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## **Commercial Mortgages: Energy Factors and Default Risk**

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# Outline

- Premise: why commercial mortgages?
- DOE scoping study findings
- Energy factors and mortgage default risk:  
**New results!**

# Premise and Context: Why Commercial Mortgages?

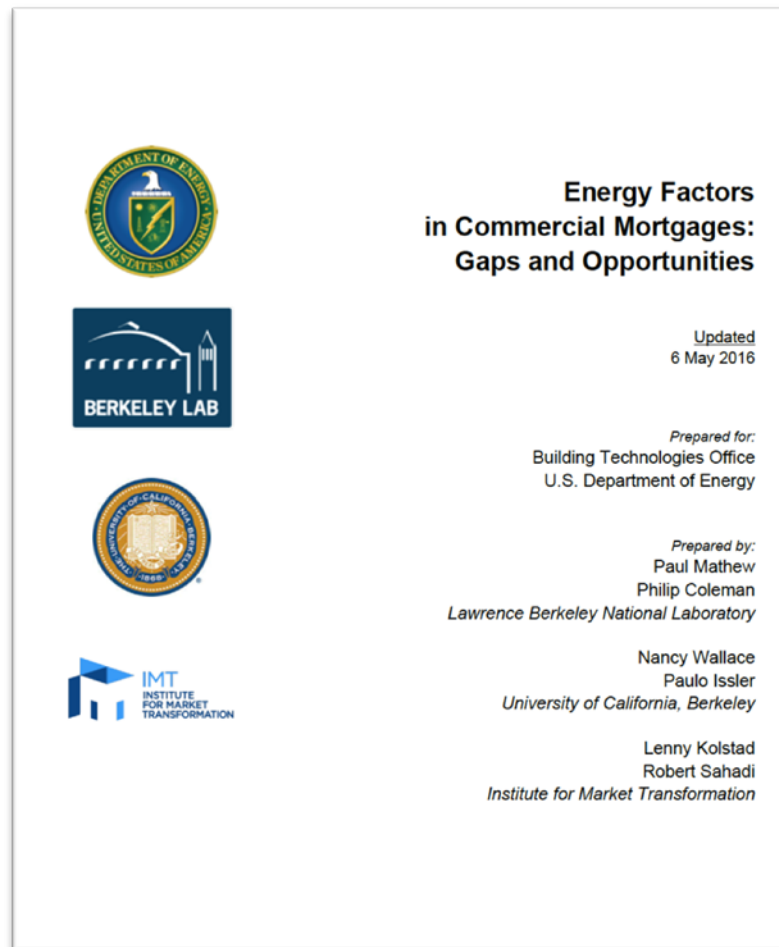
# What about commercial mortgages?

- Commercial mortgages currently do not fully account for energy factors in underwriting and valuation...
- ...energy efficiency is not properly valued and energy risks are not properly assessed and mitigated.
- Commercial mortgages are a large lever and could be a significant channel for scaling energy efficiency.

# Potential Interventions: Results from a Scoping Study

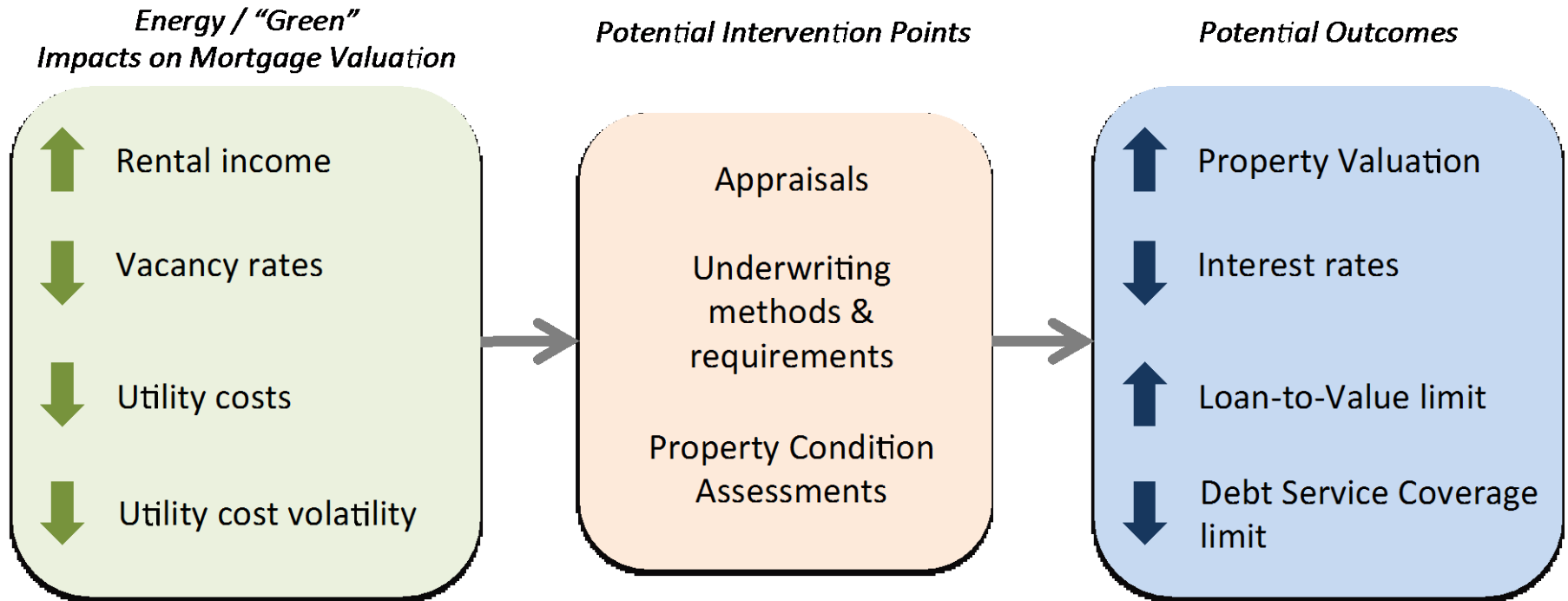
# DOE Scoping Study

- Lit review and 40 stakeholder discussions
  - Lenders
  - Owners
  - Service providers
  - Industry orgs
- State-of-the-market
- Potential Interventions



