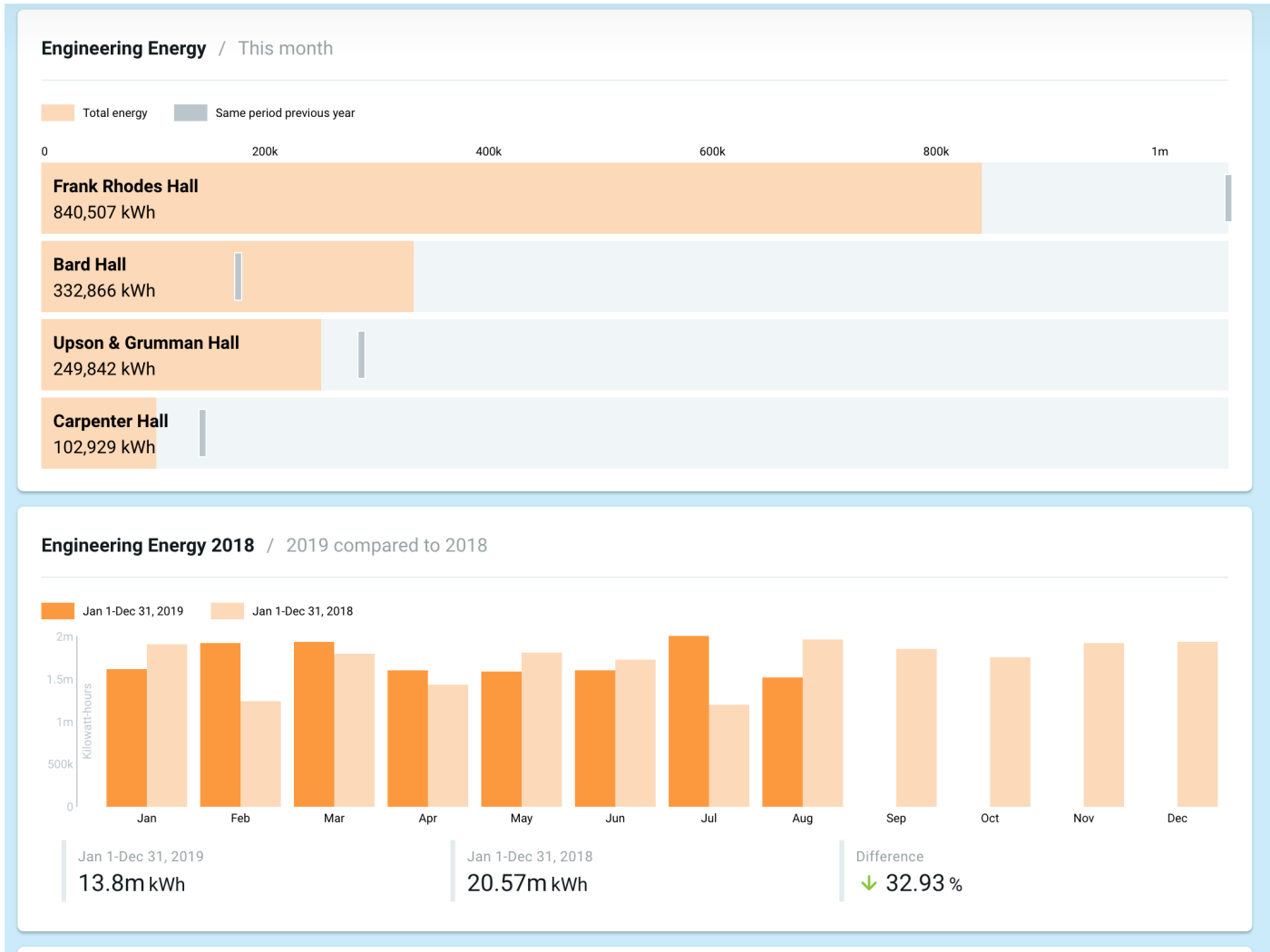
# Monitoring System

- Cornell University Energy Dashboard



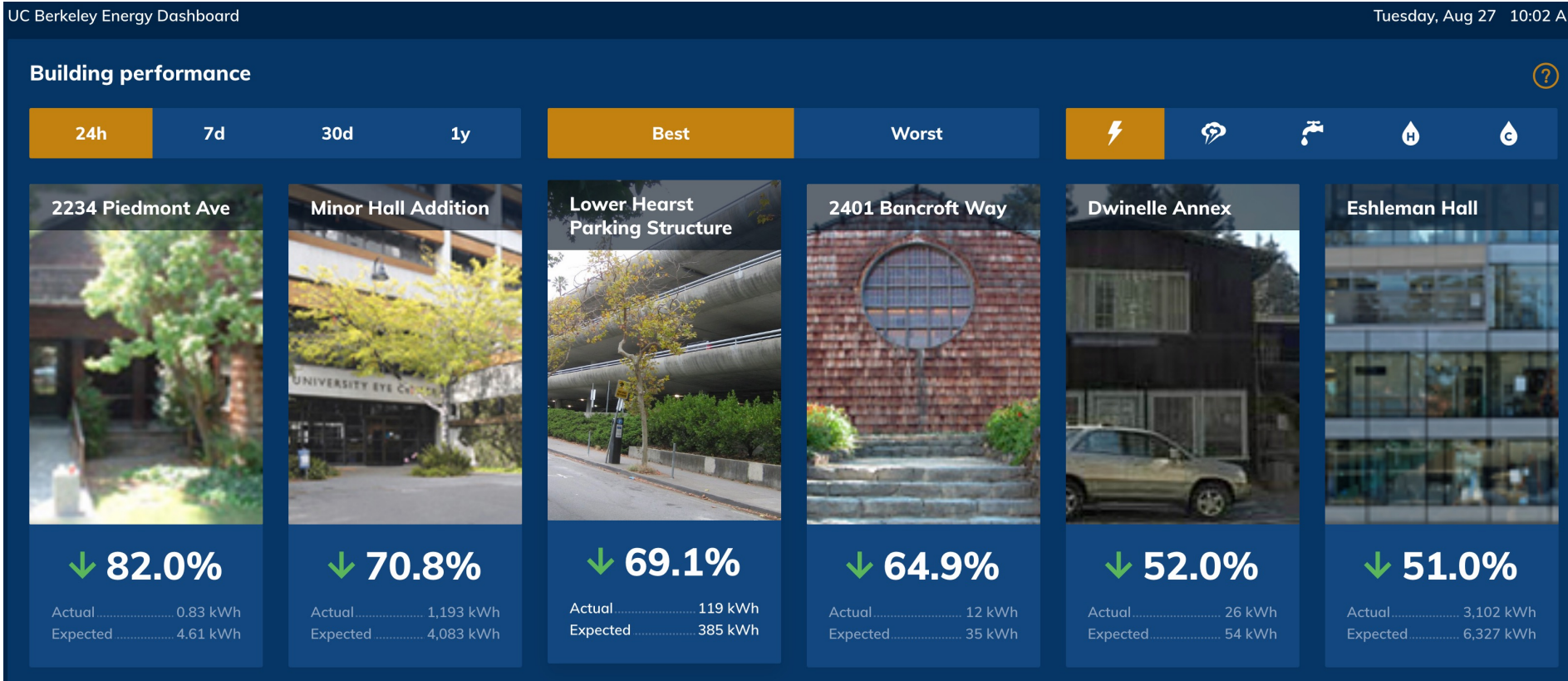
# Monitoring System

- Cornell University Energy Dashboard



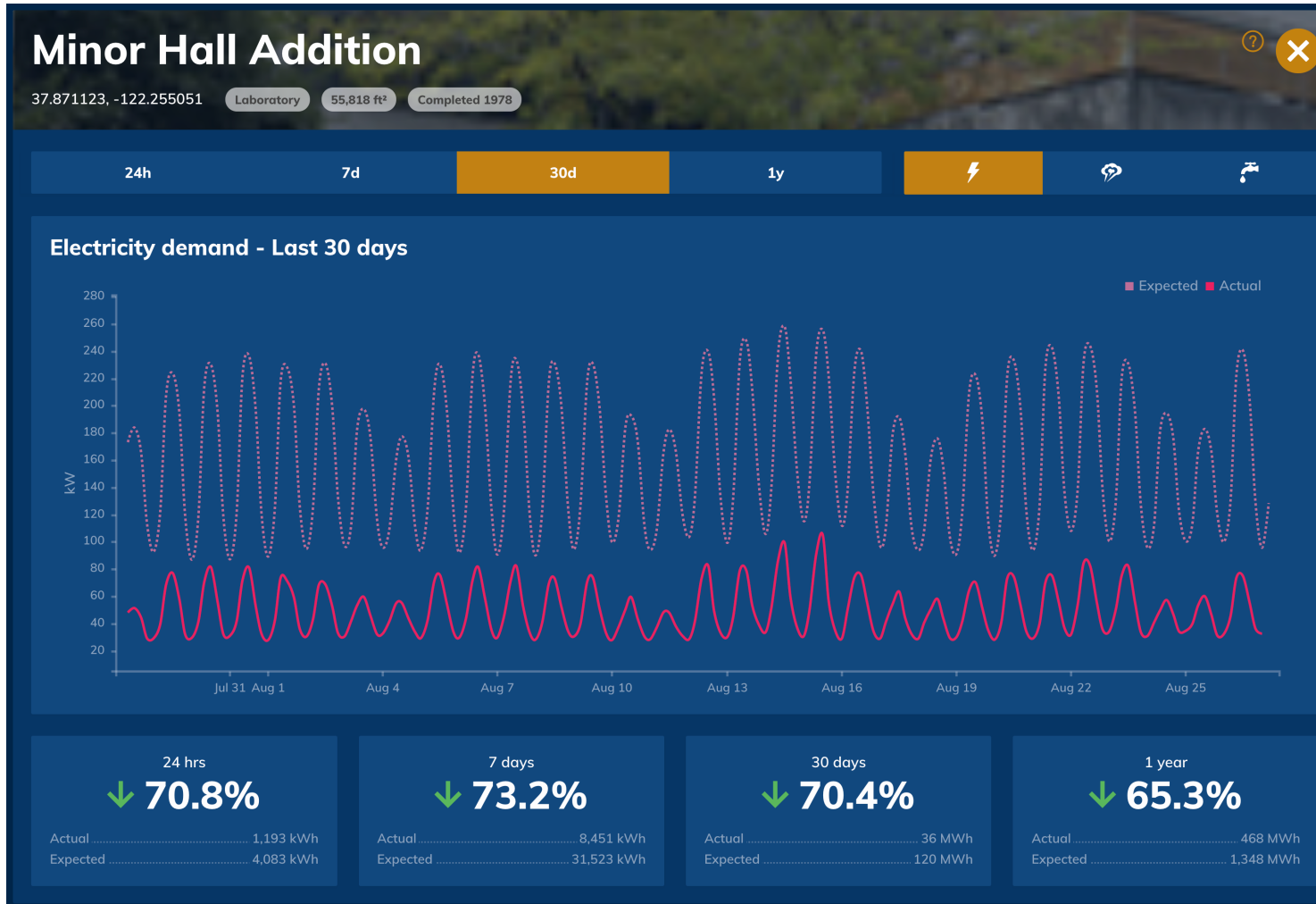
# Monitoring System

- UC Berkeley Energy Dashboard



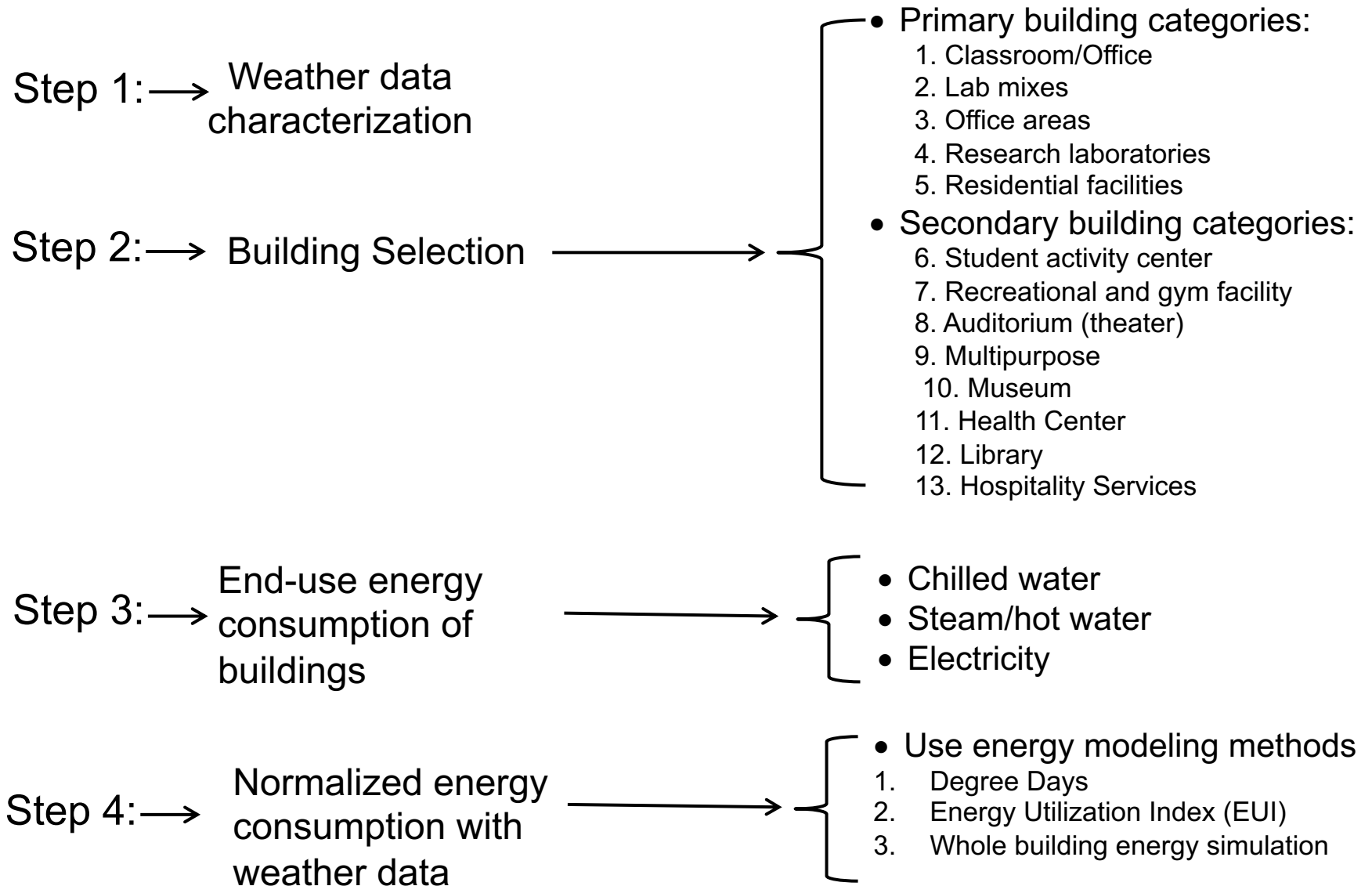
# Monitoring System

- UC Berkeley Energy Dashboard



# Classification Procedure: Campus Buildings

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# Weather Data Characterization

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- Common variables:
  - Dry bulb temperature
  - Dew point temperature
  - Cooling Degree Days (CDD)
  - Heating Degree Days (HDD)
  
- Degree Days (DD): is the difference in temperature between the outdoor mean temperature over a 24-hour period and a given base temperature. For the purposes of determining building envelope requirements\*

# Weather Data Characterization

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$$HDD(balance) = 1 \text{ day} \times \sum_{\text{number of days}} (T_{\text{outdoor}} - T_{\text{balance}})^+$$

$$CDD(balance) = 1 \text{ day} \times \sum_{\text{number of days}} (T_{\text{outdoor}} - T_{\text{balance}})$$

# Weather Data Characterization

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- CDD base 50°F, CDD50, or 10°C, CDD10:
  - When the mean temperature is more than 50°F or 10°C, temperature difference between the mean temperature for the day and 50°F or 10°C
  - Annual CDDs are the sum of the degree-days over a calendar year \*
- **Example:** What's the CDD for a day with mean day outdoor air temperature of 68°F (20°C)?



