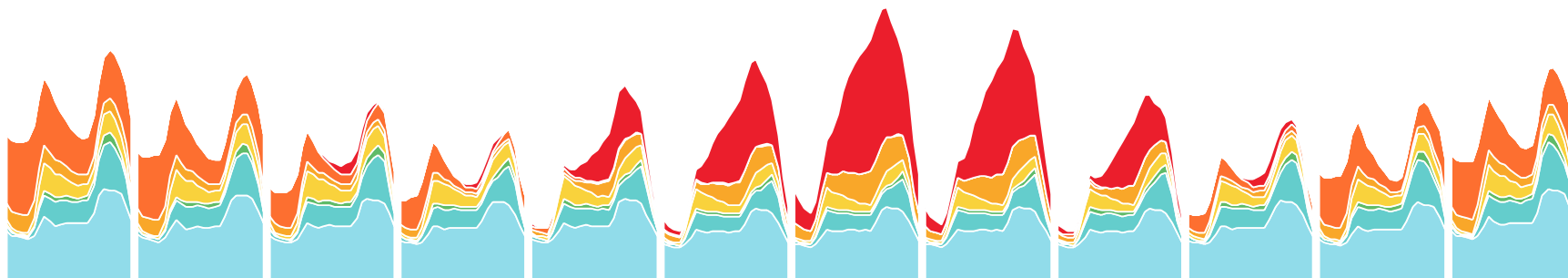


End-Use Load Profiles for the U.S. Building Stock



Performing Organizations:

National Renewable Energy Laboratory (NREL)
Lawrence Berkeley National Laboratory
Argonne National Laboratory

Principal Investigator:

Eric Wilson, Senior Research Engineer, NREL
303.275.4676 | eric.wilson@nrel.gov

Project Summary

New project in FY19

Timeline:

Start date: 10/1/2018

Planned end date: 9/30/2021

Key Milestones

1. Technical Advisory Group established;
12/31/18
2. Year 1 Report; Go/No-go Decision
8/1/19

Budget:

Total Project \$ to Date:

- DOE: \$3,000,000
- Cost Share: \$0

Total Project \$:

- DOE: \$9,000,000
- Cost Share: \$1,000,000*

*anticipated

Key Partners:

| |
|--|
| Northeast Energy Efficiency Partnerships |
| Electric Power Research Institute |
| Northwest Energy Efficiency Alliance |
| New York State Energy Research and Development Authority |
| Massachusetts Clean Energy Center |

Project Outcome:

The project is focused on producing a nationally comprehensive, validated dataset of end-use load profiles for the U.S. building stock.

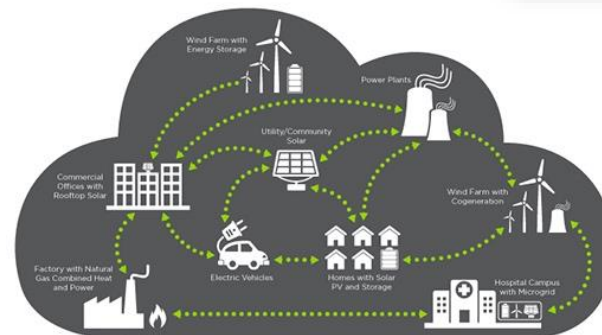
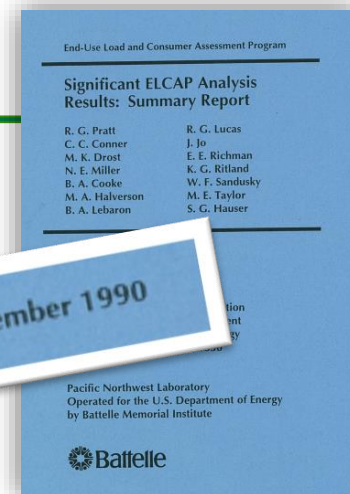
This dataset is needed to enhance understanding of the time-sensitive value of energy efficiency and energy flexibility, so that utilities, states, and cities continue to invest in “**improving the energy efficiency of our homes and buildings**” (EERE Goal 3; BTO Multi-Year Program Plan FY16–FY20, p11).

Beyond the dataset, the project will result in validated modeling capabilities for evaluating how building technologies can “**enable the integration of clean electricity into a reliable, resilient, and efficient grid**” (EERE Goal 5; BTO Multi-Year Program Plan FY16–FY20, p11).