<https://cbs.lbl.gov/energy-factors-commercial-mortgages>

# Potential interventions and outcomes



# Efforts currently underway

1. Demonstrate to lenders why, where, and how much energy factors “move the needle”  
*- Focus of today’s presentation*
2. Incorporate energy efficiency information in Property Condition Assessments (PCAs)  
*- Seeking participants!*
3. Incorporate energy efficiency routinely in appraisals  
*- DOE working group*



# Impact of Energy Factors on Mortgage Default Risk

# Energy factors that directly affect valuation

- Energy use volume
  - Electricity kWh/kW, fuel therms
  - Driven by building features, operations, weather
- Energy use volatility (+/- %)
  - Driven by operations, weather
- Energy price
  - \$/kWh, \$/kW, \$/therm
- Energy price volatility
  - e.g. forward curves

*How much do these factors affect mortgage default risk?*

# Ideal analysis approach

- Analysis on an empirical data set that has:
  - Time-variant data on energy factors for specific buildings
  - Loan performance data for the same buildings
  - A representative sample across different market segments
- *Challenges:*
  - *Lack of time-variant consumption dataset that can be matched with loan data*
  - *Lack of tariff data for individual buildings*

# Data sources considered

## *Loans*

- TREPP
- Dataquick
- Real Capital Analytics

## *Energy Price*

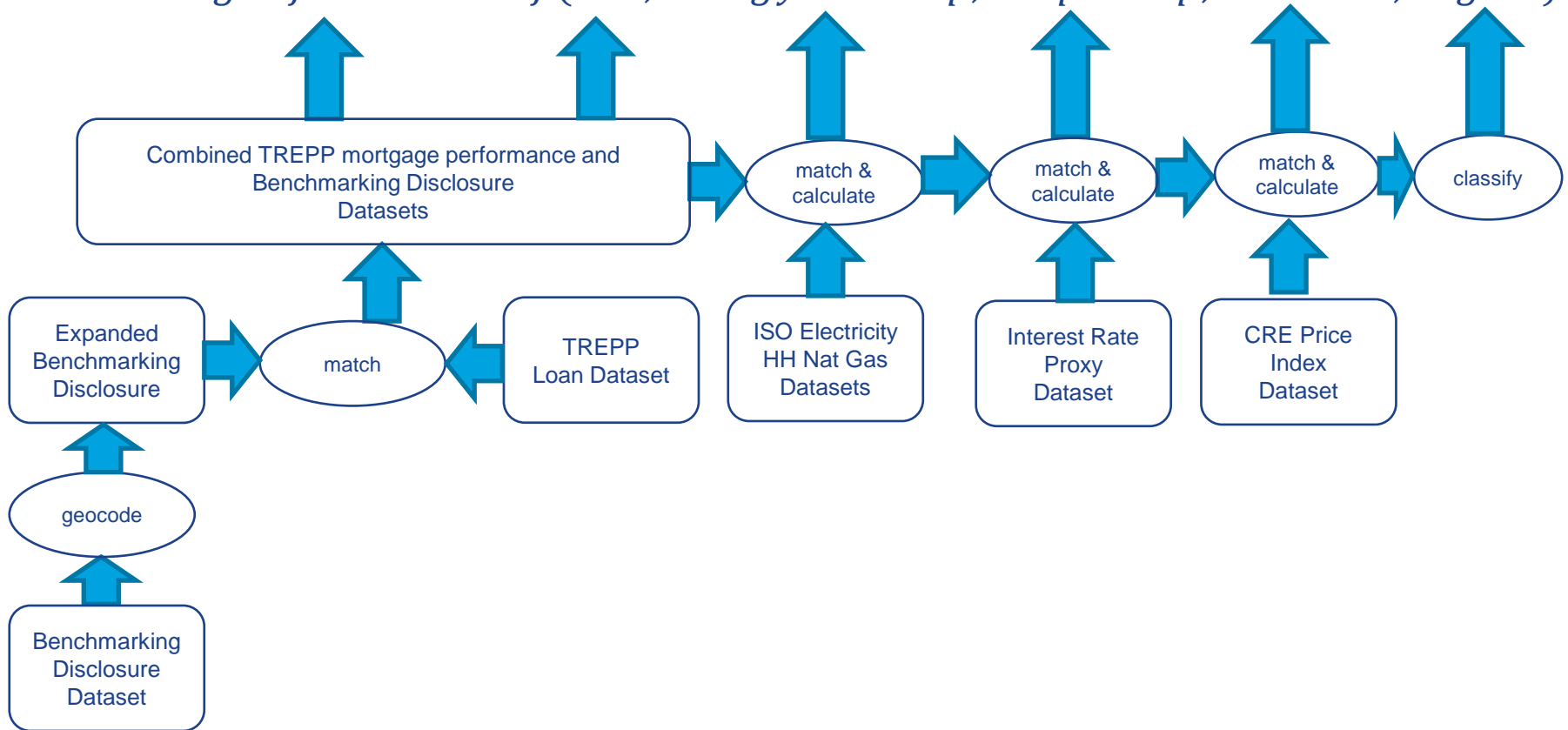
- Utility tariff data
- ISO/RTO
- Platts' forward prices