# Weather Data Characterization

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- HDD base 65°F, HDD65, or 18°C, HDD18:
  - When the mean temperature is less than 65°F or 18°C, temperature difference between the mean temperature for the day and 65°F or 18°C \*.
  - Annual HDDs are the sum of the degree-days over a calendar year.
  - An example:
- **Example:** What's is the HDD for a mean day outdoor air temperature of 32°F (0°C)?

\* ASHRAE Standard 169: Weather Data for Building Design Standards

# **CLASS ACTIVITY**

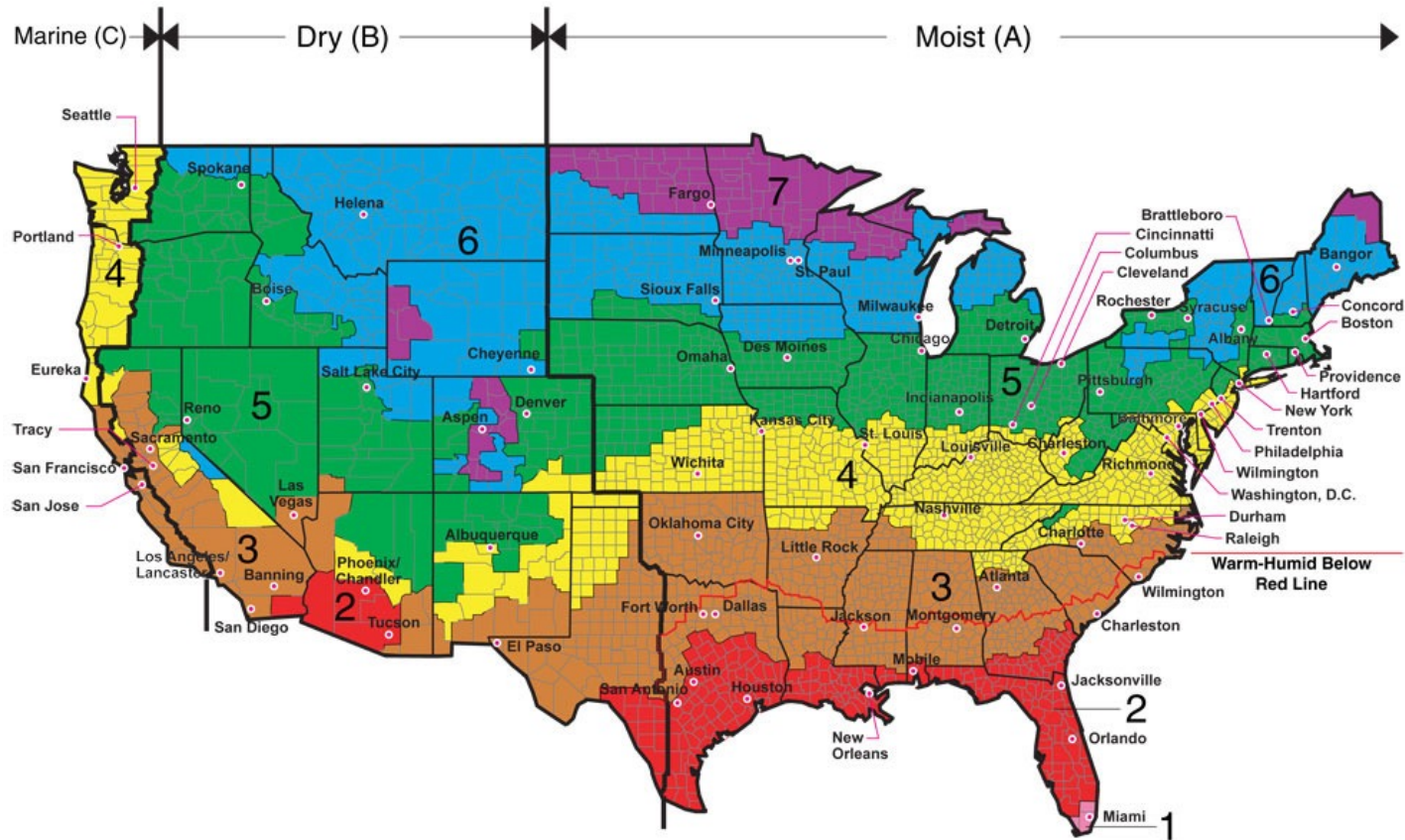
# Class Activity

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- **Example:** Calculate heating and cooling degree days for Chicago in using a TMY3 file?
- Additional notes:
  - Download files from here: [http://climate.onebuilding.org/WMO\\_Region\\_4\\_North\\_and\\_Central\\_America/USA\\_United\\_States\\_of\\_America/index.html](http://climate.onebuilding.org/WMO_Region_4_North_and_Central_America/USA_United_States_of_America/index.html)
  - Unzip the folder
  - Change the extension to CSV from EPW.
  - Understand the columns: <https://bigladdersoftware.com/epx/docs/8-2/auxiliary-programs/epw-csv-format-inout.html#:~:text=EPW%20CSV%20Format%20to%20the,shown%20and%20then%20the%20data.>

# Weather Data Characterization

- ASHRAE Climate Zones



What's our climate zone?

\* ASHRAE Standard 169: Weather Data for Building Design Standards

# Weather Data Characterization

- ASHRAE Climate Zones

Zone Number	Name	Thermal Criteria	
		I-P Units	SI Units
1	Very Hot – Humid (1A), Dry (1B)	9000 < CDD50°F	5000 < CDD10°C
2	Hot – Humid (2A), Dry (2B)	6300 < CDD50°F ≤ 9000	3500 < CDD10°C ≤ 5000
3A and 3B	Warm – Humid (3A), Dry (3B)	4500 < CDD50°F ≤ 6300	2500 < CDD10°C ≤ 3500
3C	Warm – Marine	CDD50°F ≤ 4500 and HDD65°F ≤ 3600	CDD10°C ≤ 2500 and HDD18°C ≤ 2000
4A and 4B	Mixed – Humid (4A), Dry (4B)	CDD50°F ≤ 4500 and 3600 < HDD65°F ≤ 5400	CDD10°C ≤ 2500 and HDD18°C ≤ 3000
4C	Mixed – Marine	3600 < HDD65°F ≤ 5400	2000 < HDD18°C ≤ 3000
5A, 5B and 5C	Cool– Humid (5A), Dry (5B), Marine (5C)	5400 < HDD65°F ≤ 7200	3000 < HDD18°C ≤ 4000
6A and 6B	Cold – Humid (6A), Dry (6B)	7200 < HDD65°F ≤ 9000	4000 < HDD18°C ≤ 5000
7	Very Cold	9000 < HDD65°F ≤ 12600	5000 < HDD18°C ≤ 7000
8	Subarctic	12600 < HDD65°F	7000 < HDD18°C

# Weather Data Characterization

- Online tools:



## Degree Days.net - Custom Degree Day Data

Degree Days.net calculates degree-day data for energy-saving professionals worldwide. It is developed and maintained by [BizEE Software](#).

**New API features (for software developers):** we recently launched a JSON API to run alongside the existing XML API, and new online test tools for both. Now it's easier than ever to get your software fetching data from our system automatically. [Find out more about the API.](#)

**Degree Days.net**

Enter a weather station ID if you have one, or search for any city, state, ZIP code, or airport code.

Weather station ID

"60616"

United States

Illinois

Chicago (PPLA2) ([map](#))

- KMDW: CHICAGO MIDWAY AIRPORT, IL, US (87.75W,41.79N)
- KORD: CHICAGO OHARE INTERNATIONAL, IL, US (87.93W,41.99N)
- KGYG: Gary Regional, IN, US (87.41W,41.62N)
- KIGQ: Chicago, Lansing Municipal Airport, IL, US (87.53W,41.53N)
- KPWK: CHICAGO EXECUTIVE AIRPORT, IL, US (87.90W,42.12N)
- KLOT: Chicago/Romeoville, Lewis University Airport, IL, US (88.10W,41.61N)
- KMDA: CHICAGO/WEST CHICAGO, IL, US (88.25W,41.91N)

Data type  Heating  Cooling  Regression(beta)

Temperature units  Celsius  Fahrenheit

Base temperature   Include base temperatures nearby

Breakdown  Daily  Weekly  Monthly  Custom  Average

Period covered

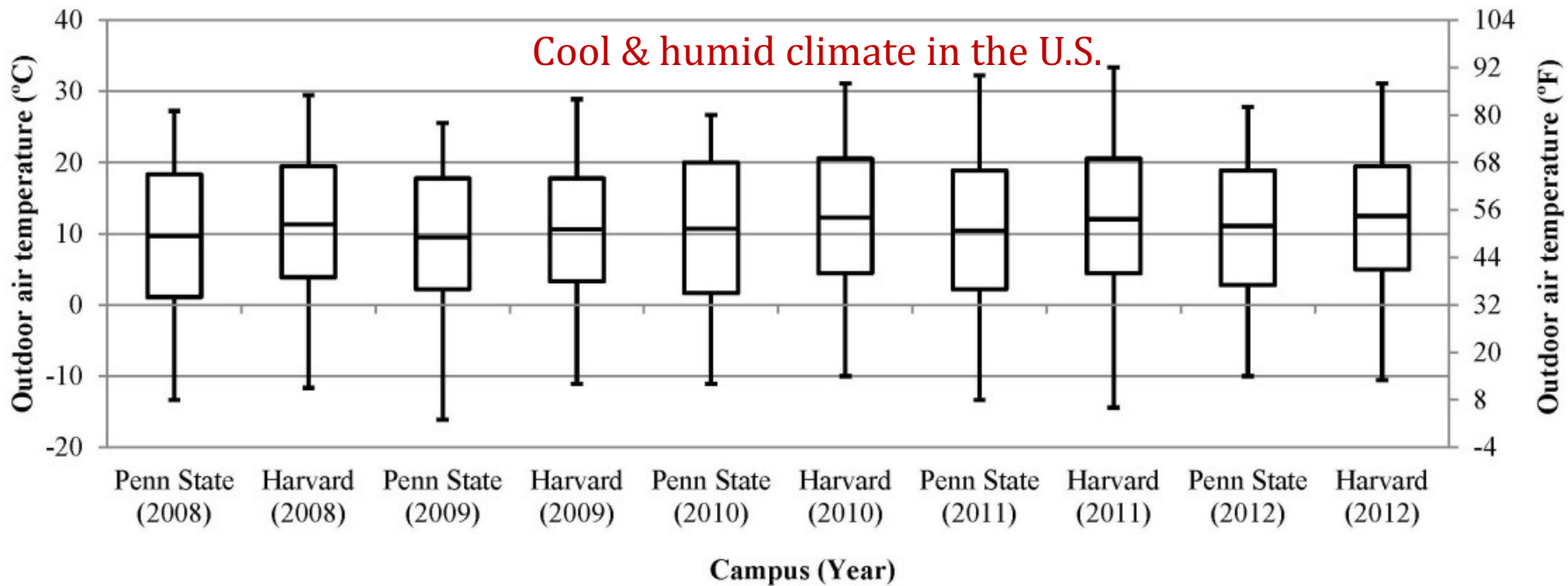
# Weather Data Characterization

TABLE D-1 U.S. and U.S. Territory Climatic Data (Continued)

State/City	Latitude	Longitude	Elev., ft	HDD65	CDD50	Heating Design Temperature	Cooling Design Temperature		Number of Hours 8 a.m.–4 p.m.
						99.6%	Dry-Bulb 1.0%	Wet-Bulb 1.0%	
<b>Illinois (IL)</b>									
Aurora	41.75 N	88.35 W	644	6699	2880	NA	NA	NA	NA
Belleville/Scott AFB	38.55 N	89.85 W	453	4878	4146	3	93	77	NA
Carbondale Sewage Plt	37.73 N	89.17 W	390	4865	3934	NA	NA	NA	NA
Champaign	40.03 N	88.28 W	755	5689	3697	NA	NA	NA	NA
Chicago Midway AP	41.73 N	87.77 W	620	6176	3251	NA	NA	NA	NA
Chicago O'Hare WSO AP	41.98 N	87.90 W	674	6536	2941	–6	88	73	613
Chicago University	41.78 N	87.60 W	594	5753	3391	NA	NA	NA	NA

# Weather Data Characterization

- An example from the Penn State and Harvard campus study.