Challenge

Existing end-use load profiles

- are often outdated and limited to certain regions and building types because of the **high cost** of traditional end-use sub-metering
- are insufficient for accurate evaluation of numerous **emerging use cases** of grid-interactive and efficient buildings



Source: Navigant

Opportunity

- New ResStock™ and ComStock™ models statistically represent energy use of U.S. buildings
- Models produce hourly end-use load profiles, but calibration efforts to date have focused on annual energy use

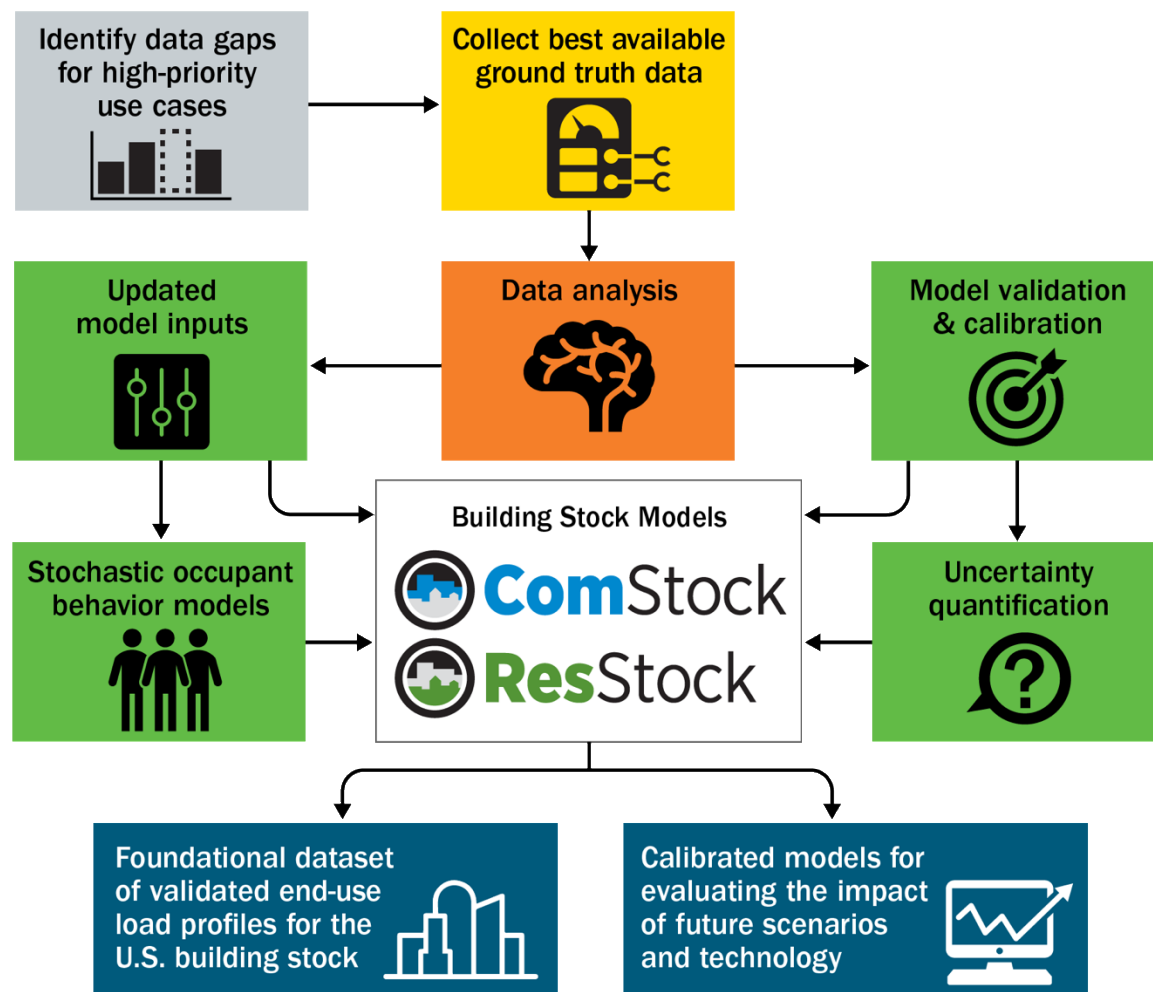


Approach

Hybrid approach combines best-available ground-truth data—

- submetering studies,
- statistical disaggregation of whole-building interval meter data, and
- other emerging data sources