## *Energy Use*

- Bx Disclosure
- BPD
- Simulations

# Modeling approach: Estimate the loan-level probability of default

$$MtgDefaultRate = f(EUI, EnergyPriceGap, CouponGap, LTVRatio, Region)$$



# Energy price gap

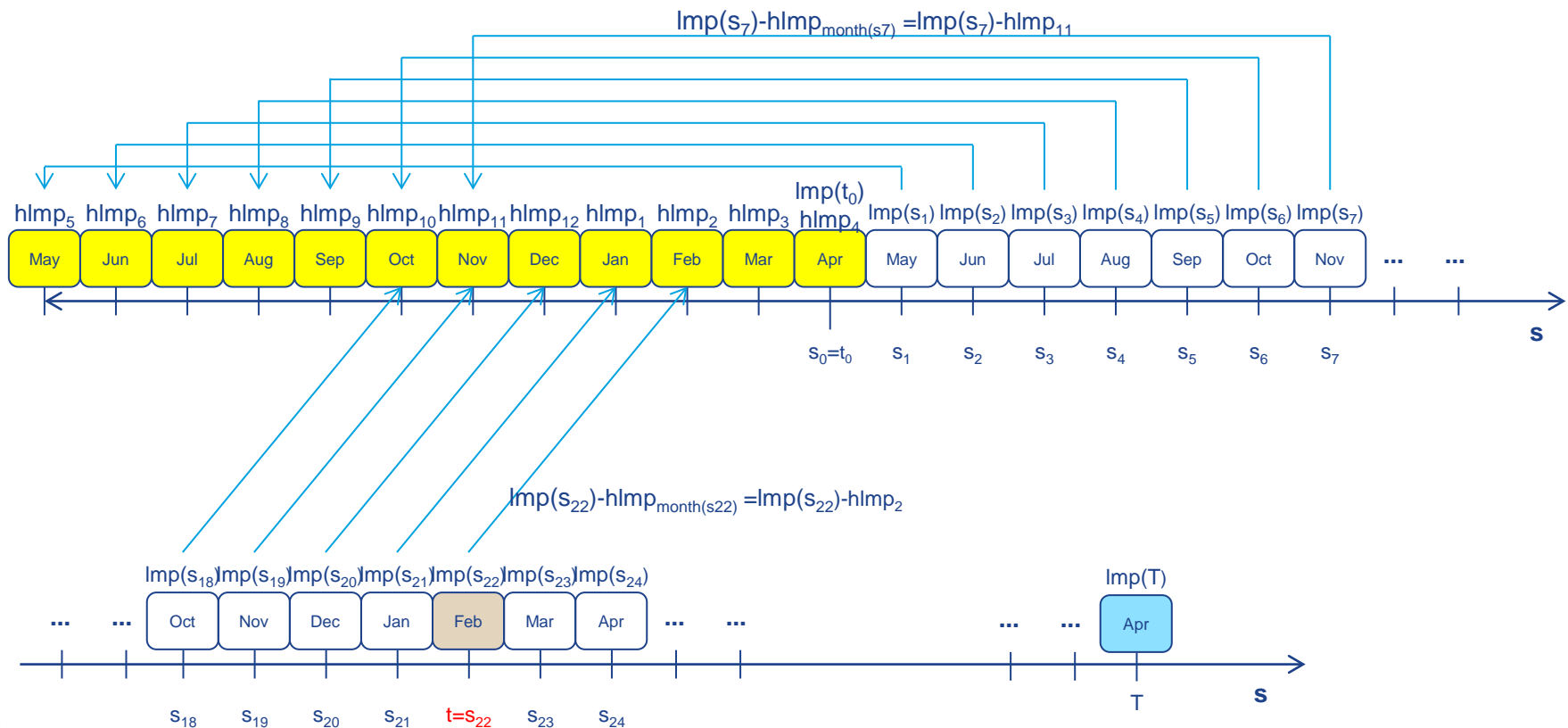
- Proxy for total unexpected energy expenditures
- Computed by summing monthly deviations of realized electricity prices from expected electricity prices at the time of mortgage origination
- Energy price gap, at time  $t$ , for a commercial mortgage originated at a time period  $t_0$  within ISO zone  $k$ :

$$pgap_k(t_0, t) = \sum_{s=t_0}^{s=t} lmp_k(s) - hlmp_{k, month(s)}(t_0)$$

- Where:
  - $lmp$  = monthly average on-peak locational marginal electricity price
  - $hlmp$  = historical monthly average locational marginal price observed at the mortgage origination date.

# Energy price gap

- Example: Evaluating the Energy Price Gap 22 months after the mortgage origination



# Default risk and source EUI: Office and Retail – Linear probability model

|                                   | Coefficient Estimate | Standard Error | Coefficient Estimate  | Standard Error |
|-----------------------------------|----------------------|----------------|-----------------------|----------------|
| Intercept                         | -0.19342             | 0.16448        | -0.40444**            | 0.18466        |
| Log Source EUI                    | 0.06001*             | 0.03159        | 0.07335**             | 0.03129        |
| Origination Loan-to-Value Ratio   |                      |                | 0.00258***            | 0.00096        |
| Coupon Spread to 10 Year Treasury |                      |                | 0.02188               | 0.01565        |
| Electricity Price Gap             |                      |                | 0.00003***            | 0.00001        |
| Time to Maturity on Balloon       |                      |                | -0.00189***           | 0.00060        |
| Origination Year Fixed Effects    | Yes                  |                | Yes                   |                |
| N = 492<br>R2 = .0005             |                      |                | N = 473<br>R2 = .1052 |                |

\* p<0.1; \*\* p<0.05; \*\*\*p<0.01



# Default risk and source EUI: Office and retail – linear prob. model

- The coefficient estimates for **BOTH** the *Electricity Price Gap* and *Source EUI* are significant at better than the .05 level of statistical significance.
- **Both** coefficient estimates are also economically meaningful:
  - The higher the *Source EUI* (the more energy usage per square foot) the higher the likelihood of default.
  - The higher the *Electricity Price Gap*, (the larger the difference between the realized and the expected electricity prices since the loan origination), the higher the likelihood of default.