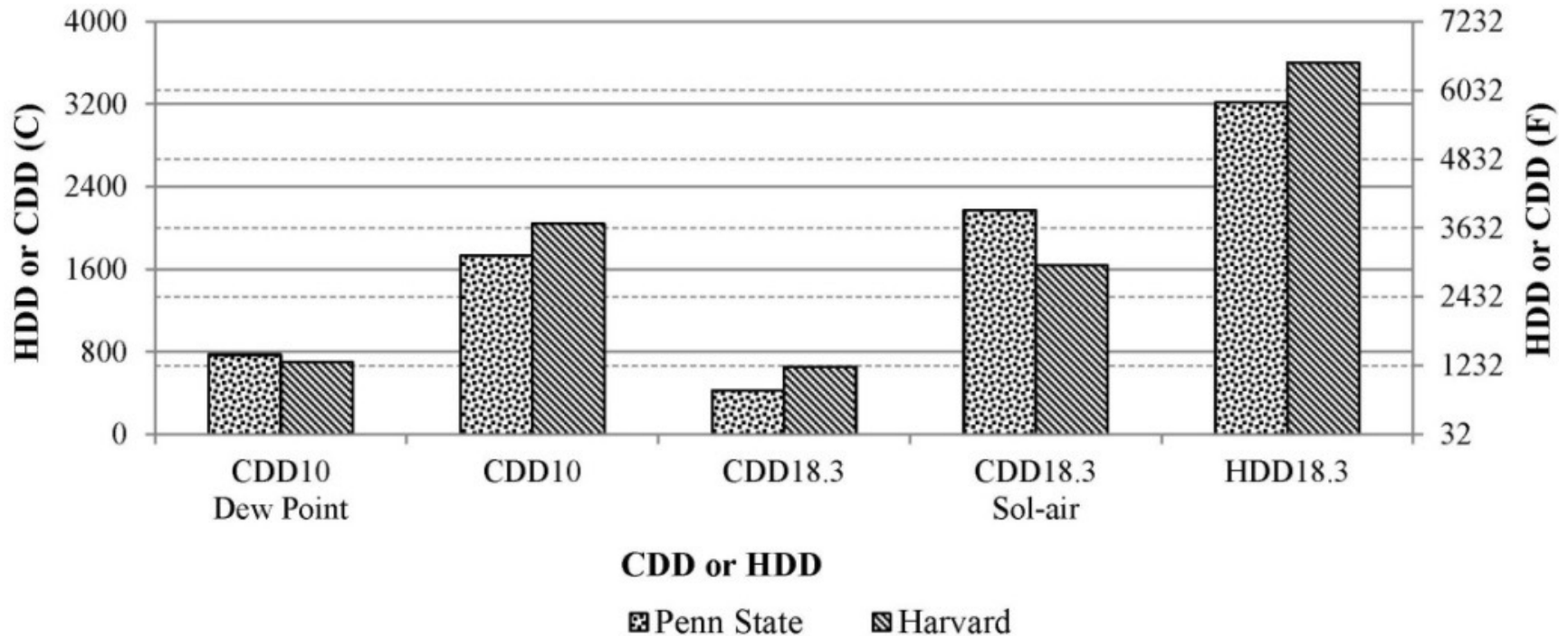


*Average daily temperature for five years*



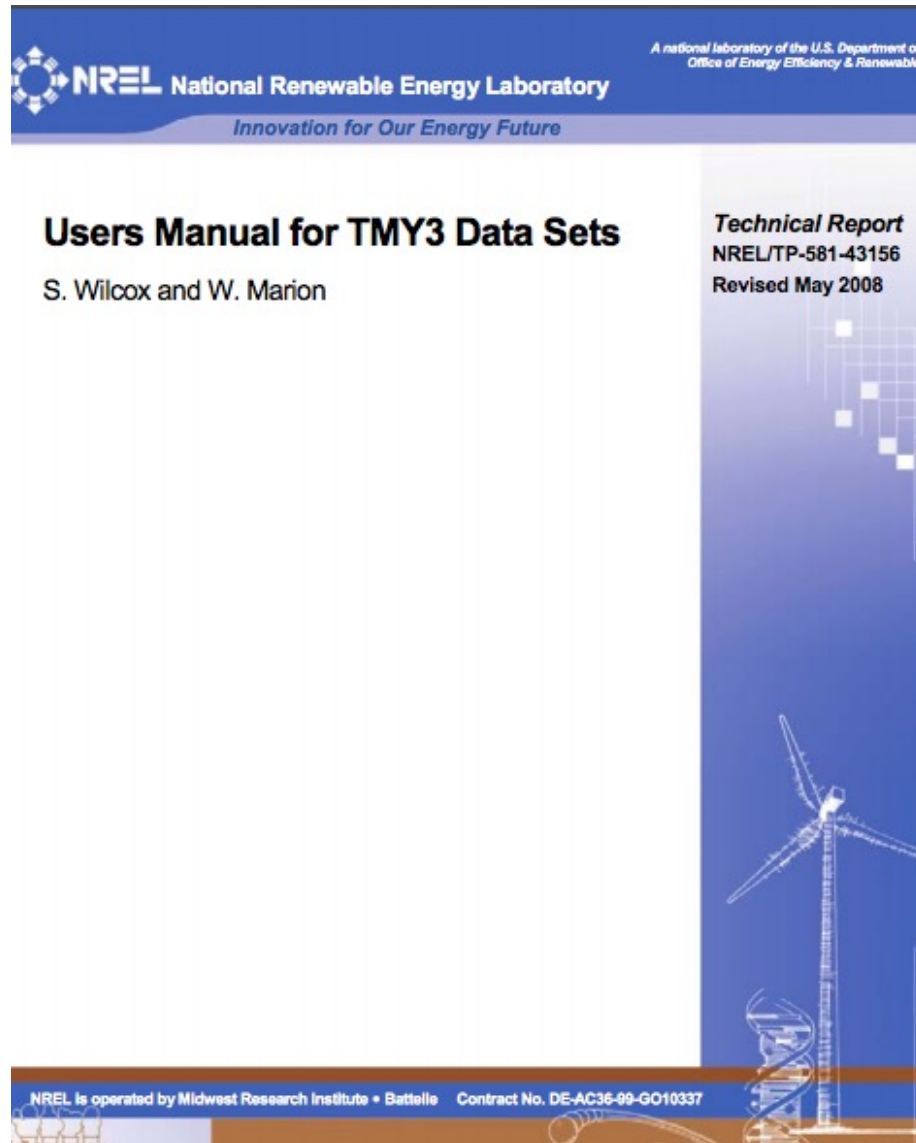
# Weather Data Characterization

- An example from the Penn State's campus.

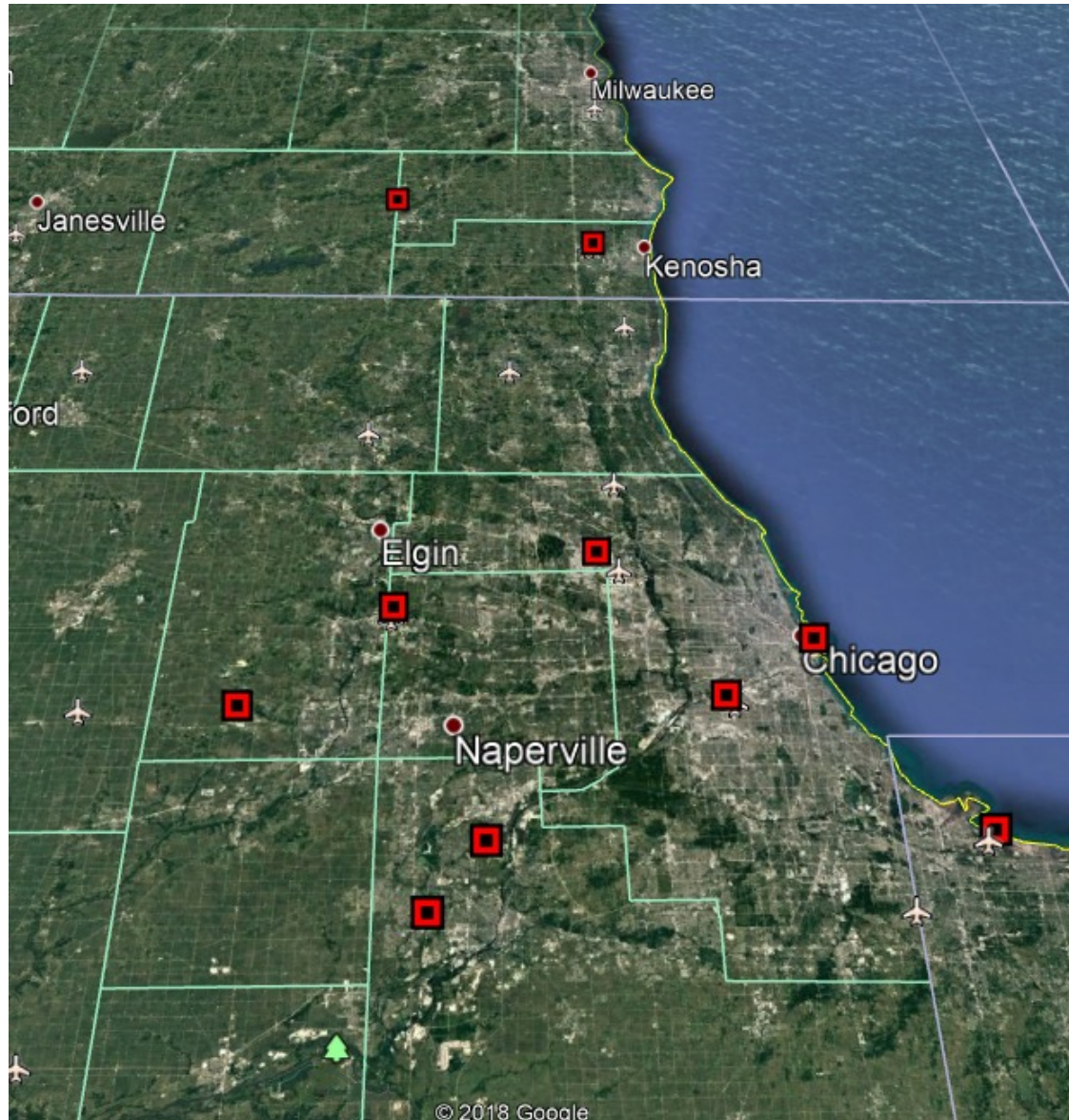


- Dew point and sol-air as well as different base point temperature can be used to calculate CDDs

# Weather Data



# Weather Stations in Chicago



# IIT Weather Station

Elev 597ft 41.83 °N, 87.63 °W

## Chicago, IL

71° ILLINOIS TECH STATION | REPORT | CHANGE

TODAY

HOURLY

10-DAY

CALENDAR

**HISTORY**

WUNDERMAP

Daily

Weekly

Monthly

August

20

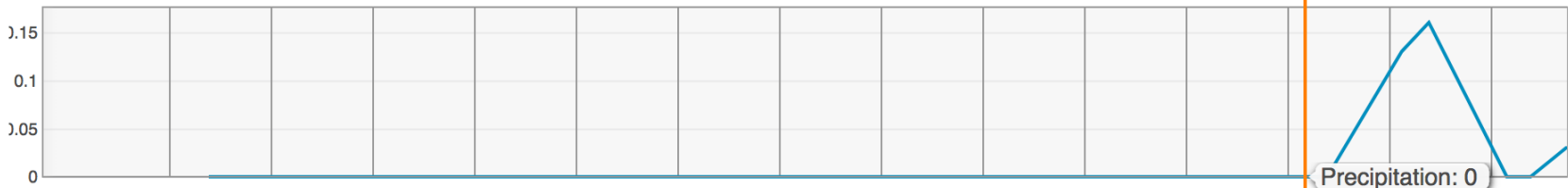
2018

View

12 AM 1 AM 2 AM 3 AM 4 AM 5 AM 6 AM 7 AM 8 AM 9 AM 10 AM 11 AM 12 PM 1 PM 2 PM



Temperature



Precipitation

# IIT Weather Station

## Daily Observations



Time	Temperature	Dew Point	Humidity	Wind	Wind Speed	Wind Gust	Pressure	Precip.	Precip Accum	Condition
1:39 PM	76 ° F	72 ° F	87 %	ESE	10 mph	0 mph	29.2 in	0.0 in	0.0 in	Cloudy
12:53 AM	76 ° F	66 ° F	71 %	ESE	8 mph	0 mph	29.3 in	0.0 in	0.0 in	Cloudy
2:53 AM	74 ° F	65 ° F	73 %	SE	8 mph	0 mph	29.3 in	0.0 in	0.0 in	Cloudy
3:53 AM	73 ° F	64 ° F	73 %	ESE	9 mph	0 mph	29.3 in	0.0 in	0.0 in	Mostly Cloudy
4:53 AM	72 ° F	64 ° F	76 %	ESE	10 mph	0 mph	29.3 in	0.0 in	0.0 in	Mostly Cloudy
5:53 AM	72 ° F	64 ° F	76 %	ESE	9 mph	0 mph	29.3 in	0.0 in	0.0 in	Mostly Cloudy
6:53 AM	72 ° F	64 ° F	76 %	ESE	9 mph	0 mph	29.3 in	0.0 in	0.0 in	Mostly Cloudy
7:53 AM	73 ° F	64 ° F	73 %	SE	10 mph	0 mph	29.3 in	0.0 in	0.0 in	Cloudy
8:53 AM	74 ° F	64 ° F	71 %	ESE	13 mph	0 mph	29.3 in	0.0 in	0.0 in	Cloudy
9:53 AM	76 ° F	65 ° F	69 %	E	12 mph	0 mph	29.2 in	0.0 in	0.0 in	Cloudy
10:53 AM	78 ° F	67 ° F	68 %	ESE	15 mph	0 mph	29.2 in	0.0 in	0.0 in	Cloudy
11:53 AM	77 ° F	69 ° F	76 %	E	10 mph	0 mph	29.2 in	0.0 in	0.0 in	Light Rain
12:37 PM	74 ° F	71 ° F	91 %	ESE	8 mph	0 mph	29.2 in	0.1 in	0.0 in	Light Rain
12:53 PM	75 ° F	72 ° F	90 %	E	8 mph	0 mph	29.2 in	0.2 in	0.0 in	Rain
1:53 AM	75 ° F	65 ° F	71 %	SE	10 mph	0 mph	29.3 in	0.0 in	0.0 in	Cloudy
1:53 PM	76 ° F	72 ° F	87 %	ESE	17 mph	23 mph	29.2 in	0.0 in	0.0 in	Cloudy
2:14 PM	77 ° F	73 ° F	88 %	E	20 mph	0 mph	29.2 in	0.0 in	0.0 in	Mostly Cloudy
2:53 PM	77 ° F	73 ° F	88 %	E	14 mph	23 mph	29.2 in	0.0 in	0.0 in	Cloudy
3:00 PM	76 ° F	72 ° F	87 %	E	14 mph	0 mph	29.1 in	0.0 in	0.0 in	Cloudy
3:53 PM	77 ° F	72 ° F	84 %	ESE	14 mph	0 mph	29.1 in	0.0 in	0.0 in	Cloudy
4:53 PM	78 ° F	73 ° F	84 %	ESE	13 mph	0 mph	29.1 in	0.0 in	0.0 in	Cloudy
5:53 PM	79 ° F	71 ° F	77 %	ESE	17 mph	22 mph	29.1 in	0.0 in	0.0 in	Mostly Cloudy

# Close to IT Weather Station

Elev 600 ft, 41.85 °N, 87.63 °W

## Chicago, IL Weather Conditions

☀️ **70°** WHITE SOX PARK/ BRIDGEPORT STATION | CHANGE ▾

TODAY

HOURLY

10-DAY

CALENDAR

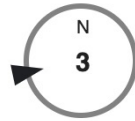
HISTORY

WUNDERMAP

🕒 8:57 AM CDT on August 31, 2022 (GMT -5) | Updated 13 seconds ago

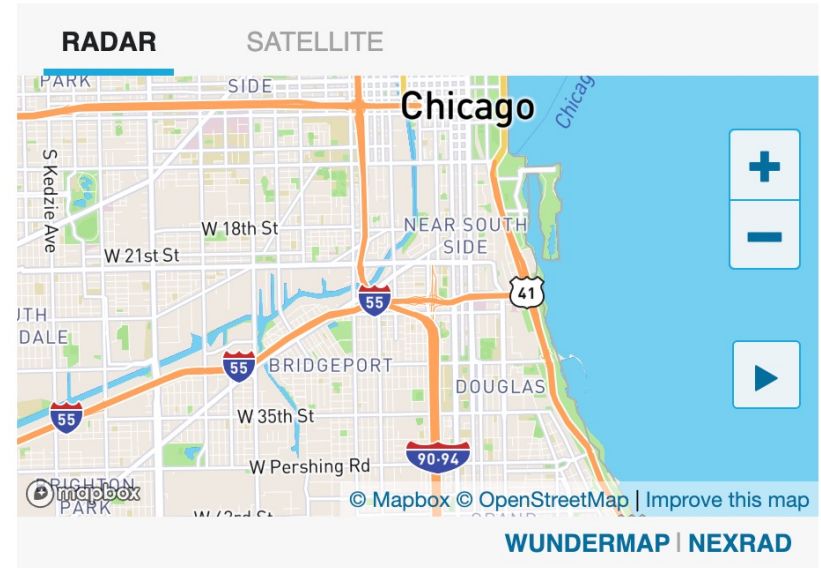


Sunny



Gusts 3 mph

Today's temperature is forecast to be **NEARLY THE SAME** as yesterday.



# Weather Station Calibration

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## Description

### Historical Hourly Weather Data

Who amongst us doesn't small talk about the weather every once in a while?

The goal of this dataset is to [elevate this small talk to medium talk](#).

Just kidding, I actually originally decided to collect this dataset in order to demonstrate basic signal processing concepts, such as filtering, Fourier transform, auto-correlation, cross-correlation, etc..., (for a data analysis course I'm currently preparing).

I wanted to demonstrate these concepts on signals that we all have intimate familiarity with and hope that this way these concepts will be better understood than with just made up signals.

The weather is excellent for demonstrating these kinds of concepts as it contains periodic temporal structure with two very different



# Building Selection

- Do you recall the CBECS building data types?

U.S. National Median Reference Values for All Portfolio Manager Property Types

Broad Category	Primary Function	Further Breakdown (where needed)	Source EUI (kBtu/ft <sup>2</sup> )	Site EUI (kBtu/ft <sup>2</sup> )	Reference Data Source - Peer Group Comparison	
Banking/Financial Services	Bank Branch *		209.9	88.3	CBECS - Bank/Financial	
	Financial Office*		116.4	52.9	CBECS - Office & Bank/Financial	
Education	Adult Education		110.4	52.4	CBECS - Education	
	College/University		180.6	84.3	CBECS - College/University	
	K-12 School*		104.4	48.5	CBECS - Elementary/Middle & High School	
	Pre-school/Daycare		131.5	64.8	CBECS - Preschool	
	Vocational School		110.4	52.4	CBECS - Education	
	Other - Education					
Entertainment/Public Assembly	Convention Center		109.6	56.1	CBECS - Social/Meeting	
	Movie Theater		112.0	56.2	CBECS - Public Assembly	
	Museum					
	Performing Arts					
	Recreation	Bowling Alley		112.0	50.8	CBECS - Recreation
		Fitness Center/Health Club/Gym				
		Ice/Curling Rink				
		Roller Rink				
		Swimming Pool				
Other - Recreation						
Social/Meeting Hall		109.6	56.1	CBECS - Social/Meeting		



# Campus Building Selection

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## Primary categories

### **Classrooms / Offices**

This category is a combination of classroom and office areas where none of the classroom or office areas occupies more than 60% of the total building area. This type of the building represents a building that comprises both Full Time Employee (FTE) and visitor/transient occupants. While the visitor/transient occupants influence the energy consumption pattern and operation schedule of the classroom space type, FTEs in the office space type affect the building's energy consumption patterns.