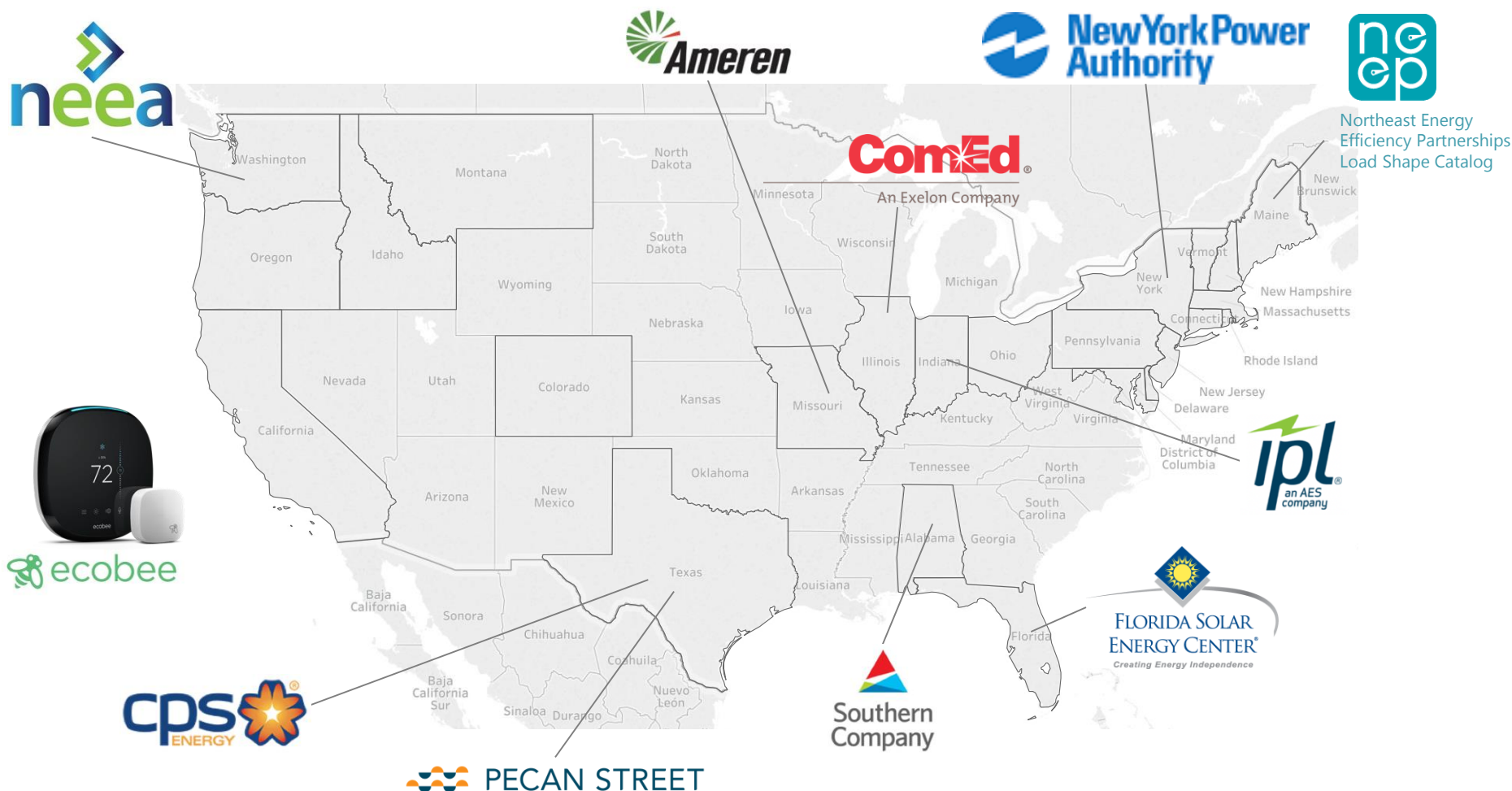
—with the reach, cost-effectiveness, and granularity of physics-based and data-driven building stock modeling capabilities



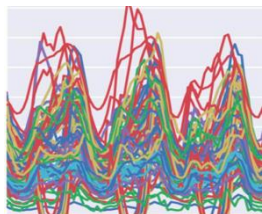
The novel approach delivers a nationally-comprehensive dataset at a fraction of the historical cost.

Approach – Examples of Data Sources

Acquired or actively pursuing 20 (and growing) data sources from around the U.S. – *Selected examples:*



Approach – Example Data Source Usage



Load research data

- 192 customer class profiles from 30 utility companies
- 60-min interval data
- E.g., residential w/o electric heat, large general service



Value derived through analysis

- Sector total ground truth
- Non-weather dependent load shape/magnitude
- Cooling/heating season length/magnitude



ComEd Anonymous Data Service

- All ~4 million meters in northern Illinois
- 30-min interval data
- Meters tagged with ZIP/ZIP+4 code and customer class



All listed above, plus

- Diversity in customer base load and cooling/heating patterns
- Statistical conditional demand disaggregation (if paired with saturation surveys)
- Demographic correlations



Residential Building Stock Assessment: Metering Study (2011)

- 100 homes in northwest U.S.
- 15-min sub-metered circuits
- Home audit data available from larger RBSA study



All listed above, plus

- End-use ground truth data for one region (some end-uses transferrable to other regions)
- Correlations with audit data

Proposal Team

Organization

Key Team Members



Eric
Wilson (PI)



Andrew
Parker (Co-PI)



Dr. Rajendra
Adhikari



Dr. Jianli
Chen



Dr. Lieko
Earle



Rawad
El Kontar



Dr. Anthony
Fontanini



Dr. Sammy
Houssainy



Dr. Janghyun
Kim



Elaina
Present



Dr. Janet
Reyna



Lawrence Berkeley
National Laboratory



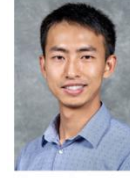
Natalie Mims
Frick (Co-PI)



Lisa Schwartz



Dr. Tianzhen
Hong



Han Li



Tom Eckman



Dr. Ralph
Muehleisen



Dr. Qi Li



ELECTRIC POWER
RESEARCH INSTITUTE



Chris Holmes



Krish Gomatom



Northeast
Energy
Efficiency
Partnerships



Elizabeth Titus



Claire Miziolek

Proposal Team – Expertise

Organization

Domain expertise



Building energy modeling (BEM)
Building stock modeling
Residential occupant behavior



Lawrence Berkeley
National Laboratory

Time-sensitive valuation of EE
Utility integrated resource planning
Commercial occupant behavior



Uncertainty quantification



Load profile conditional demand analysis
Electric utility engagement



Northeast
Energy
Efficiency
Partnerships

Northeast regional stakeholder engagement
Northeast regional data sources

Impact

A BTO survey found that end-use load profiles are the **most essential data resource** currently missing for time-sensitive valuation of energy efficiency.