# Default risk and site EUI: Office and retail – linear prob. model

|   | Coefficient Estimate | Standard Error | Coefficient Estimate  | Standard Error |
|---|----------------------|----------------|-----------------------|----------------|
| Intercept   | -0.05633             | 0.07404        | -0.10734              | 0.08375        |
| Log Site EUI                                      | 0.03169*             | 0.01711        | 0.02685               | 0.01658        |
| Origination Loan-to-Value Ratio                   |                      |                | 0.0015**              | 0.00034        |
| Coupon Spread to 10 Year Treasury                 |                      |                | -0.00002              | 0.00014        |
| Electricity Price Gap                             |                      |                | 0.00002***            | 0.00000        |
| Time to Maturity on Balloon                       |                      |                | -0.00048*             | 0.00028        |
| Origination Year Fixed Effects/Year Fixed Effects | Yes                  |                | Yes                   |                |
| N = 535<br>R2 = .002                              |                      |                | N = 516<br>R2 = .0701 |                |

\*  $p < 0.1$ ; \*\*  $p < 0.05$ ; \*\*\*  $p < 0.01$

# Default risk and site EUI: Office and retail – linear prob. model

- *Site EUI* is not statistically significantly different from 0 at better than .05 level.
- Electricity Price Gap is significant at better than the .05 level of statistical significance.
- Both coefficients have economically meaningful signs:
  - The higher the *Site EUI* (the more energy usage per square foot) the higher the likelihood of default.
  - The higher the *Electricity Price Gap*, (the larger the difference between the realized and the expected electricity prices since the loan origination), the higher the likelihood of default.

# Default risk and ENERGY STAR Score: Office and retail – linear prob. model

|   | Coefficient Estimate | Standard Error | Coefficient Estimate | Standard Error |
|---|----------------------|----------------|----------------------|----------------|
| Intercept   | 0.18650**            | 0.05788        | 0.18383*             | 0.11046        |
| Energy Star Score                                 | -0.00102             | 0.00079        | -0.00134*            | 0.00077        |
| Origination Loan-to-Value Ratio                   |                      |                | 0.00183*             | 0.00099        |
| Coupon Spread to 10 Year Treasury                 |                      |                | -0.00028             | 0.00021        |
| Electricity Price Gap                             |                      |                | 0.00004***           | 0.00001        |
| Time to Maturity on Balloon                       |                      |                | -0.00166**           | 0.00054        |
| Origination Year Fixed Effects/Year Fixed Effects | Yes                  |                | Yes                  |                |
| N = 448<br>R2 = .002                              |                      |                | N = 432<br>R2 = .071 |                |

\* p<0.1; \*\* p<0.05; \*\*\*p<0.01

# Default risk and ENERGY STAR score: Office and Retail – Linear Prob. Model

- *Energy Star Score* is not statistically significantly different from 0 at better than .05 level.
- Electricity Price Gap is significant at better than the .05 level of statistical significance.
- Both coefficients have economically meaningful signs:
  - The higher the *Energy Star Score* (the more energy efficient the building) the lower the likelihood of default.
  - The higher the *Electricity Price Gap*, (the larger the difference between the realized and the expected electricity prices since the loan origination), the higher the likelihood of default.

# What are the impacts on specific cases?

## – Scenario analysis

- Develop range of scenarios that have different energy factor risks
  - Range of locations, building features, operations, etc.

For each scenario:

- Determine energy consumption and price volatility.
  - Use combination of empirical and simulation approaches
- Use hazard model coefficients to determine impact on default risk

# Asset types

| Use    | Size    | Climate | Asset eff | Notes             |
|--------|---------|---------|-----------|-------------------|
| Office | 500,000 | 4A      | High      | ~ 90.1-2013       |
| Office | 500,000 | 4A      | Medium    | ~ 90.1-2004       |
| Office | 500,000 | 4A      | Low       | Pre-1980 envelope |
| Office | 500,000 | 2A      | High      | ~ 90.1-2013       |
| Office | 500,000 | 2A      | Medium    | ~ 90.1-2004       |
| Office | 500,000 | 2A      | Low       | Pre-1980 envelope |
| Office | 200,000 | 4A      | Medium    | ~ 90.1-2004       |
| Office | 25,000  | 4A      | Medium    | ~ 90.1-2004       |
| ...    |         |         |           |                   |

# A wide range of factors affect year-to-year energy use variations

## Facilities management

Economizer settings

VAV box minimum flow setting

Supply air temperature reset

Static pressure reset

Chilled water/Hot water supply temperature reset

Condenser water temperature reset

Chiller /boiler sequencing

...