### **Office Areas**

It is a category that more than 80% of the building area is dedicated to the academic and administrative office areas. It is expected that the operational schedule for this type of space be shorter compared to the Classrooms/Offices space types.

### **Research Laboratories**

This category contains buildings that exhibit high-intensity in terms of energy consumption and more than 40% of the building area is occupied by research laboratories.

### **Laboratory Mixes**

Laboratory mixes category is the building area with a combination of classroom/office, office, and research laboratory areas. In this category more than 20% of the building area is used for research laboratories, and each of the categories occupy at least more than 15% of the building area.

### **Residential Facilities**

This category includes students, staff, and faculty housing buildings.

# Campus Building Selection

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## Secondary categories

<b>Student Activity Centers</b>	This category contains buildings where 40% of the building area is used for student activities.
<b>Health Facilities</b>	Health facilities are buildings that provide patient care within university campuses.
<b>Sports &amp; Gym Facilities</b>	It is a category dedicated to indoor student recreational activities and fitness centers.
<b>Auditoriums &amp; Theaters</b>	This category is used for exhibition and performance buildings within university campuses.
<b>Residential Facility Mixes</b>	This category is a combination of residential facilities and areas allocated for food and cooking purposes.
<b>Hospitality Services</b>	Hospitality services category contains temporary accommodation facilities, such as university hotels within university campuses.
<b>Libraries</b>	This category defines university libraries.
<b>Museums</b>	This category includes museum buildings within university campuses.

# Campus Building Selection

- An example from Penn State's and Harvard's campuses:
  - Building with different types, ages, and sizes are selected
  - For five main categories, six buildings are considered

Building Type	Range of building ages (Years)		Building number(s)		Approximate Building Gross Area m <sup>2</sup> (ft <sup>2</sup> )	
	Penn State	Harvard	Penn State	Harvard	Penn State	Harvard
<b>Classrooms / Offices</b>	5 – 108	19 – 113	1P – 6P	1H – 6H	4,000 – 21,000 (43,055 – 129,167)	5,000 – 8,000 (53,820 – 86,111)
<b>Office areas</b>	10 – 107	21 – 112	7P – 12P	7H – 13H	3,000 – 13,000 (32,292 – 139,931)	4,000 – 18,000 (43,056 – 193,750)
<b>Research laboratories</b>	6 – 81	6 – 131	13P – 18P	14H – 19H	8,000 – 13,000 (86,111 - 139931)	5,000 – 20,000 (53,820 – 215,278)
<b>Laboratory mixes</b>	8 – 91	5 – 112	19P – 24P	20H – 25H	7,000 – 17,000 (75,347 – 182,986)	6,000 – 50,000 (64,583 – 538,196)
<b>Residential facilities</b>	47 – 87	5 – 124	25P – 35P	26H – 31H	3,000 – 20,000 (32,291 – 215,278)	6,000 – 23,000 (64,583 – 247,570)

# Campus Building Selection

- An examples from Penn State's campus:
  - Nine secondary categories are considered

Building Type	Range of building ages (Years)	Building number(s)	Approximate Building Gross Area m <sup>2</sup> (ft <sup>2</sup> )
<b>Campus</b>		Penn State	
<b>Student Activity Center</b>	57	36P	23,000 (247,570)
<b>Health Facilities</b>	4	37P	6,000 (64,583)
<b>Sports and Gym Facilities</b>	45 – 83	38P – 39P	8,000 – 29,000 (86,111 – 312,153)
<b>Auditoriums and Theatres</b>	38 – 109	40P – 42P	2,000 – 10,000 (21,528 – 107,639)
<b>Residential Facility Mixes</b>	45 – 55	43P – 45P	2,000 – 7,000 (21,528 – 75,347)
<b>Hospitality Services</b>	81	46P	22,000 (236,806)
<b>Library</b>	72	47P	24,000 (258,334)
<b>Museum</b>	41	48P	5,000 (53,820)

# **CLASS ACTIVITY**

# Class Activity

---

- Consider IIT Buildings:

Building Name	Building Name
Perlstein Hall	Engineering
Alumni Memorial Hall	Life Sciences
Wishnick Hall	Stuart
Siegel Hall	Keating Sports Center
Crown Hall	IIT Apartments
IIT Tower	The Commons
Paul Galvin	McCormick Tribune
Main	Residence Hall Complex
Machinery Hall	Farr Hall
Hermann Union	Quad

---

# Class Activity

---

- Provide two examples for each type at the IIT campus:
- 

Building Type	IIT Building
Classrooms/Offices	???
Office Areas	???
Research Laboratories	???
Laboratory Mixes	???
Residential Facilities	???

# Class Activity

---

- Provide an example for each type at the IIT campus:
- 

<b>Building Type</b>	<b>IIT Building</b>
<b>Student Activity Center</b>	<b>???</b>
<b>Health Facilities</b>	<b>???</b>
<b>Sports and Gym Facilities</b>	<b>???</b>
<b>Auditoriums and Theatres</b>	<b>???</b>
<b>Residential Facility Mixes</b>	<b>???</b>
<b>Hospitality Services</b>	<b>???</b>
<b>Library</b>	<b>???</b>
<b>Museum</b>	<b>???</b>

---



# Class Activity

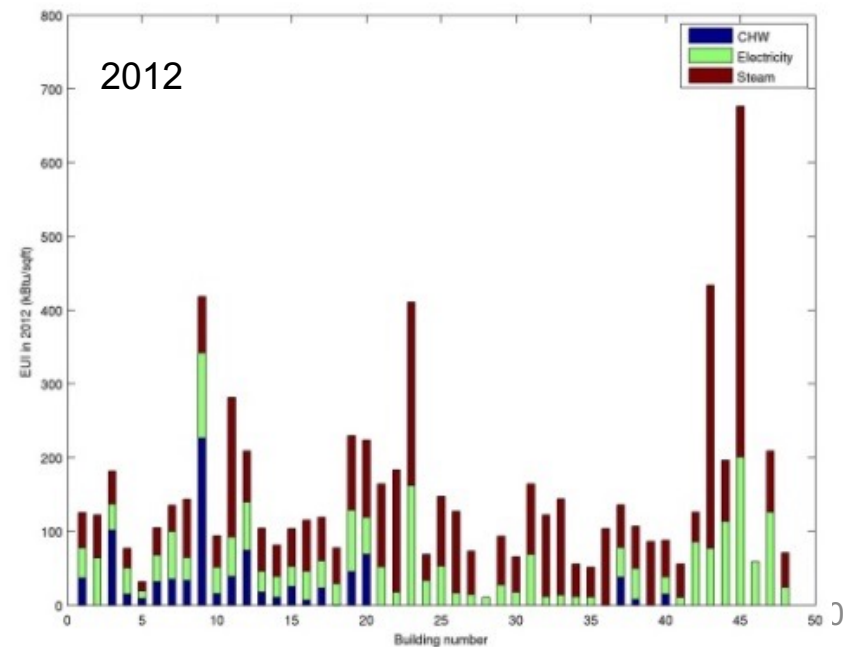
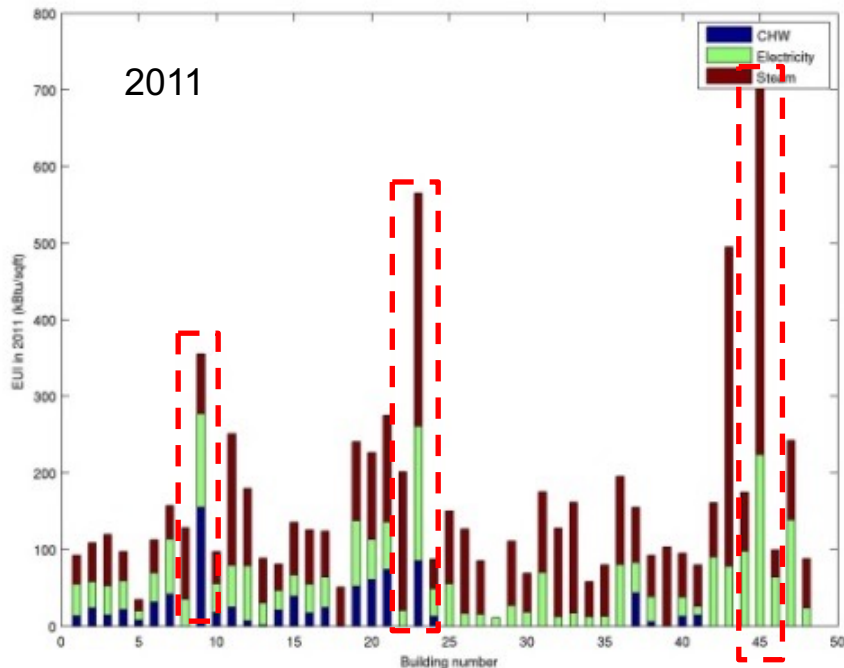
---

- From previous students:

	Area (ft <sup>2</sup> )	Year Built	# of floors	Dimensions	WWR	Space Type	Shape
<b>Perlstein Hall</b>	124,800	1945	3	320'x130'	0.65	Office/Class/Lab	RECT
<b>Alumni Hall</b>	33,000	1945	3	225'x75'	0.425	Office/Class/Lab	RECT
<b>Wishnick Hall</b>	81,500	1945	4	91'x224'	0.68	Office/Class	RECT
<b>Siegel Hall</b>	75,840	1956	4	80'x237'	0.63	Office/Class	RECT
<b>Crown Hall</b>	52,800	1956	2	120'x220'	0.88	Class/Library	RECT
<b>Common</b>	52,800	1962	2	120'x220'	0.88	Dining	RECT
<b>Material</b>	339,329	1943	2	243'x500'	0.38	Office/Lab/Class	RECT
<b>Main</b>	78,698	1892	5	248.65'x63.3'	0.35	historic landmark	RECT
<b>Machinery Hall</b>	27,515	1901	5	88.9' x 61.92'	0.3	historic landmark	RECT

# Energy Consumption

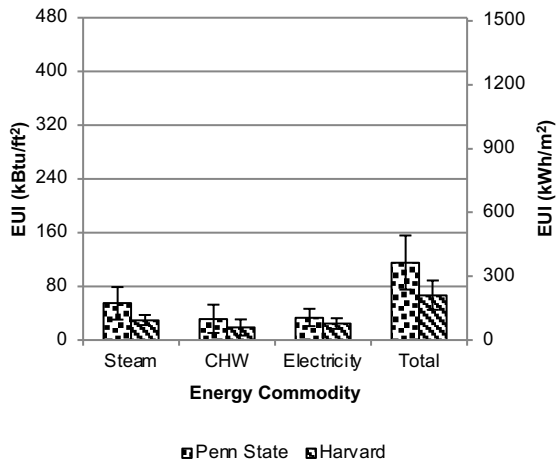
- An example from Penn State's study. Energy consumption commodities are:
  - Chilled water
  - Steam
  - Electricity
  - Service hot water



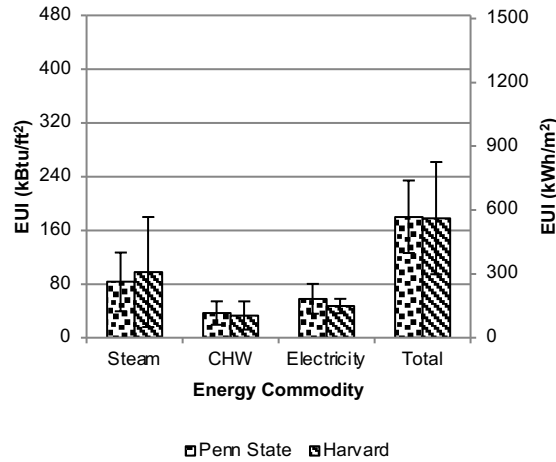
# Energy Consumption

- An example for the five primary categories:

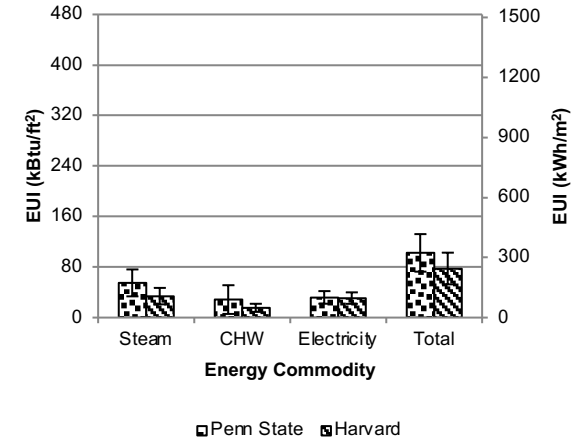
Classroom/Office



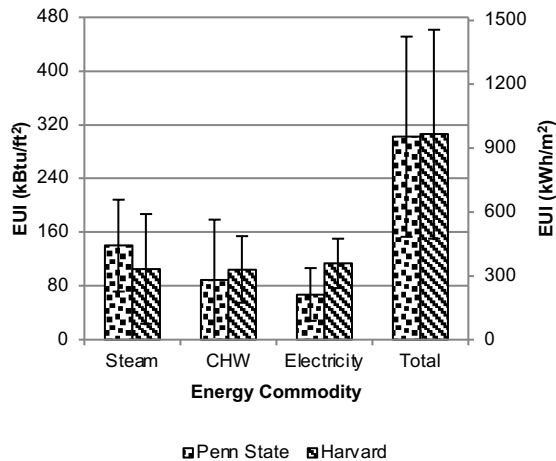
Lab Mixes



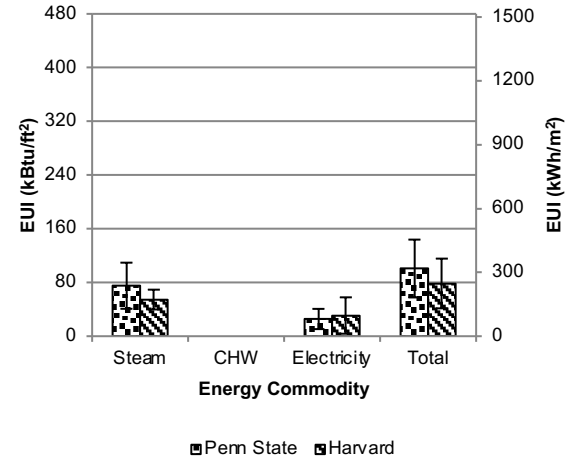
Office Areas



Research Laboratories



Residential Facilities



# **CLASS ACTIVITY**

# Class Activity

---

- Let's calculate EUI (electricity, steam, and total EUI) for the uploaded file on BB.

# Common Energy Modeling Methods

---

- Six common methods to analyze energy consumption of campus buildings are listed below
- Methods 1-5 are simpler than Method 6
- Method 6 requires using simulation programs such as EnergyPlus

---

<b>Method #</b>	<b>Energy modeling criteria name</b>
1	Degree day calculations
2	Estimated savings based on the utility bills (disaggregation)
3	Temperature bin spreadsheet calculations
4	8760-hour spreadsheet calculations
5	Energy Utilization Index (EUI)
6	Whole building energy simulations

---

# Energy Consumption

---

- Order of magnitude for the regression analysis determines three types of buildings in terms of the energy consumption in response to the outdoor weather conditions. These types are:
  - Externally-load dominated buildings
  - Internally-load dominated buildings
  - Mixed-load dominated buildings
- It is useful to determine whether internal, external or mixed-loads dominate building energy use patterns in order to inform design, retrofit and energy simulation efforts

# Energy Consumption

---

- Externally-load dominated buildings:
  - Have their energy consumption controlled by the outdoor weather conditions, ventilation systems, and heat loss/gain through the building envelope
  - Known as envelope-dominated or skin-load dominated buildings
  - Dominated buildings require additional focuses on the building envelop and ventilation systems
  - Space types such as single-family and warehouse buildings tend to be externally-load dominated
  - For campus buildings located in the Northeastern of the U.S., the steam consumption do follow the outdoor condition, suggesting opportunities to benefit from a better space heating management strategies



# Energy Consumption

---

- Internally-load dominated buildings:
  - Outdoor conditions do not have significant influence on the energy consumption of these buildings
  - Internal loads such as receptacle, occupancy, lighting loads and their schedules are the main drivers to control the energy consumption of these buildings
  - Space types such as offices, hospitals, and research laboratories tend to be more internally-load dominated
  - The results of this study indicates that the research laboratories and laboratory mixes tend to be internally-load dominated.