End-use load profiles

- are needed by the utility industry to **accurately account for EE and DR** in forecasting, resource planning, distribution system planning, and other applications.

Project results

- Will be used by BTO GEB work moving forward
- Will prioritize DOE R&D investments (e.g., via Scout)

Project results will likely be used by electric utilities across the U.S.

Significant utility industry interest demonstrated by 65 advisory group members contributing their time to the project

Foundation for understanding **demand flexibility**—and its relationship to EE—across the building stock

Progress – Stakeholder Engagement

New project in FY19;
Progress shown is since
October 2019 (6 months)

- Created technical advisory group with 65 members representing utilities, regulators, experts and consultants, energy efficiency regional organizations and vendors.
 - Held first technical advisory group meeting in November 2018.
 - Convened second (in-person) technical advisory group meeting in March 2019—focused on identifying market needs, use cases and data gaps.



In-kind participation by 65
advisory group members

Progress – Use Cases, Data Gaps

New project in FY19;
Progress shown is since
October 2019 (6 months)

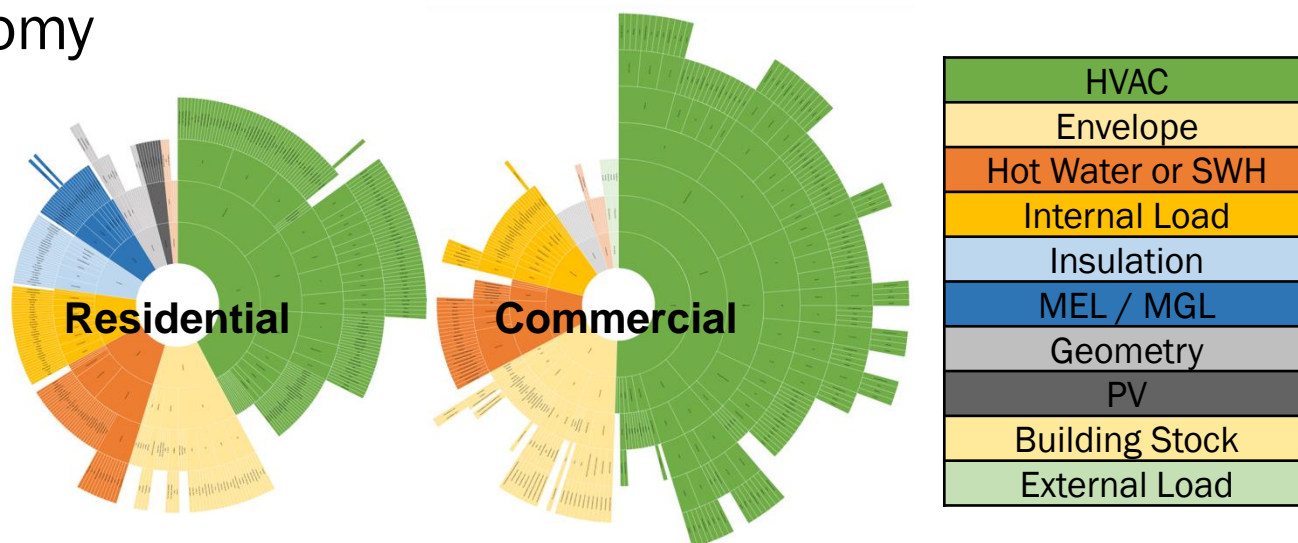
Use Cases

- Identified approximately 75 use cases for end-use load profiles

Data Gaps

- Categorized approximately 500 high-level inputs for ResStock/ComStock,
 - documented the data sources currently being used for each,
 - identified potential data sources for future improvements, and
 - identified the highest priority input data gaps