**Weather**

**Vacancy rates**

## Occupant behavior

Lighting controls

Window operation

Thermostat setpoints/setback

Local heating/cooling equipment

Plug in equipment

## Maintenance

Damper/ valve check

Filter change

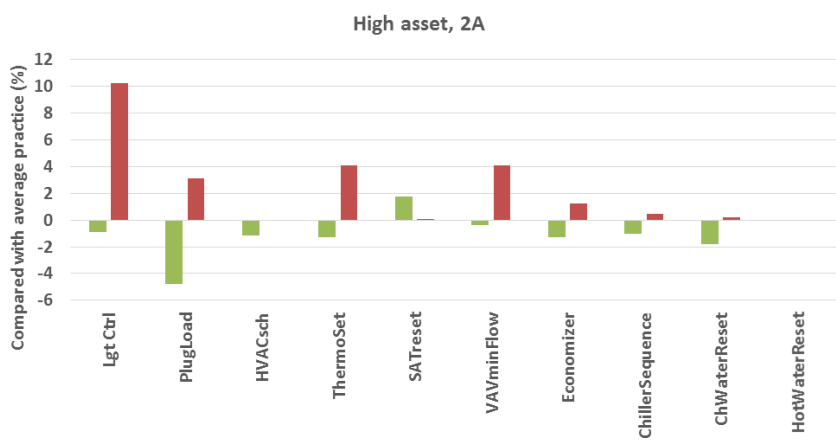
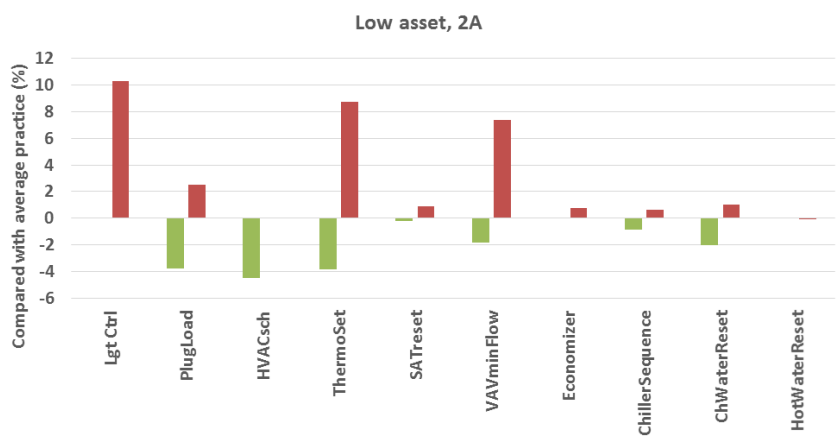
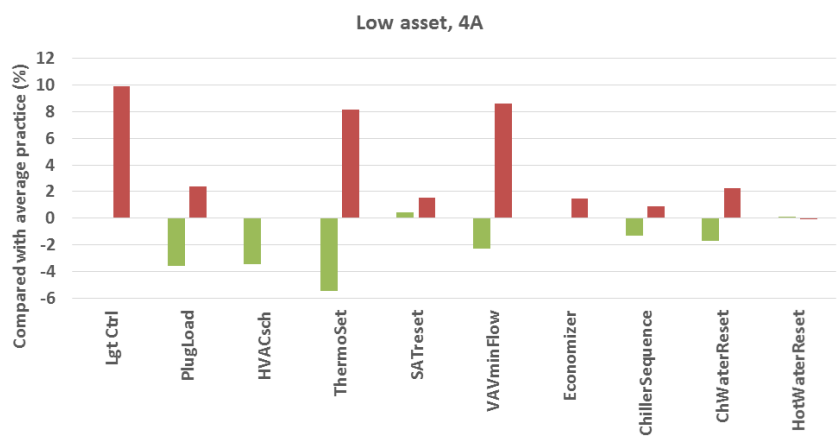
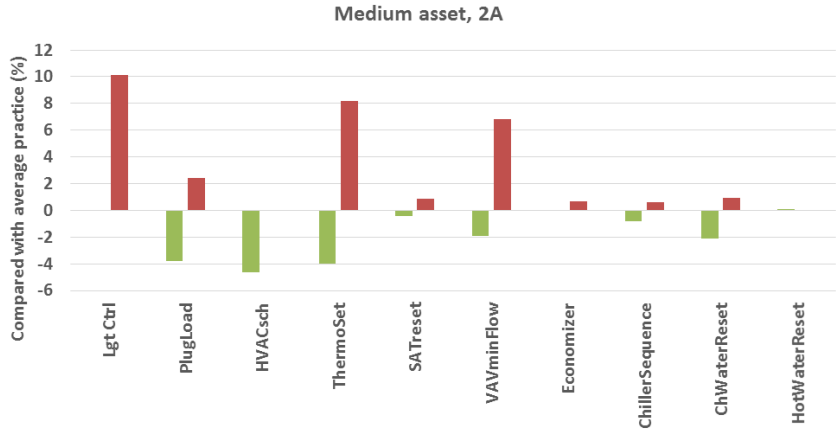
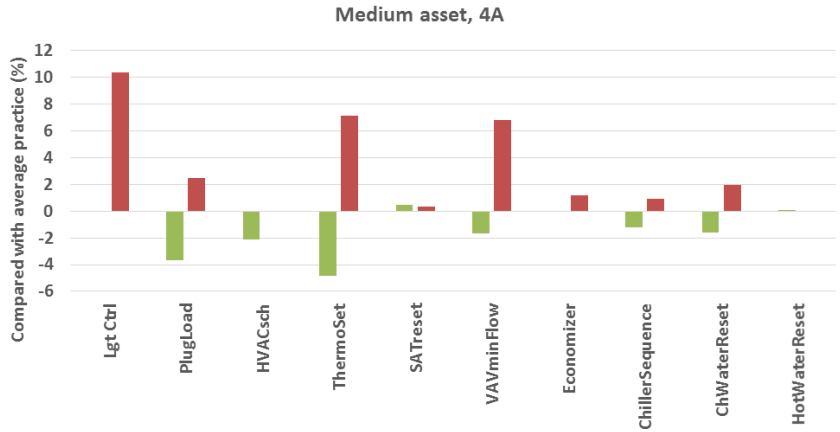
Coil cleaning

...