# Energy Consumption

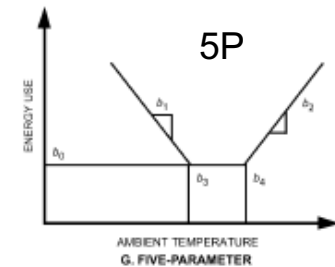
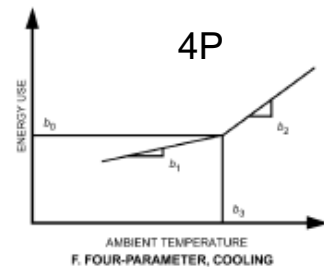
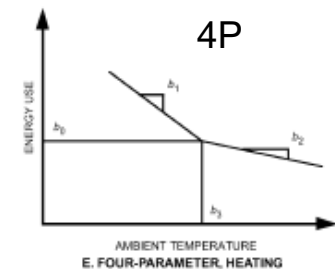
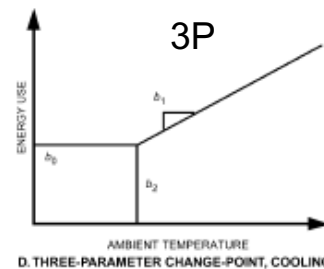
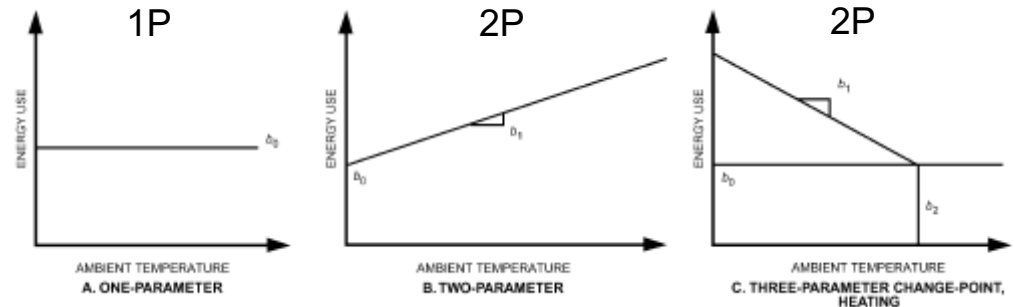
---

- Mixed-load dominated buildings:
  - In these buildings, external and internal thermal loads have the same order of magnitude
  - Energy use patterns for these types of buildings are a combination of external and internal loads
  - The complex interaction of the heat transfer processes render mixed-load dominated buildings difficult to model
  - Modeling these buildings requires consideration of combined methodologies for externally-load and internally-load dominated building
  - Campus buildings with good management strategies usually are mixed-load dominated since the energy consumption during the peak time follows the outdoor condition while during off peak, e.g., nighttime, the building cooling does not follow the outdoor condition

# Degree Days

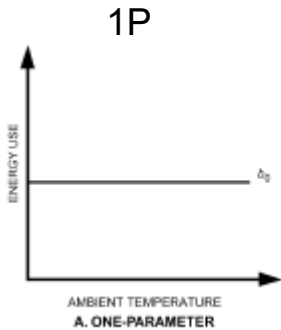
- Seven methods:

- 1P: Non-weather dominated
- 2P: Linear correlation with a fixed baseline
- 3P: Linear correlation with a change point temperature constant baseline
- 4P: Linear correlation with a change point temperature weather dependent baseline
- 5P: Cooling and heating in the same plot

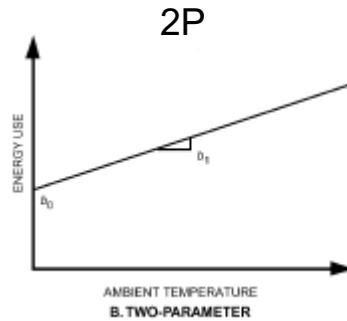


Provide an example for each method?

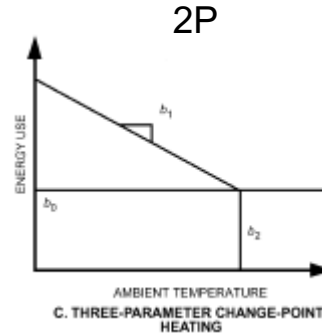
# Degree Days



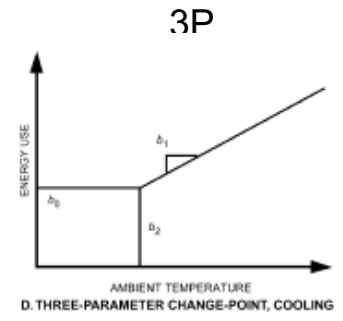
Electricity consumption for a building with chilled water and steam end-uses



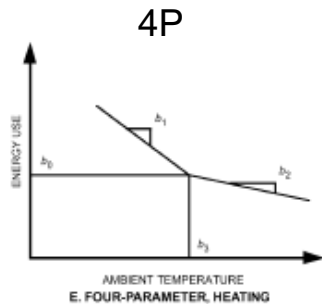
Chilled water consumption for a building for a typical campus building



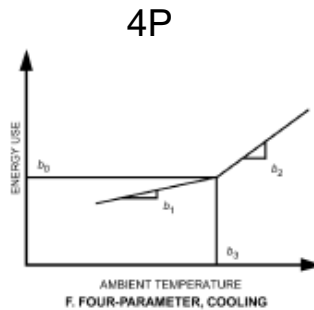
Steam consumption for a building with research laboratory



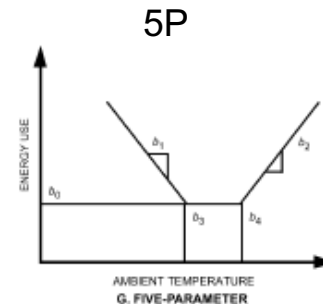
Chilled water consumption for a building with research laboratory



Steam consumption for a campus building with two different temperature setpoint control



Chilled water consumption for a campus building with two different temperature setpoint control



Electricity consumption for a campus building that uses electricity for heating and cooling

# Normalization of Energy End-uses

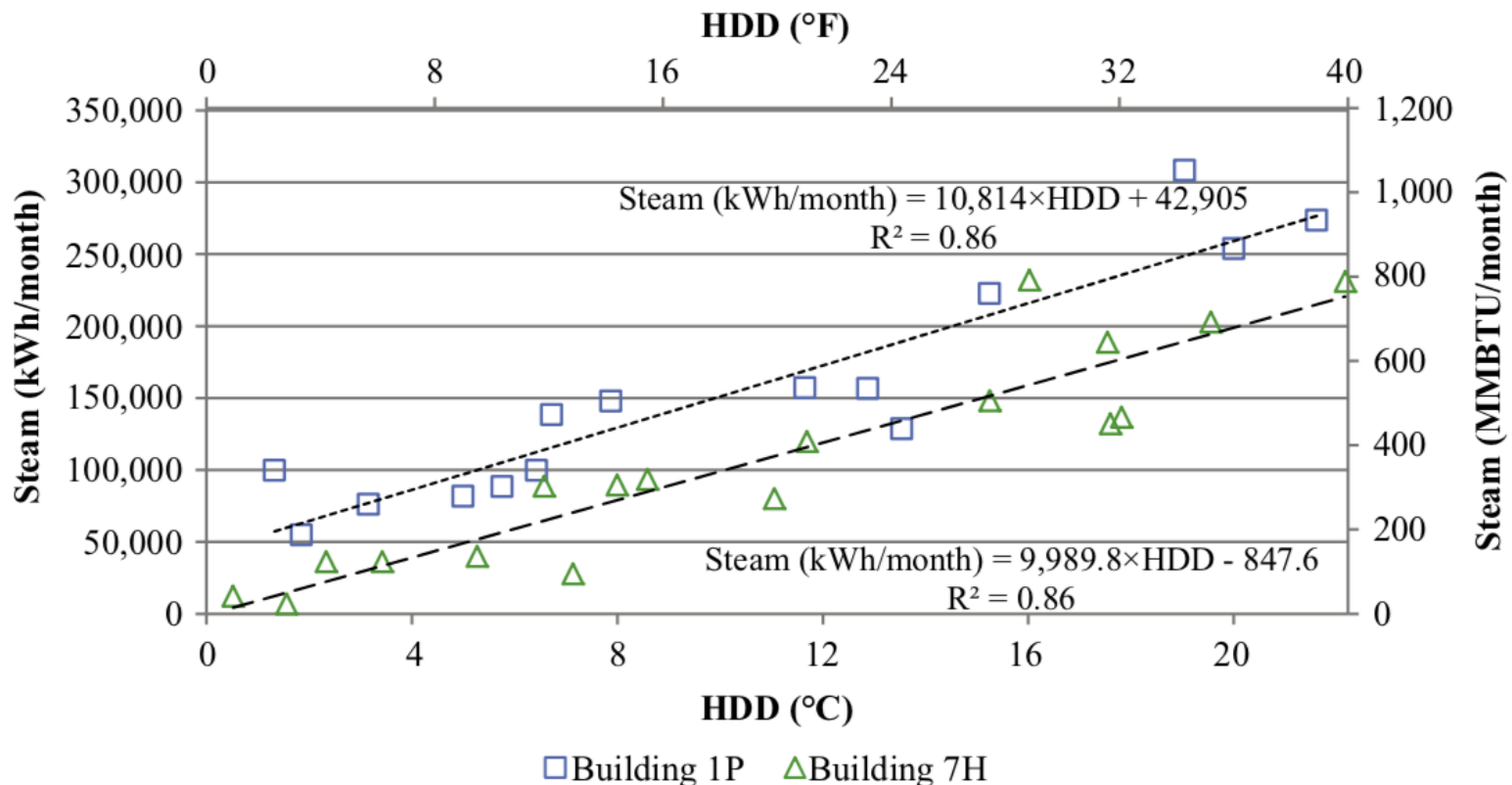
---

- Used two approaches:
  1. All year: works better for campus buildings due to simultaneous heating and cooling.
  2. Cooling and heating seasons:
    - Cooling season: June – August
    - Heating season: Jan –May & September – December

*This method fails for some of the buildings (especially for CHW)*

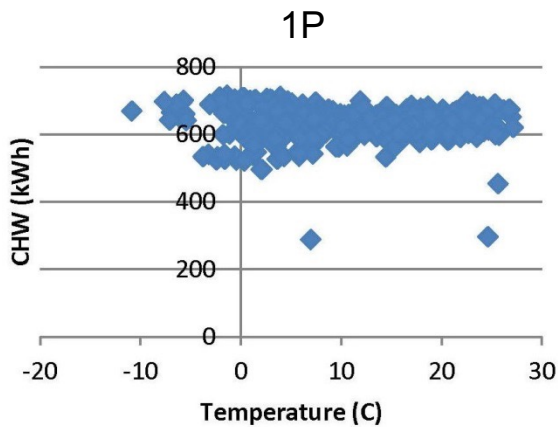
# Normalization of Energy End-uses

- Normalized steam with HDD for one building at Penn State campus and one building at Harvard campus.



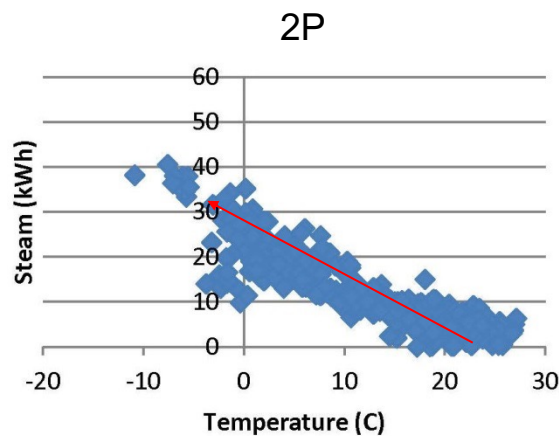
# Normalization of Energy End-uses

- Different pattern exists for the campus building:



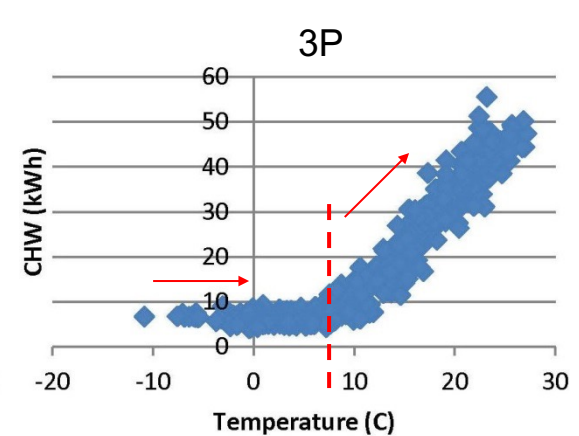
*No correlations*

$$CHW = a \times Temp + b$$



*Two points model*

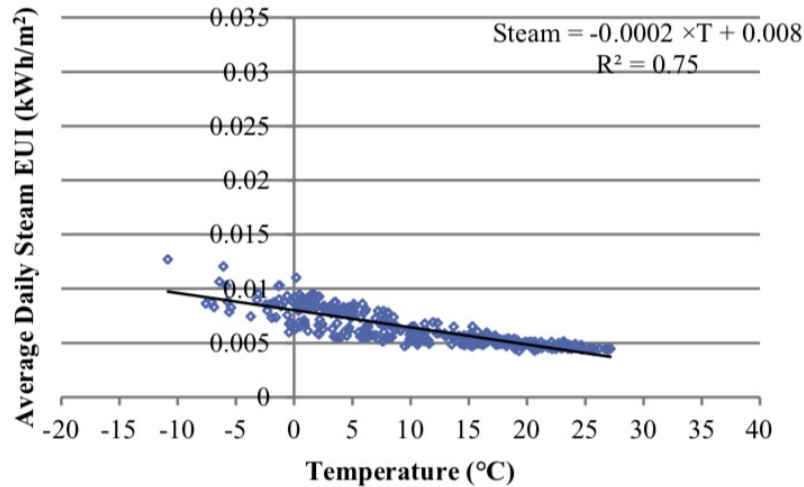
$$Steam = a Temp + b$$



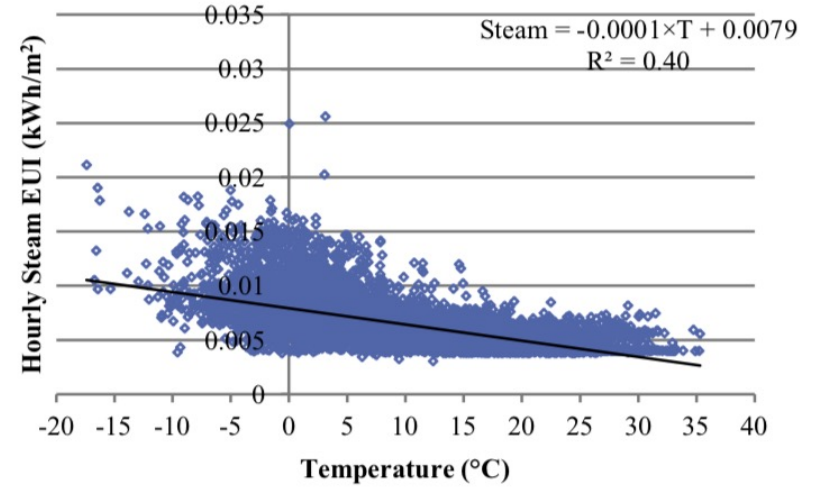
*Three points model*

$$CHW = (a_1 Temp + b_1) + (a_2 Temp + b_2)$$

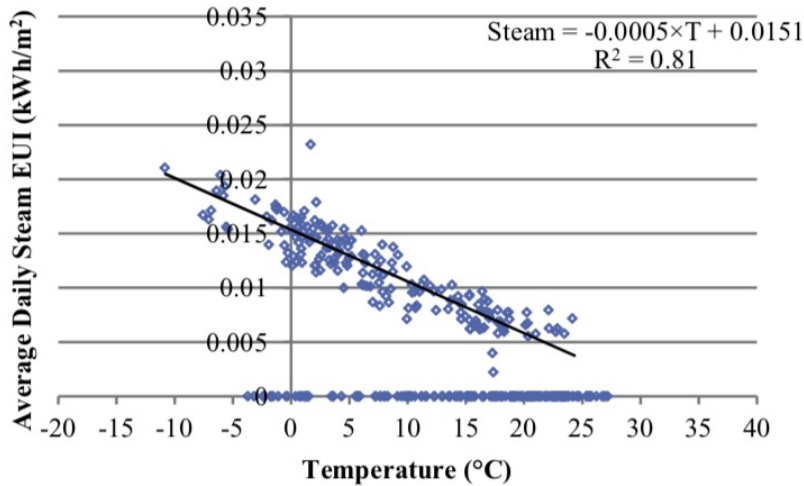
# Normalization of Energy End-uses



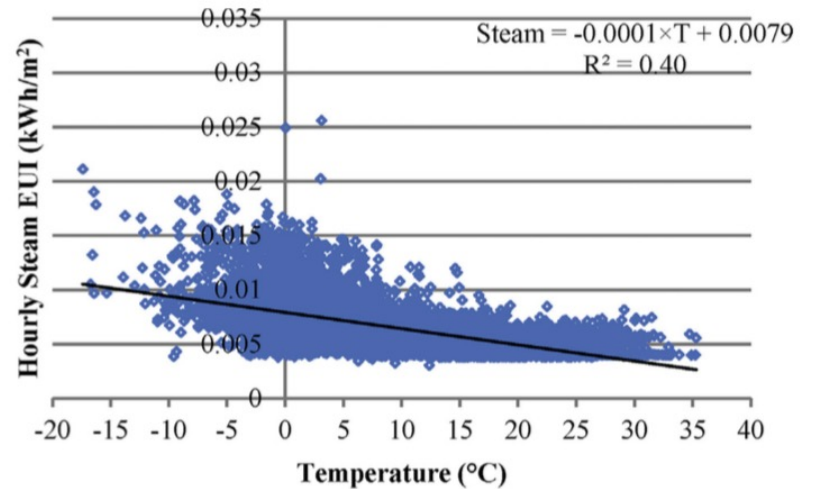
(a)



(b)



(c)

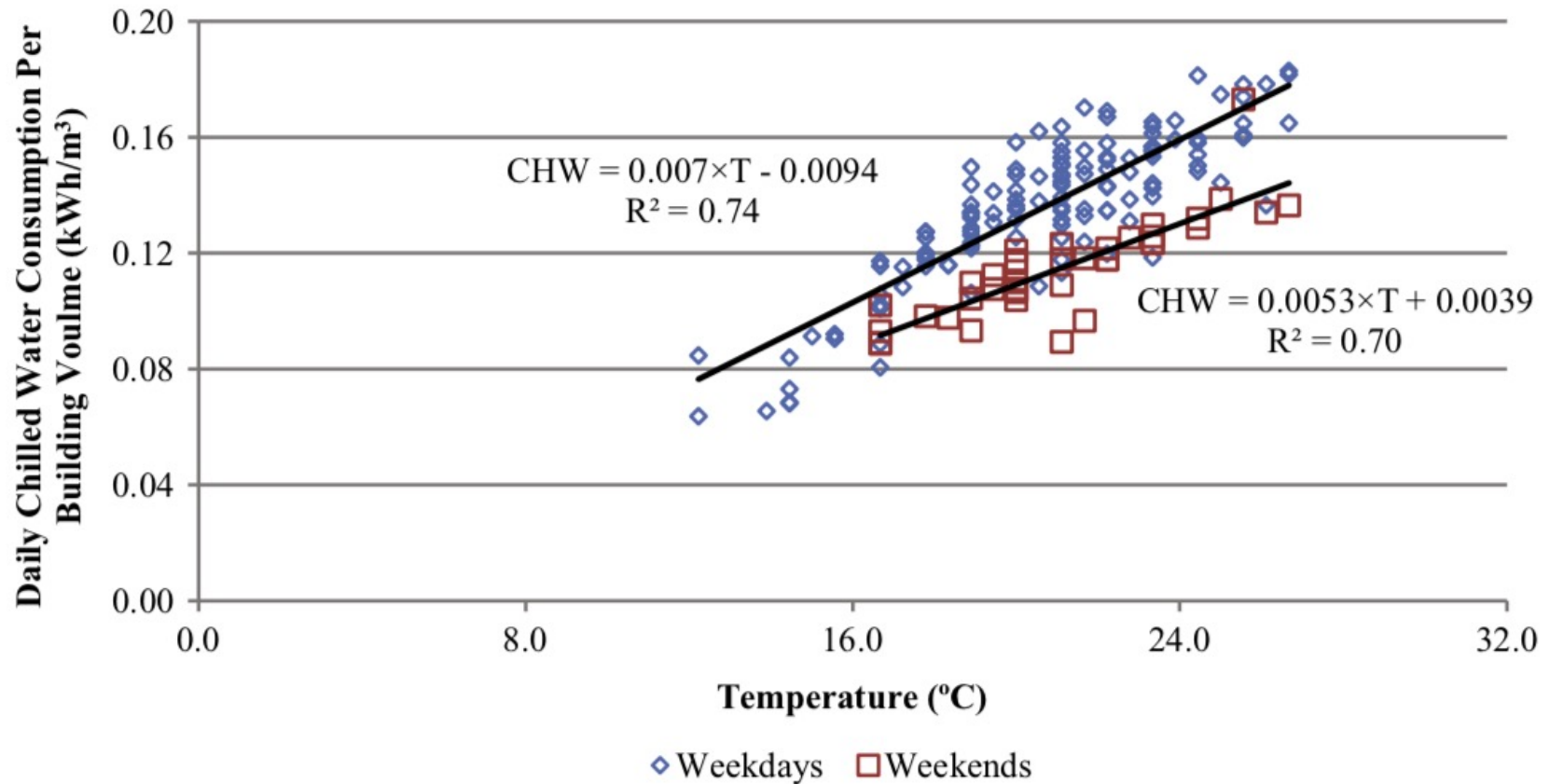


(d)



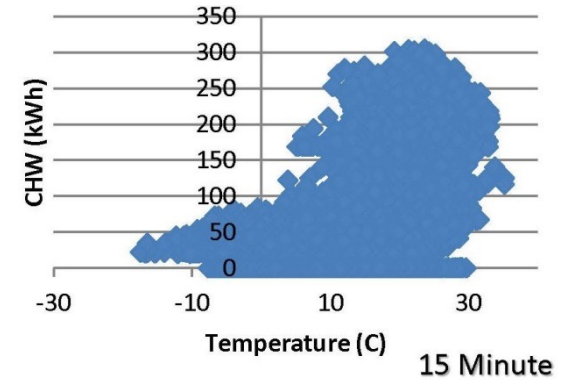
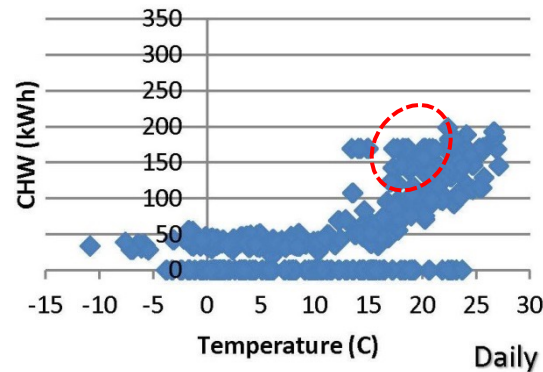
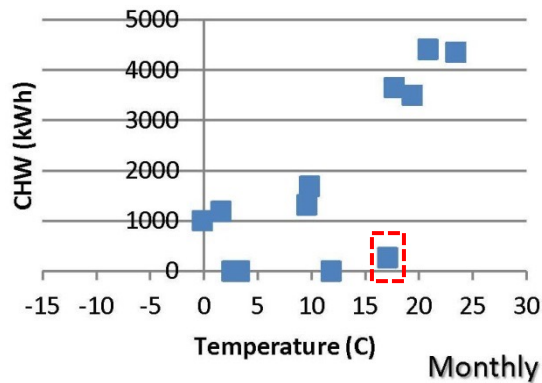
# Normalization of Energy End-uses

- Sometimes for the same building, the occupancy and operation can change the patterns.



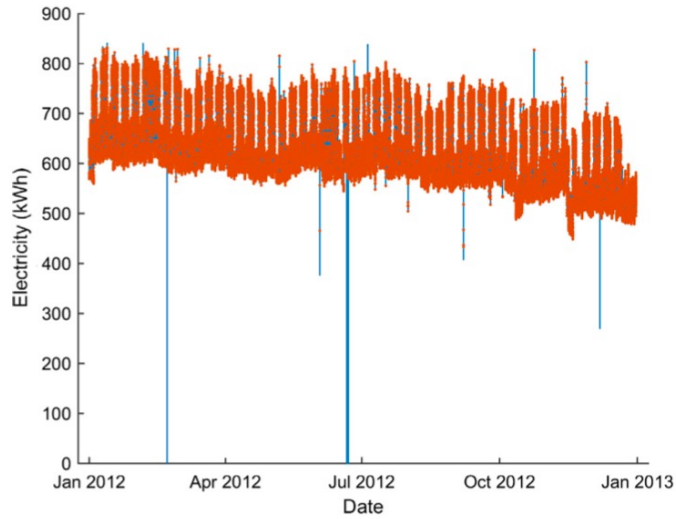
# Normalization of Energy End-uses

- Granularity of the data:
  - Monthly
  - Daily
  - 15 Minute / Hourly

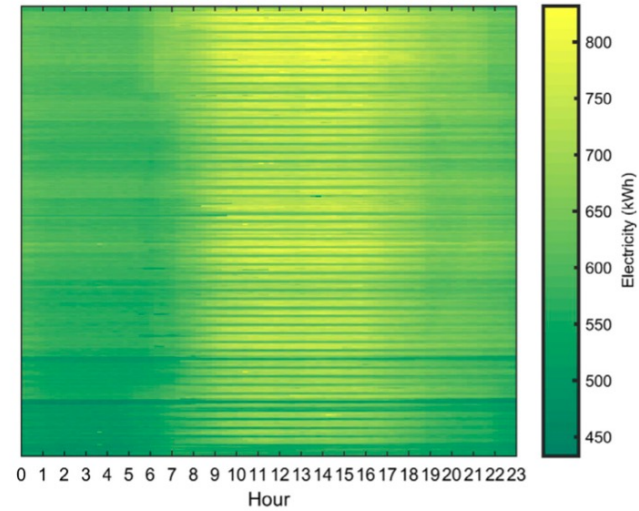


Granularity Level	Description
Monthly	<ul style="list-style-type: none"> <li>Exists for most of the buildings</li> <li>Works better for the steam consumptions than the CHW consumptions</li> </ul>
Daily	<ul style="list-style-type: none"> <li>Provides a better response than the monthly</li> <li>Enable reduce the sampling rate for the existing sub-metering sensors</li> </ul>
Hourly / 15 Minute	<ul style="list-style-type: none"> <li>Provide detailed information about the building operation and schedules</li> <li>Include noises associated with the data</li> </ul>

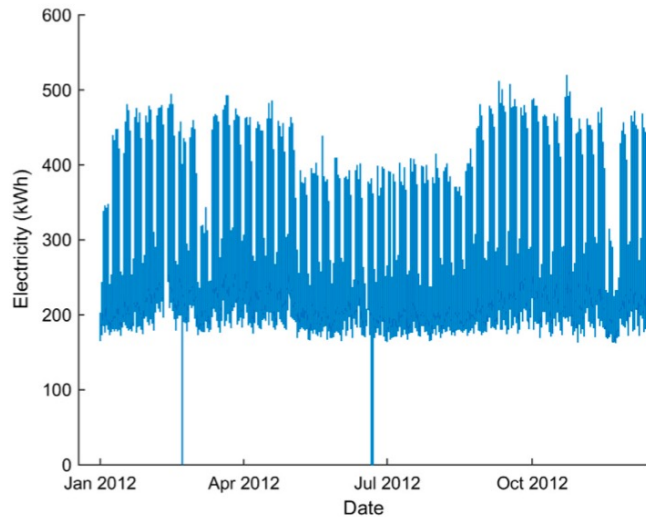
# Normalization of Energy End-uses



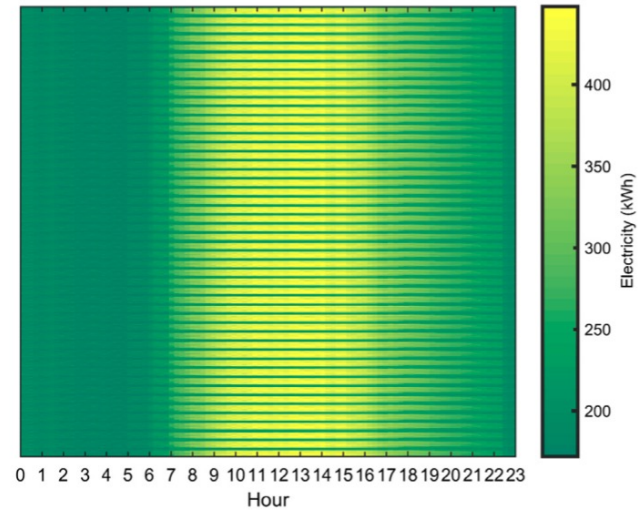
(a)



(b)



(c)



(d)

# Class Activity

- Consider this building EUIs, which one is the accurate building EUI?