Parameter taxonomy for gaps analysis



Progress – Occupancy Modeling

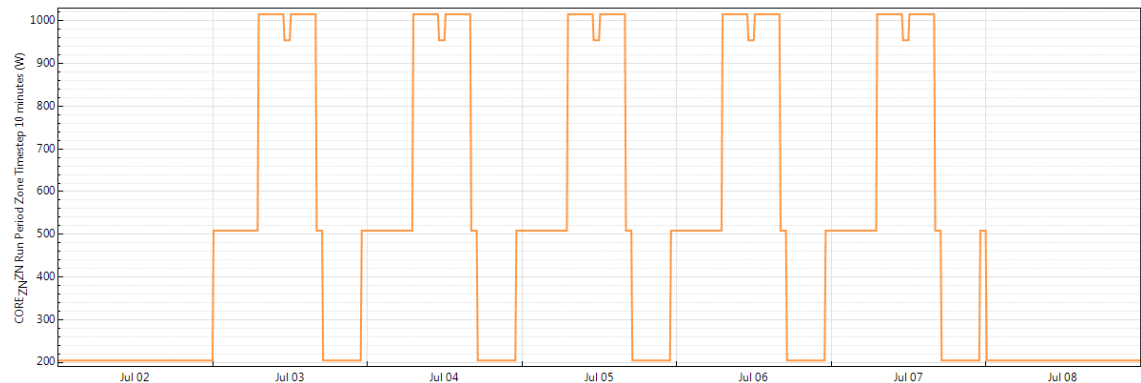
New project in FY19;
Progress shown is since
October 2019 (6 months)

Occupancy Modeling

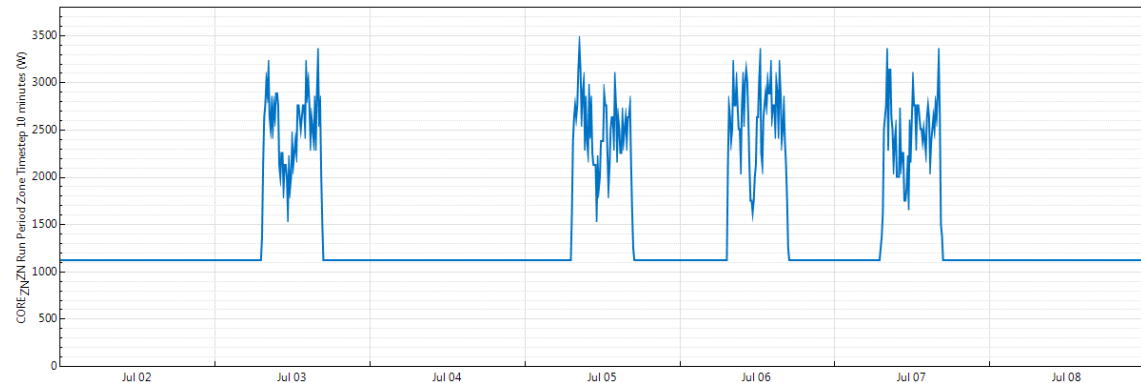
- Completed initial literature review on residential stochastic occupant behavior models
- Progress developing commercial building stochastic occupant behavior models for several commercial building types