# Range of practice for each factor

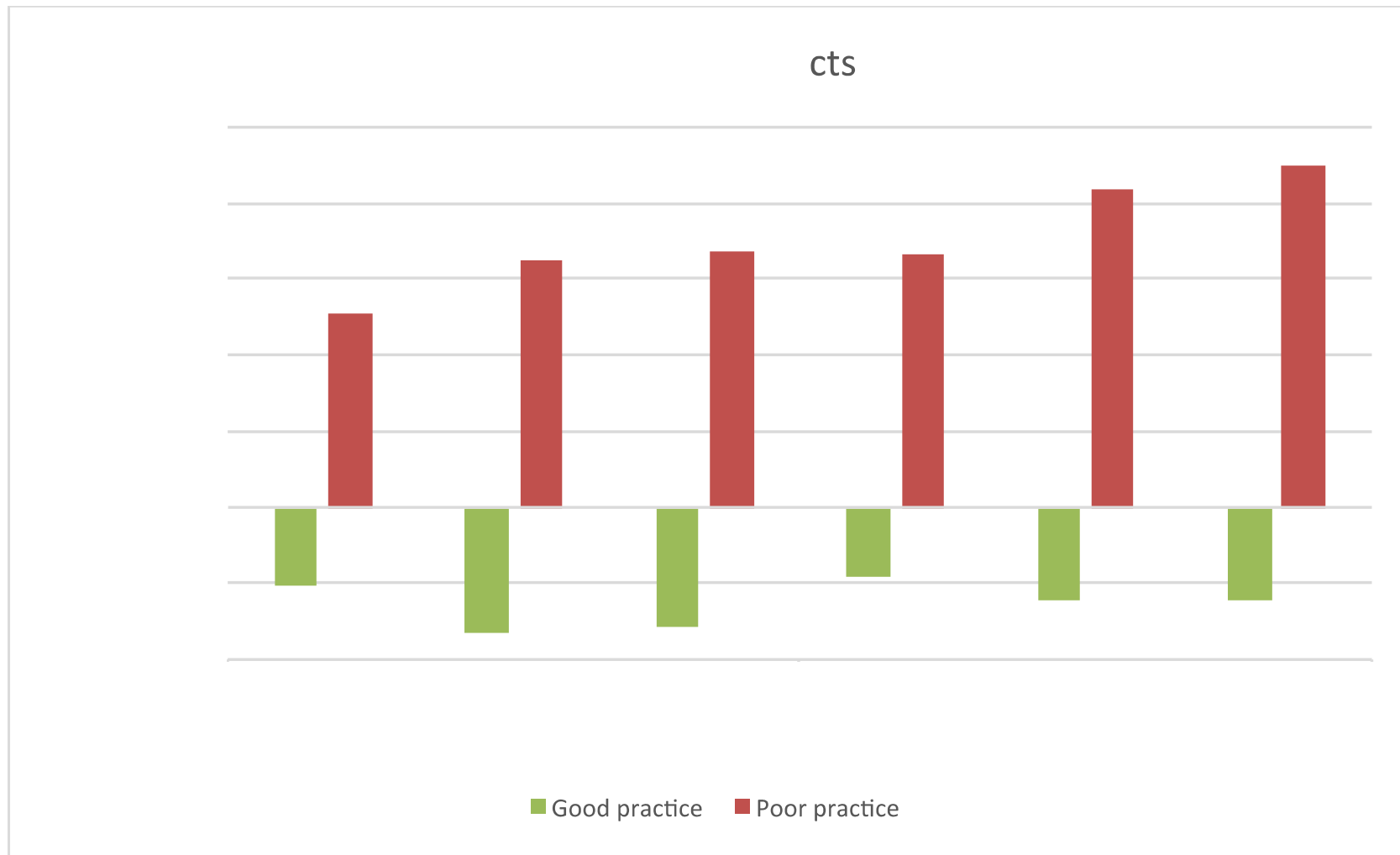
| Factor                          | Good practice  | Average practice   | Poor practice                                       |
|---------------------------------|--|--|---|
| Lighting controls               | Daylight-dimming + occ   | Occ only   | Timer only  |
| Plug load controls              | Turn off when occupants leave  | Sleep mode by itself   | No energy saving measures                           |
| HVAC schedule                   | optimal start  | 2hr +/- Occupant sch   | n/a   |
| Thermostat settings             | 68°F for heating and 78°F for cooling<br>Setback: 60 - 85                  | 70°F for heating and 76°F for cooling<br>Setback: 68 - 80                        | 72°F for heating and 74°F for cooling<br>No setback |
| Supply air temp reset           | SAT reset base on warmest zones  | SAT reset based on the stepwise function of outdoor air temperature              | Constant supply air temperature                     |
| VAV box min flow settings       | 15% of design flow rate.   | 30% of design flow rate.   | 50% of design flow rate.                            |
| Economizer controls             | Enthalpy   | dry bulb   | none/broken   |
| Chilled water supply temp reset | Reset chilled water temperature based on cooling demand.                   | Linear relationship with outside air temp (OAT).                                 | No reset with constant year-round.                  |
| Chiller sequencing              | Kick on the lag chiller when the lead chiller reaches its peak efficiency. | Kick on the lag chiller when the chilled water temperature cannot be maintained. | Always running two chillers                         |
| Hot water supply temp reset     | Reset the hot water supply temperature according to heating load.          | Linear relationship with OAT.  | No reset with constant year-round.                  |
| Boiler sequencing               | Kick on the lag boiler when lead boiler reaches its peak efficiency.       | Kick on the second boiler based on OAT.  | No sequencing and always running two boilers.       |
| Plug load intensity             | 0.4 W/sf   | 0.75 W/sf  | 2.0W/sf   |
| Occupant density                | 400 sf/per   | 200 sf/per   | 130 sf/per  |
| Occupant schedule               | 8 hour WD  | 12 Hr WD   | 16 Hr WD  |