Year	Electricity EUI (kBtu/ft <sup>2</sup> )	Heating EUI (kBtu/ft <sup>2</sup> )	Cooling EUI (kBtu/ft <sup>2</sup> )	Total EUI (kBtu/ft <sup>2</sup> )
2016	20	40	15	75
2017	19	49	11	79
2018	22	42	18	82

TABLE D-1 U.S. and U.S. Territory Climatic Data (Continued)

State/City	Latitude	Longitude	Elev., ft	HDD65	CDD50	Heating Design Temperature	Cooling Design Temperature		Number of Hours 8 a.m.–4 p.m.  55 < T <sub>db</sub> < 69
						99.6%	Dry-Bulb	Wet-Bulb	
							1.0%	1.0%	
<b>Illinois (IL)</b>									
Aurora	41.75 N	88.35 W	644	6699	2880	NA	NA	NA	NA
Belleville/Scott AFB	38.55 N	89.85 W	453	4878	4146	3	93	77	NA
Carbondale Sewage Plt	37.73 N	89.17 W	390	4865	3934	NA	NA	NA	NA
Champaign	40.03 N	88.28 W	755	5689	3697	NA	NA	NA	NA
Chicago Midway AP	41.73 N	87.77 W	620	6176	3251	NA	NA	NA	NA
Chicago O'Hare WSO AP	41.98 N	87.90 W	674	6536	2941	-6	88	73	613
Chicago University	41.78 N	87.60 W	594	5753	3391	NA	NA	NA	NA

# Benefits and Limitations

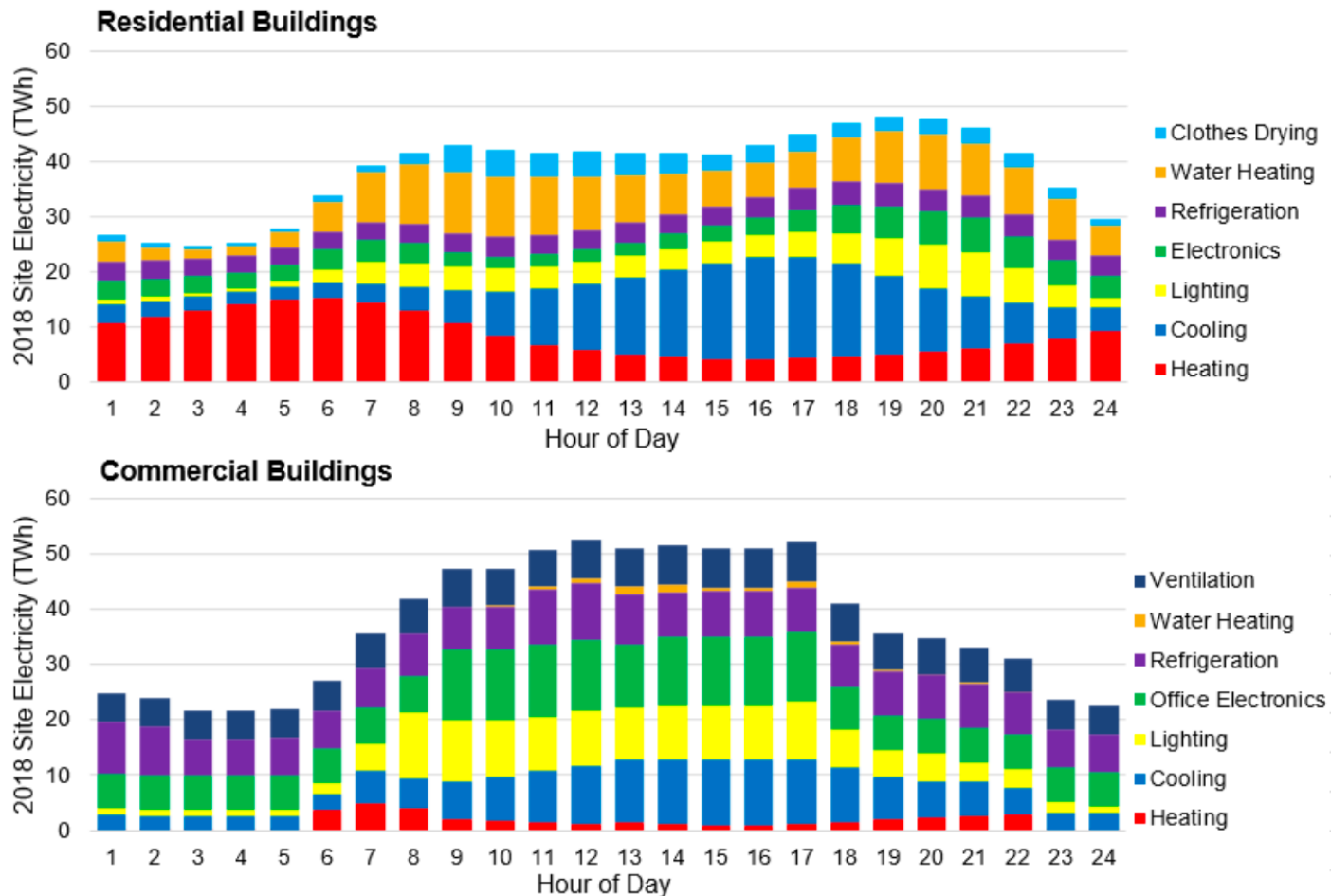
---

- Benefits:
  - Provide rapid normalization results
  - Provide accurate results for most of the situations
  
- Limitations:
  - Assume steady-state conditions
  - Fail for cases where there is rapid changes in the building (internally-load dominated)

# **COMMERCIAL/RESIDENTIAL BUILDINGS**

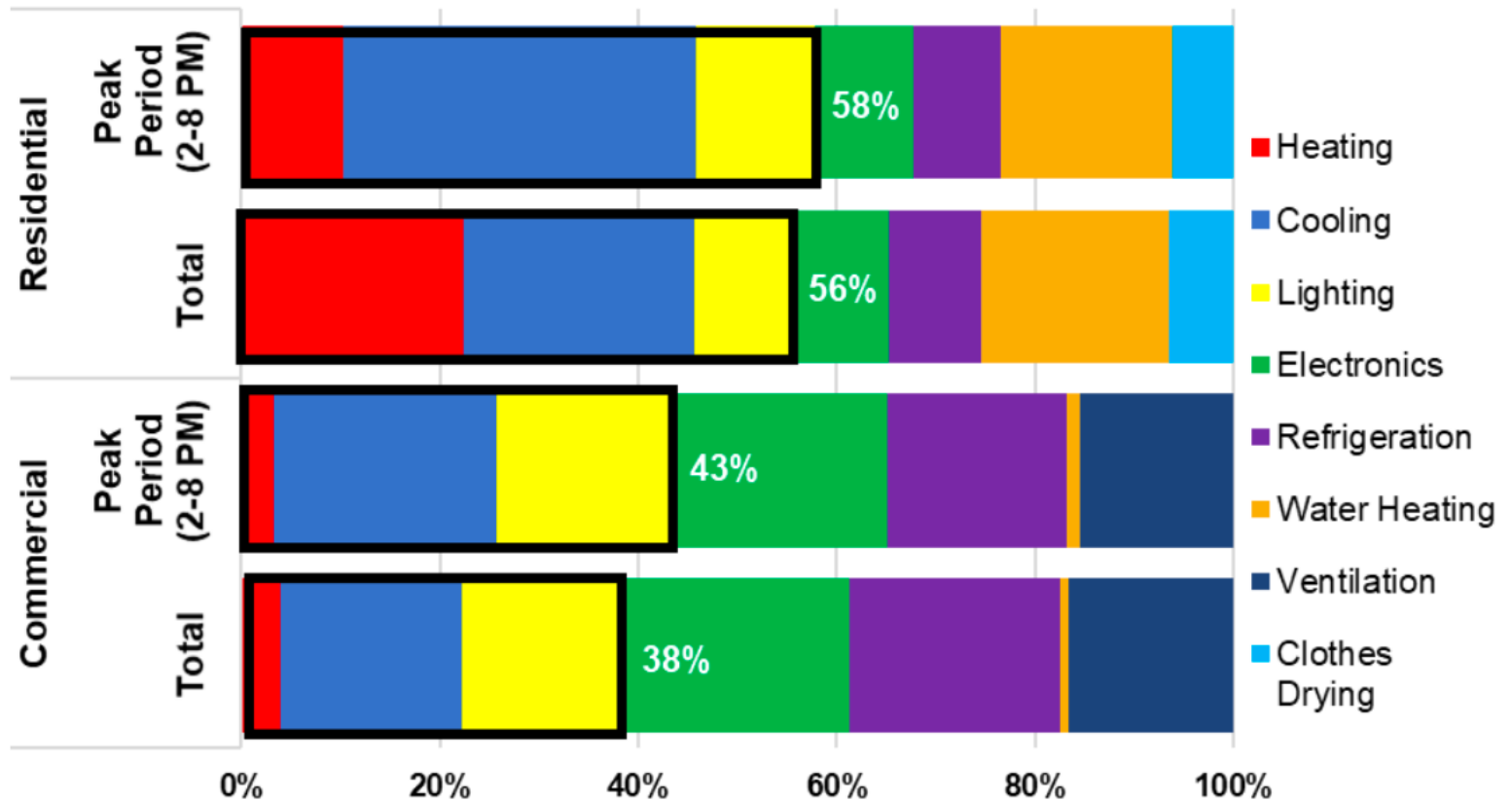
# Commercial/Residential Buildings

- Hourly electricity use in residential and commercial buildings in 2018:



# Commercial/Residential Buildings

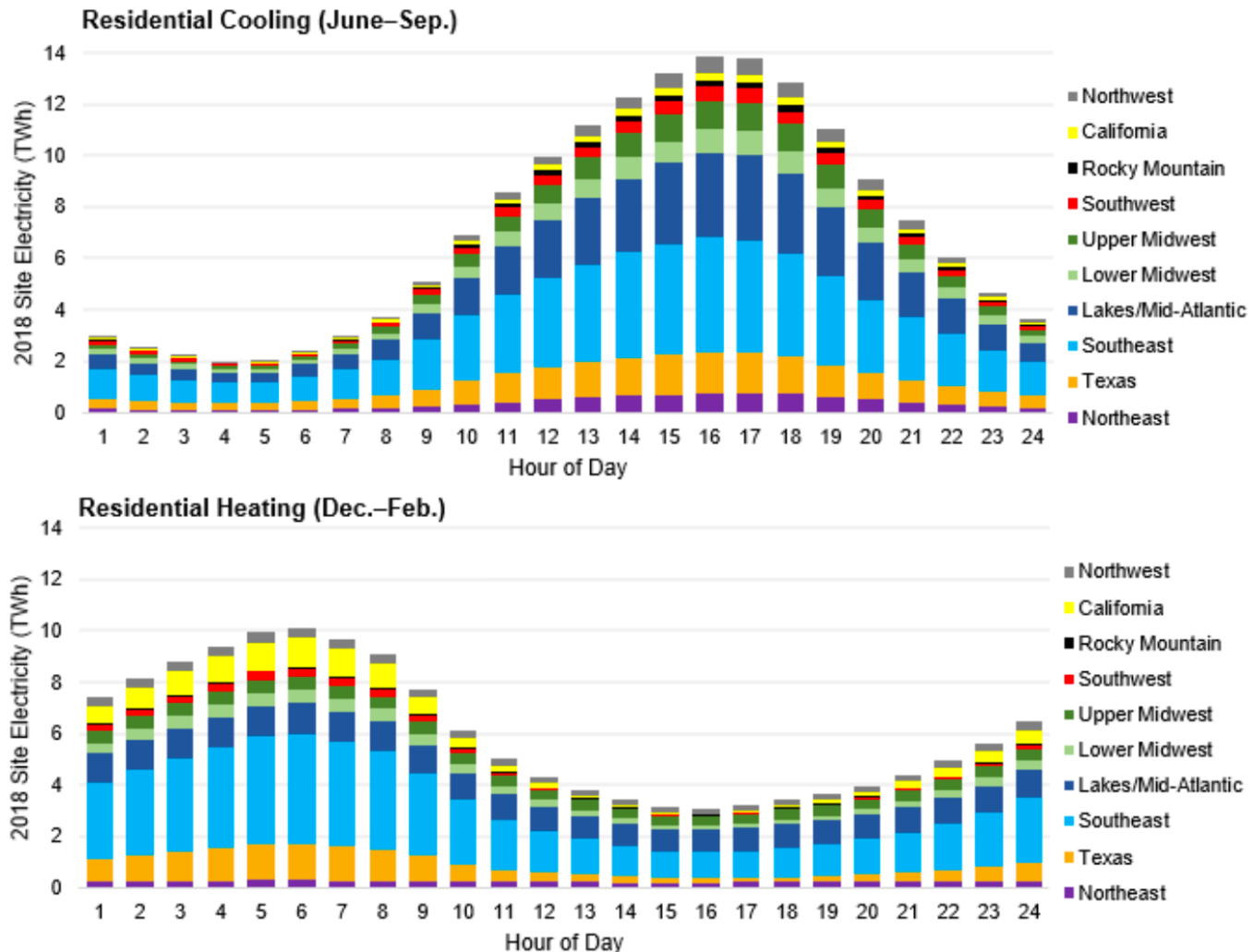
- Total and peak electricity end-uses in 2018:





# Commercial/Residential Buildings

- Residential cooling and heating hourly profile:



# Commercial/Residential Buildings

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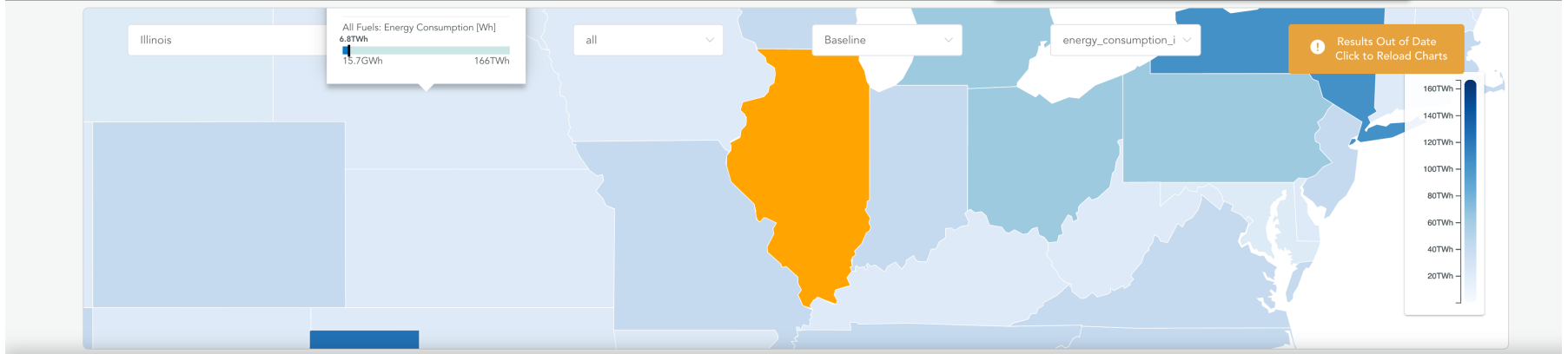
- See ResStock and ComStock:
  - ❑ <https://www.nrel.gov/buildings/comstock.html> (for viewing data: <https://comstock.nrel.gov/dataviewer/>)
  - ❑ <https://www.nrel.gov/buildings/resstock.html> (for viewing data: <https://resstock.nrel.gov/dataviewer/>)

# Commercial/Residential Buildings





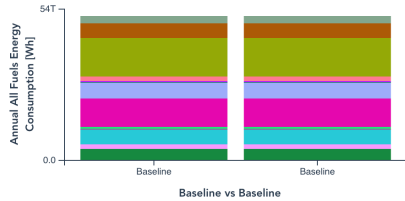
Datasets
FAQ
About ComStock



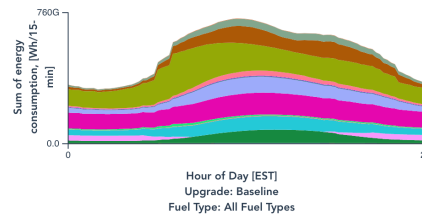
Illinois  
 Fuel Type: All Fuels    Upgrade: Baseline    Output: Energy Consumption [Wh]

Share this Report

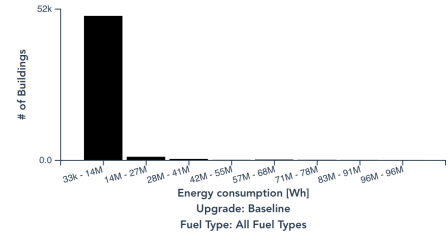
- Legend:
- District Cooling: Cooling
  - District Heating: Heating
  - District Heating: Water Systems
  - Electricity: Cooling
  - Electricity: Exterior Lighting
  - Electricity: Fans
  - Electricity: Heat Recovery