Office misc. plug loads

Existing



With LBNL's
stochastic
occupancy
model

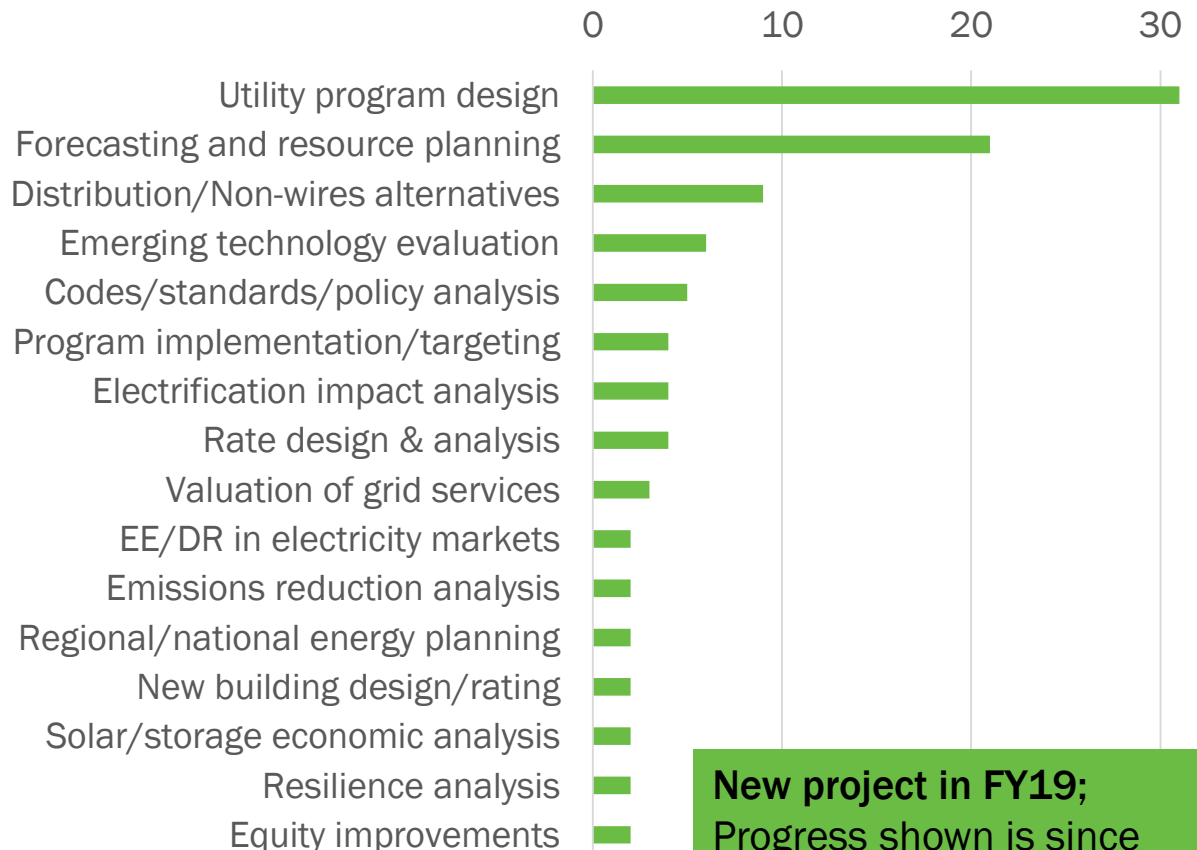
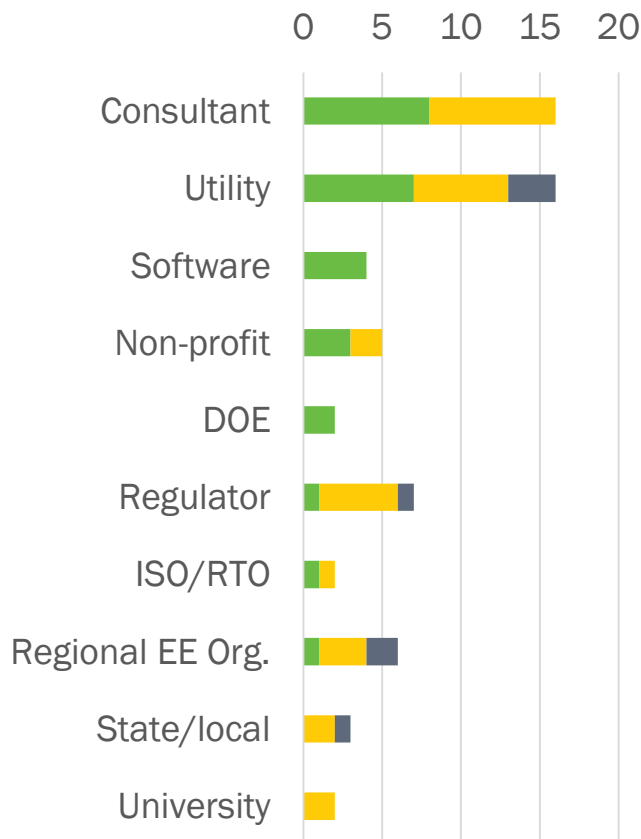


Progress – Stakeholder Use Case Prioritization

Attendees of members at
March 5–6 Meeting

- In-person attendance
- Call-in (registered)
- Did not attend

List 3 use cases that are high priority for you



New project in FY19;
Progress shown is since
October 2019 (6 months)

Progress – Top Use Case Data Requirements (DRAFT)

Indicates requirement typically outside status quo

| Use Case | Rank | Time resolution | Geographic resolution | End-uses | Stochastic Occupancy | Electrical Characteristics |
|-------------------------------------|------|--------------------|--------------------------------|----------|----------------------|-------------------------------|
| Utility program design | 1 | Hourly or peak day | Service territory | Yes | No | Real power |
| Forecasting and resource planning | 2 | Hourly or peak day | Service territory | Yes | No | Real power |
| Distribution/Non-wires alternatives | 3 | 15-min or smaller | Distribution feeder | Yes | Yes | Real, reactive power, voltage |
| Emerging technology evaluation | 4 | Depends on rates | Service territory or larger | Yes | Yes | Depends on application |
| Codes/standards/policy analysis | 5 | 15-min to hourly | State, climate zone | Yes | Yes | Real power |
| Program implementation/targeting | 6 | Hourly | Service territory or smaller | Yes | No | Real power |
| Electrification impact analysis | 6 | Hourly | Service territory or smaller | Yes | Yes | Real power |
| Rate design & analysis | 6 | 15-min | Service territory or smaller | No | Yes | Real power |
| Valuation of grid services | 9 | Hourly or smaller | Feeders to markets | Yes | Yes | Depends on application |
| EE/DR in electricity markets | 10 | 15-min to hourly | Service territory or larger | Yes | Yes | Real power |
| Emissions reduction analysis | 10 | Hourly | Service territory or larger | Yes | No | Real power |
| Regional/national energy planning | 10 | Hourly | Regional or national | Yes | No | Real power |
| New building design/rating | 10 | 15-min to hourly | Weather station | Yes | Yes | Real power |
| Solar/storage economic analysis | 10 | 1-min | Weather station | No | Yes | Real power |
| Resilience analysis | 10 | 1-min to hourly | Distribution feeder or smaller | Yes | Yes | Depends on application |
| Equity improvements | 10 | Hourly | Service territory or smaller | Yes | Yes | Real power |

Stakeholder Engagement

In-kind participation by 65 advisory group members



Stakeholder Engagement

Technical Advisory Group in-person meeting
March 5–6, 2019

40 non-lab attendees
(including 13 on phone)

“This is a good start”

“This was as good as it gets for engaging people across different locations and disciplines.”