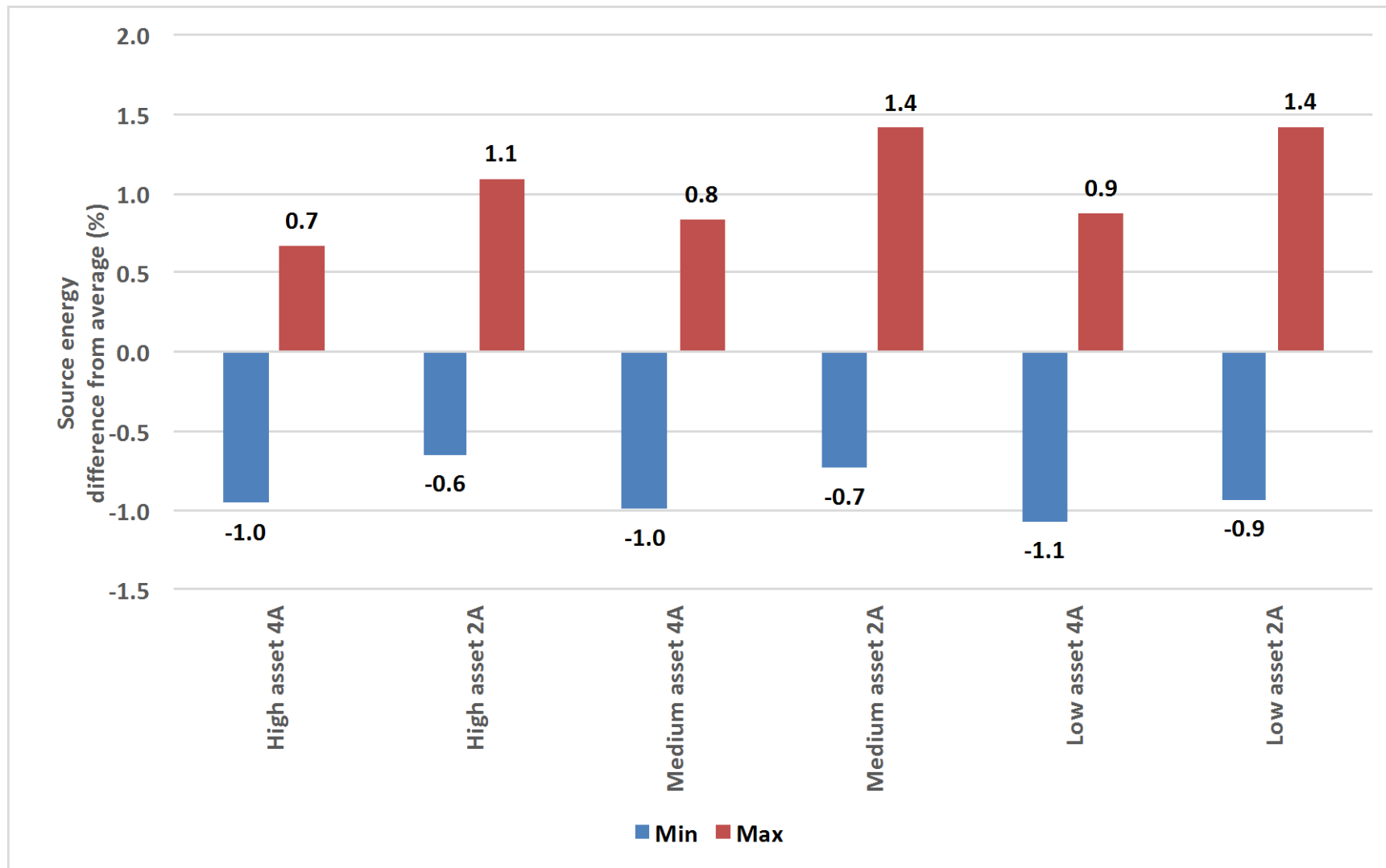
Good practice Poor practice

Good practice Poor practice

# Range of variation due to operation factors



# Range of variation due to weather: 2000-2015



# Net impacts on default risk - illustrative

| Case                      | Source EUI (kBtu/sf.yr) | Change in default risk (absolute) | % Change in default risk (relative to TREPP avg) |
|---------------------------|-------------------------|-----------------------------------|--|
| Baseline                  | 200                     | -                                 | -  |
| Poor operational practice | 260 (+30%)              | +0.0084                           | <b>+ 10.5%</b>                                   |
| Good operational practice | 180 (-10%)              | -0.0034                           | <b>- 4.25%</b>                                   |

# Limitations of these results

- Limited to CMBS.
- Uses proxies for energy cost i.e. source EUI and wholesale energy price gap.
- Source EUI data is only an annual "snapshot".
- Matched data scope is limited by location, building types, and size.

# Looking ahead

- Analysis
  - Default risk analysis using RCA bank loan data.
  - Actuarial-style “look up” of energy risks based on key asset and operational characteristics.
- Disseminate analysis results
  - Primary audience: Lenders and owners
  - via webinars, conferences, technical reports
- Engage lenders and owners to:
  - Develop methods and procedures to fully incorporate energy factors in mortgage valuation.
  - Apply these methods and procedures in commercial mortgages and document results in case studies.

*Please let us know if you would like to participate!  
Contact Cindy Zhu (DOE): [Cindy.Zhu@ee.doe.gov](mailto:Cindy.Zhu@ee.doe.gov)*