Explore Bar Charts

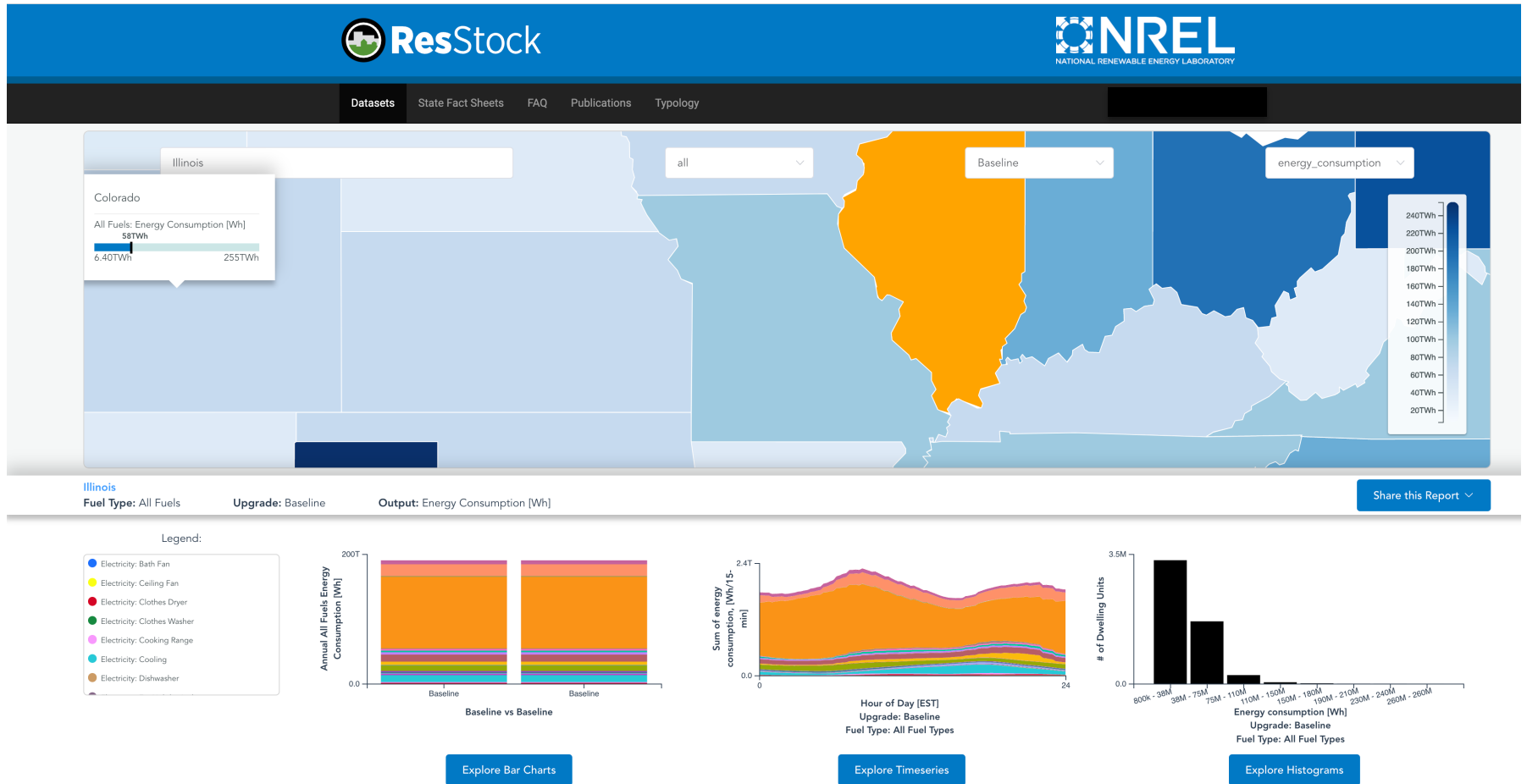


Explore Timeseries



Explore Histograms

# Commercial/Residential Buildings



# Commercial Buildings

- City of Chicago Benchmarking

Building type, sub-type and their frequency in the dataset.

Building Type	Building Subtype						Total
	Commercial	Municipal	Industrial	Multi 7+	Multi < 7	Single Family	
Residential	0	0	0	2192	19,213	25,506	46,911
Commercial	4864	154	0	1652	4609	0	11,279
Industrial	0	0	15	0	0	0	15
Total	4864	154	15	3844	23,822	25,506	58,205

Building characteristics and occupancy features for the buildings in the dataset.

Variable	Observations	Mean	Standard Deviation	Min	Max
Building Height	58,205	1.87	2.20	1	110
Building Size (Gross Floor Area)	58,205	35,820 (ft <sup>2</sup> ) 3328 (m <sup>2</sup> )	116,948 (ft <sup>2</sup> ) 10,865 (m <sup>2</sup> )	300 (ft <sup>2</sup> ) 28 (m <sup>2</sup> )	6,143,038 (ft <sup>2</sup> ) 570,707 (m <sup>2</sup> )
Year Built	58,205	1935.27	31.81463	1852	2014
Total Occupants	58,205	83.90	84.65	0	3000
Average Household Size	58,205	2.34	1.39	0	9
Occupied Unit Percentage	58,205	87%	13%	0%	100%

# Commercial Buildings

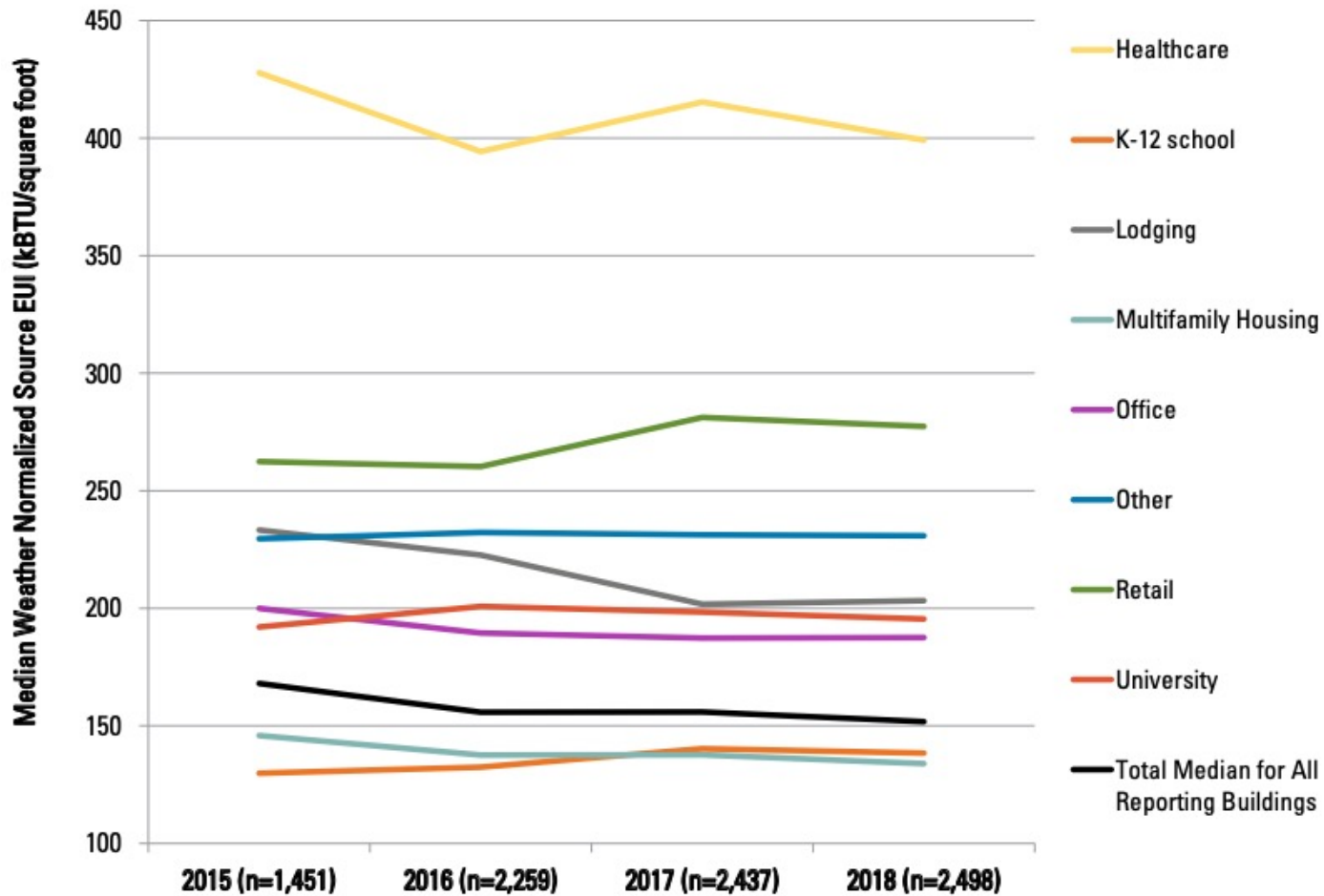
- City of Chicago Benchmarking

Summary statistics of building site EUI used in the model.

Variable	Observations	Mean	Standard Deviation	Min	Max
Building site EUI	58,205	67.29 (kBtu/ft <sup>2</sup> )	30.01 (kBtu/ft <sup>2</sup> )	10.65 (kBtu/ft <sup>2</sup> )	540.00 (kBtu/ft <sup>2</sup> )
		212.28 (kWh/m <sup>2</sup> )	94.68 (kWh/m <sup>2</sup> )	33.60 (kWh/m <sup>2</sup> )	1703.48 (kWh/m <sup>2</sup> )

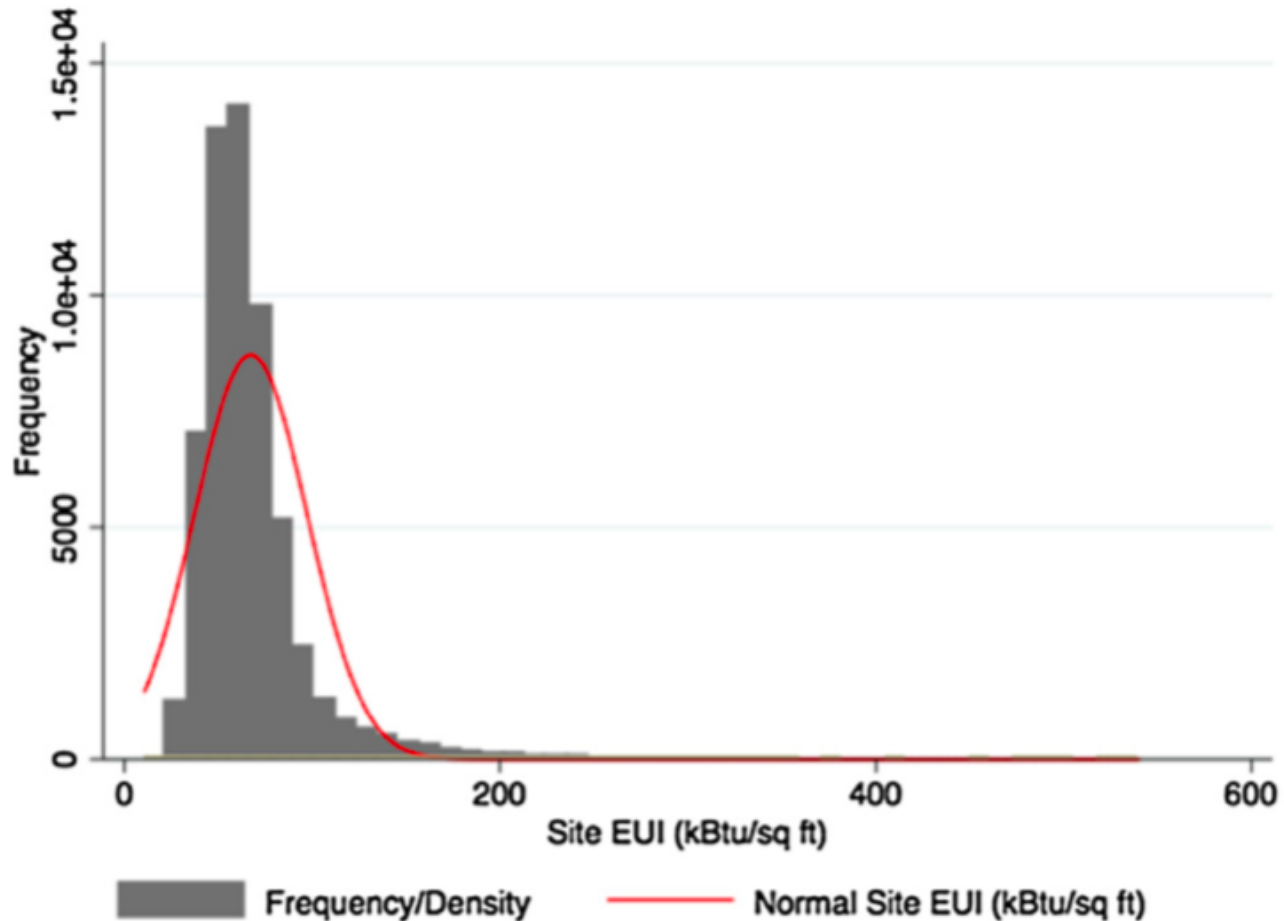
# Commercial Buildings

- City of Chicago Benchmarking



# Commercial Buildings

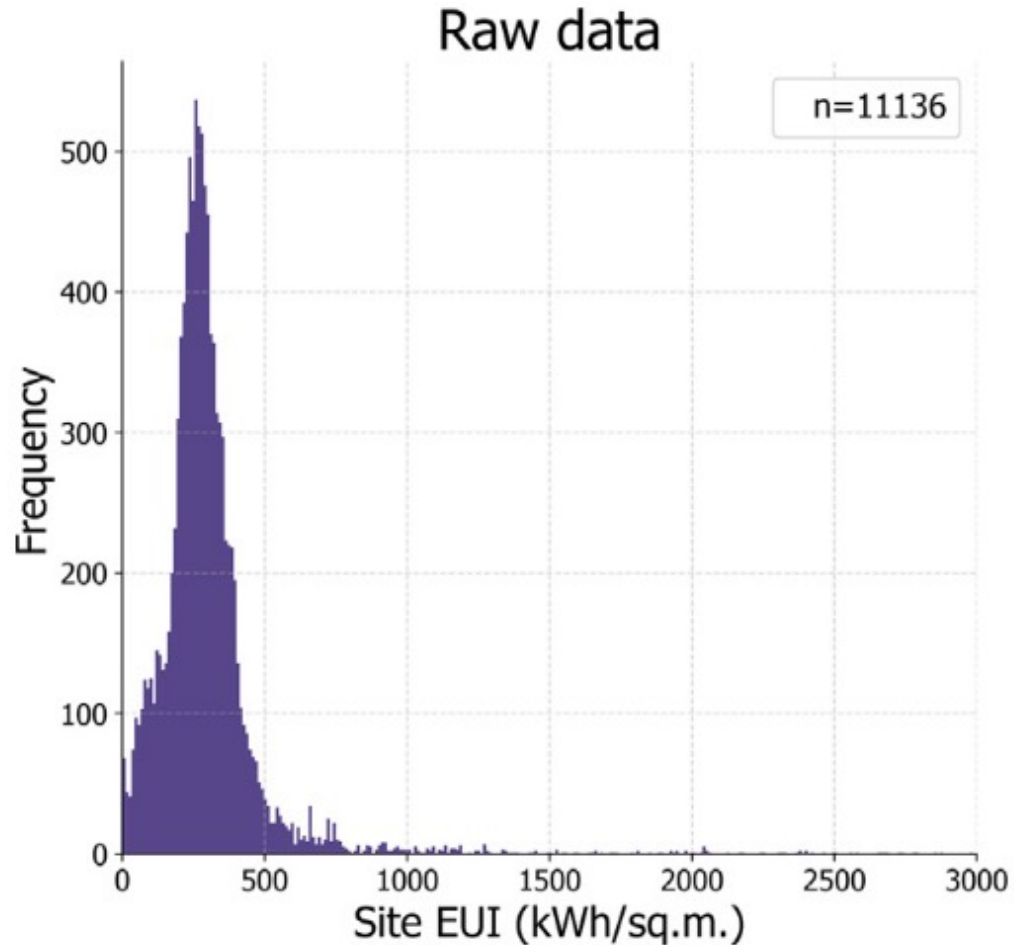
- City of Chicago Benchmarking





# Commercial Buildings

- New York City Benchmarking



# **CLASS ACTIVITY**

# Class Activity

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- Plot electricity and steam vs. monthly average temperature plots for AM Hall building.

# **CLASS ACTIVITY**

# Class Activity

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- Let's aim at using Python or R to re-do the class activities
- Form a team of two
- Present in 20-30 minutes about your progress