“It was very useful to engage in breakout sessions to develop a broader understanding on how people will use these.”

“This format worked well.”

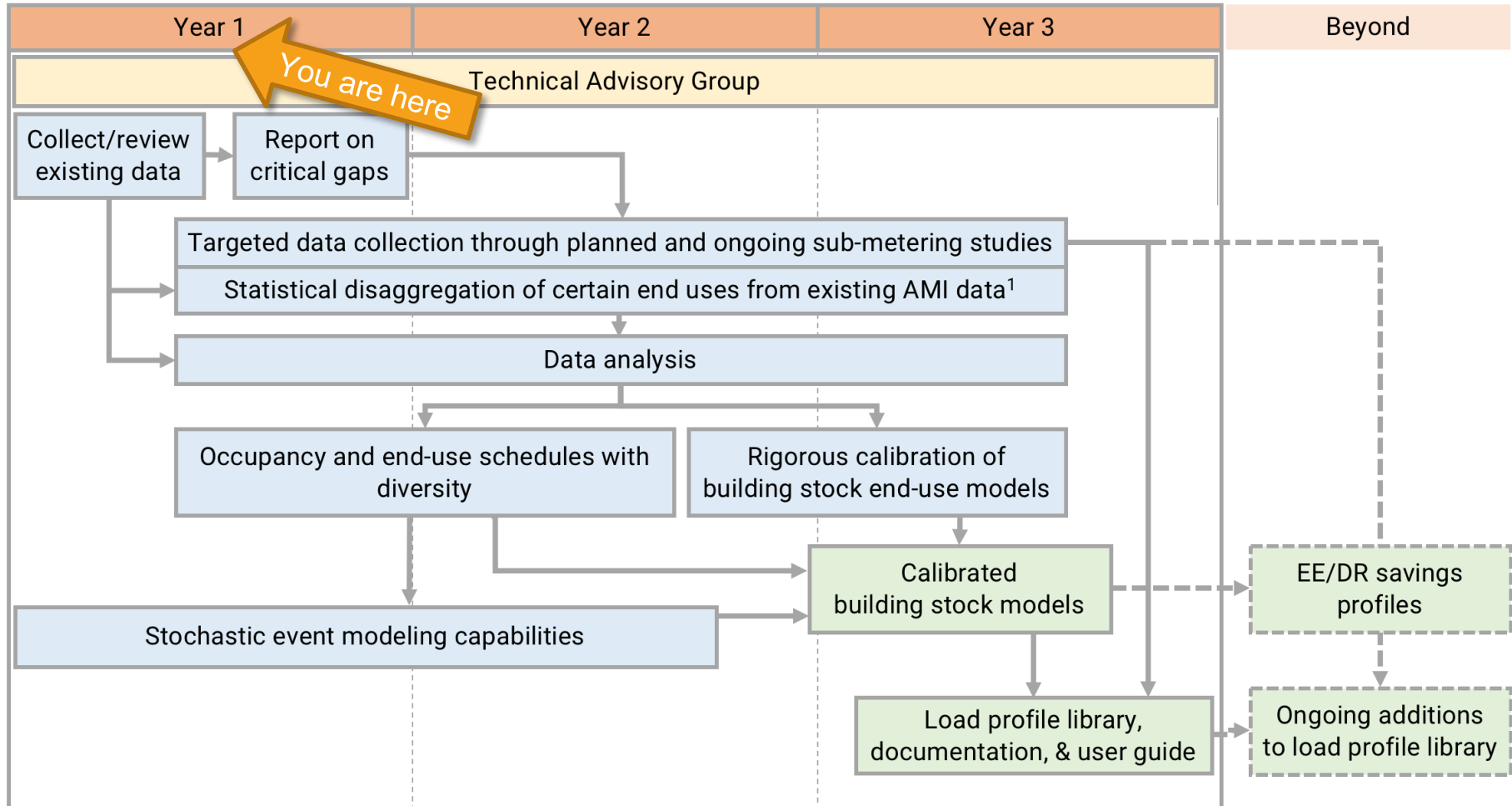
“Phone attendance was nearly seamless and worked really well. Nice work. Good collaboration in breakouts.”

“Break out groups were great. Good discussion and facilitation. The lead in presentations were good too.”

“...the conversations were ultimately very thought provoking.”