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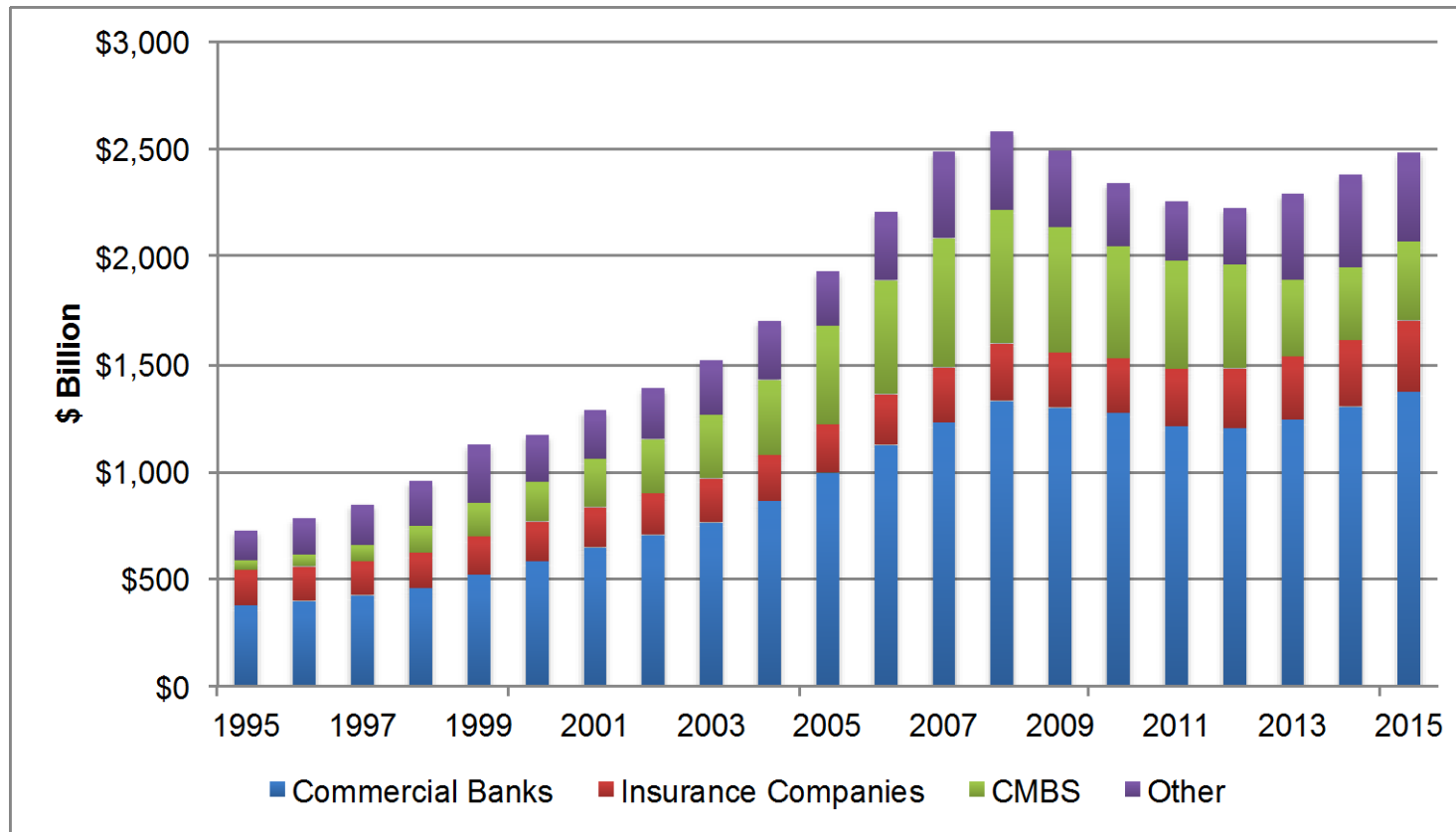
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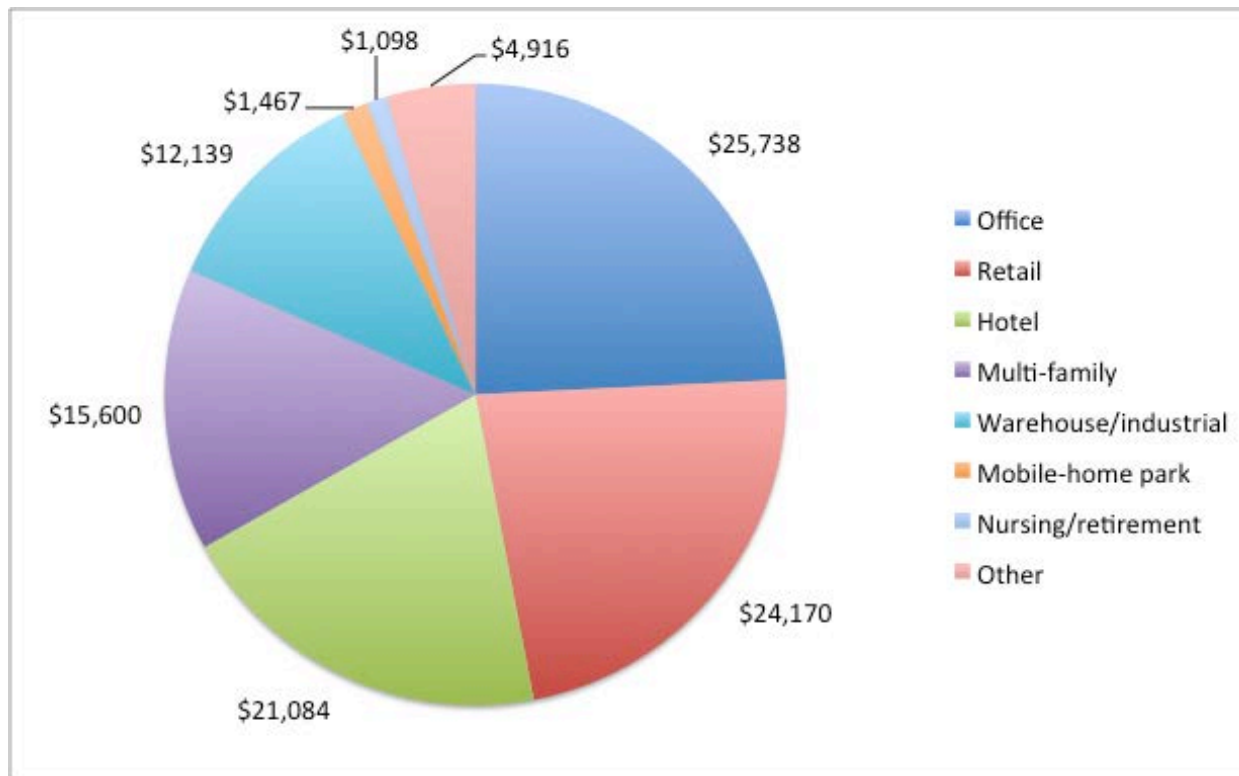
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# Appendix

# \$ 2.5 trillion market



# Key CMBS sectors: Office, Retail, Hotel, Multi-family



# Challenges and opportunities...1

- Energy efficiency is generally not a motivating factor for lenders.
- Very limited awareness and analysis of energy cost impacts in underwriting.
- Underwriting is not standardized across the industry.

# Challenges and opportunities...2

- Property Condition Assessment (PCA) generally does not include energy efficiency information.
- Most appraisals do not consider energy efficiency features in property valuation.

# Challenges and opportunities...3

- Many owners have not seen impact of energy factors on building value in their own portfolios.
- Context matters: all real estate is local. The impact of energy factors on valuation varies significantly by location, building type, quality, and market conditions.