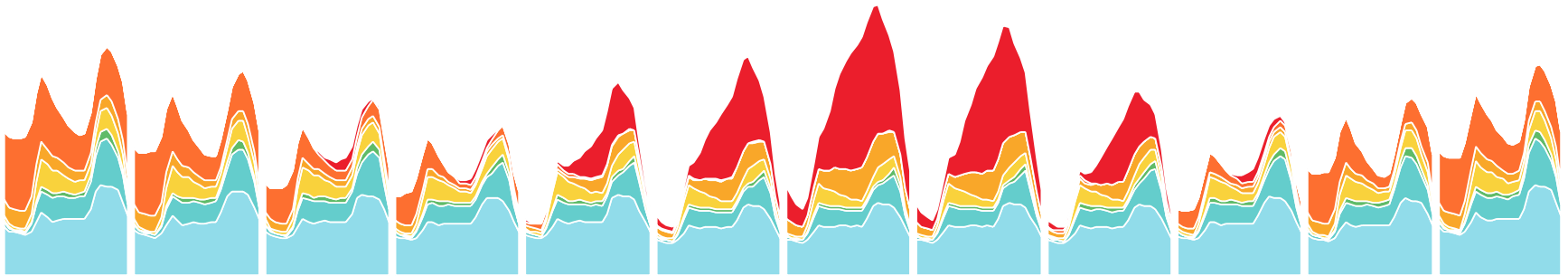
Remaining Project Work

- Immediate next steps:**
- Report on use cases and critical data gaps
 - Continue identifying and pursuing data sources
 - Continue developing stochastic occupancy modeling



¹ For example, conditional demand analysis, or inverse (changepoint/degree day) models (KEMA 2009)

Thank You



Performing Organizations:

**National Renewable Energy Laboratory (NREL)
Lawrence Berkeley National Laboratory
Argonne National Laboratory**

Principal Investigator:

**Eric Wilson, Senior Research Engineer, NREL
303.275.4676 | eric.wilson@nrel.gov**

REFERENCE SLIDES

Project Budget

Project Budget: \$3,000,000 per year for three years, across three national labs

Variances: None

Cost to Date: *Costing through March 16

Labs: \$290,400* (NREL), \$131,500* (LBNL), \$7,653 (ANL)

Partners: \$0 (NEEP), \$0 (EPRI)

Additional Funding:

EPRI's utility partners: \$150,000

NYSERDA: \$250,000 (funding NEEP activities)

MassCEC: \$500,000 (funding NEEP activities)

ComEd: \$30,000

Various in-kind contributions for participation in advisory group

Budget History

| 10/1/2018 – FY 2019 (current) | | FY 2020 (planned) | | FY 2021 – 9/30/2021 (planned) | |
|----------------------------------|------------|-------------------|------------|----------------------------------|------------|
| DOE | Cost-share | DOE | Cost-share | DOE | Cost-share |
| \$3,000,000 | \$435,000 | \$3,000,000 | \$280,000 | \$3,000,000 | \$285,000 |

Project Plan and Schedule

| Project Schedule | | | | | | | | | | | | |
|---|--------------|--|--------------|--------------|--------------|--------------|--------------|--------------|--------------|--------------|--------------|--------------|
| Project Start: 10/1/2018 | | Completed Work | | | | | | | | | | |
| Projected End: 9/30/2021 | | Active Task (in progress work) | | | | | | | | | | |
| | ◆ | Milestone/Deliverable (Originally Planned) | | | | | | | | | | |
| | ◆ | Milestone/Deliverable (Actual) | | | | | | | | | | |
| | FY2019 | | | | FY2020 | | | | FY2021 | | | |
| Task | Q1 (Oct-Dec) | Q2 (Jan-Mar) | Q3 (Apr-Jun) | Q4 (Jul-Sep) | Q1 (Oct-Dec) | Q2 (Jan-Mar) | Q3 (Apr-Jun) | Q4 (Jul-Sep) | Q1 (Oct-Dec) | Q2 (Jan-Mar) | Q3 (Apr-Jun) | Q4 (Jul-Sep) |
| Past Work | | | | | | | | | | | | |
| NREL Milestone: TAG established | ◆ | | | | | | | | | | | |
| Current/Future Work | | | | | | | | | | | | |
| NREL Milestone: Data requirements understood | | | ◆ | | | | | | | | | |
| NREL Milestone: Data gaps report | | | | ◆ | | | | | | | | |
| LBNL Milestone: Data gaps report | | | | ◆ | | | | | | | | |
| NREL Milestone: Data gaps decision (Go/No-Go) | | | | ◆ | | | | | | | | |
| LBNL Milestone: Data gaps decision (Go/No-Go) | | | | ◆ | | | | | | | | |
| ANL Milestone: Data gaps decision (Go/No-Go) | | | | ◆ | | | | | | | | |
| LBNL Milestone: Commercial stochastic loads | | | | | ◆ | | | | | | | |
| NREL Milestone: Commercial stochastic loads | | | | | ◆ | | | | | | | |
| NREL Milestone: Residential stochastic loads | | | | | | ◆ | | | | | | |
| NREL Milestone:* Complete uncalibrated model | | | | | | | | ◆ | | | | |
| ANL Milestone:* Characterize uncertainty | | | | | | | | | | | ◆ | |
| NREL Milestone:* Complete calibrated model | | | | | | | | | | | ◆ | |
| NREL Milestone:* Publish end-use load profile dataset | | | | | | | | | | | | ◆ |
| LBNL Milestone:* Publish documentation and user guide | | | | | | | | | | | | ◆ |

*Anticipated future year milestone