Energy Loadshape Classifier

In order to tackle climate change, we need to massively scale decarbonization projects in the built environment. 40% of emissions can be traced back to buildings, most of these emissions are attributable to the energy required to power and heat buildings. While it will take up to \$100 trillion to decarbonize buildings, we can maximize our scarce resources by identifying the decarbonization potential of different types of buildings. By prioritizing the most polluting buildings, we can do more good, more quickly than our current scattershot approach.

Background

We need to be able to measure the impact of potential decarbonization projects, which can be largely done directly using hourly or sub-hourly electricity and natural gas meter data. Building energy use is characterized by a "loadshape", which is the hourly energy use profile of the building. These "loadshapes" can be used to understand how energy was consumed both before and after a decarbonization project. For both targeting homes with the greatest potential, as well as forecasting the savings of a home where a project was recently installed, we want to be able to predict the impact of certain decarbonization projects. However, this prediction can be challenging, as it typically requires additional information about the building, such as the number of occupants or the type of appliances that were in the building before the project happened. When attempting to implement projects at a massive scale, it can be difficult to acquire this "building metadata". We want to be able to estimate some of these metadata fields based solely on the building's loadshape.

Challenge

Imagine you are a Sustainability Officer from an organization with a large portfolio of buildings. You need to target the buildings with the greatest potential for decarbonization, but you only have access to their energy loadshapes. Using the AI tools and machine learning algorithms you find most pertinent, devise a way to estimate the impact of various decarbonization projects on your building.

The NREL dataset (discussed below) includes models of building loadshapes as well as the impact of certain decarbonization upgrades on those buildings. By matching your building's loadshape to those in the NREL dataset, you have the potential to estimate the impacts of projects and target which buildings in your portfolio would most help you achieve your carbon goals.

We would like you to answer a few key questions/tasks:

- How might this information be helpful in scaling up building decarbonization?
- How can you target which buildings have the greatest potential for impact?
- Given the NREL dataset, quantify the potential impact of a given decarbonization project for your buildings.

Ground Truth Dataset

NREL has recently created a massive, multi-terabyte dataset where they generated year-long modeled loadshapes of individual residential (ResStock) buildings across the US. Each of these loadshapes has a unique set of metadata to describe the conditions of the building that were used to produce the loadshape. For example, they may have one loadshape for a single family home in Cambridge, MA that has natural gas heating, insulated walls, with 2 bedrooms, 2 bathrooms, and 4 occupants. They may have another loadshape with similar characteristics, but with only electric heating. This dataset is to be used as the primary training set for the classifier.

Some detailed context for when you are exploring the ResStock data: we will be focusing specifically on the residential dataset of NREL with models that were build using 2018 weather data, which was released in 2022 and named release 1.1.

A set of files containing building metadata can be found here (in CSV or parquet format, one row per building) and the loadshape data files can be found here (parquet files, organized by state, one file per building, in 15-minute intervals). The files are broken down by "upgrade". upgrade=0 references the baseline data (information about the building before any decarbonization project took place) while upgrades 1-10 reference difference decarbonization projects that happened. See the appendix below for the meaning of upgrades 1-10.

The loadshape data contains several columns of disaggregated load, but for the purposes of this challenge you can focus on the "total" energy consumption, which is represented by the following: **out.electricity.total.energy_consumption**,

out.natural_gas.total.energy_consumption. Furthermore, there are two additional columns (with the same name but suffixed with *_intensity*) which are that buildings loadshape divided by its square footage.

Classifier Inputs

For each building, assume that you have the following:

- An 8760 hourly gas loadshape
- An 8760 hourly electricity loadshape
- Location about the information of the building including:
 - o In.building america climate zone
 - in.county
 - o in.state
 - in.weather_file_city
- Some additional basic information about the building:
 - in.geometry_building_type_recs

Hints

There are many metadata columns available in the NREL dataset to use for classifying, but here are some that we believe may be important:

- in.heating_fuel
- in.water heater fuel
- in.electric_vehicle

- in.pv system size
- in.hvac_cooling_type
- In.hvac_heating_type_and_fuel

The best matches should bias towards those with the closest shapes to the input, even if the overall scale is a bit off. Consider normalizing the time series data to % of annual consumption.

In addition to the NREL dataset, feel free to use other datasets for out-of-sample validation. Here are a few sources, but also feel free to find your own:

- <u>UMass Trace Repository</u>
- EEMeter Sample Data

Feel free to limit to only a specific state (like MA or CA) in order to limit your initial data processing requirements.

Desired Output

For a given building loadshape, the system should provide a set of NREL model buildings (based on the NREL building id) that most closely match that loadshape. These buildings must be in the same <code>in.building_america_climate_zone</code> and <code>in.geometry_building_type_recs</code> as the input building. Using the selected NREL model buildings, the system should then be able to estimate the impact of a certain type of decarbonization upgrade (for example, what would be the impact of upgrade=7 on the given building?).

Appendix

```
Upgrade Number to Description Mapping
```

```
"0": "Baseline",
"1": "Basic enclosure",
"2": "Enhanced enclosure",
"3": "Heat pumps, min-efficiency, electric backup",
"4": "Heat pumps, high-efficiency, electric backup",
"5": "Heat pumps, min-efficiency, existing heating as backup",
"6": "Heat pump water heaters",
"7": "Whole-home electrification, min efficiency",
"8": "Whole-home electrification, high efficiency",
"9": "Whole-home electrification, high efficiency + basic enclosure package (packages 1 & 8)",
"10": "Whole-home electrification, high efficiency + enhanced enclosure package (packages 2 & 8)"
}
```

Example of one row of loadshape data

```
{'timestamp': Timestamp('2018-01-01 00:15:00'),
'out.electricity.ceiling_fan.energy_consumption': 0.008,
'out electricity ceiling fan energy consumption intensity': 1.2965964343598055e-05,
'out.electricity.clothes dryer.energy consumption': 0.0,
'out.electricity.clothes dryer.energy_consumption_intensity': 0.0,
'out.electricity.clothes washer.energy consumption': 0.0,
'out.electricity.clothes washer.energy consumption intensity': 0.0,
'out.electricity.cooling fans pumps.energy consumption': 0.0,
'out.electricity.cooling fans pumps.energy consumption intensity': 0.0,
'out.electricity.cooling.energy consumption': 0.0,
'out.electricity.cooling.energy_consumption_intensity': 0.0,
'out.electricity.dishwasher.energy_consumption': 0.0,
'out.electricity.dishwasher.energy consumption intensity': 0.0,
'out.electricity.freezer.energy_consumption': 0.0,
'out.electricity.freezer.energy consumption intensity': 0.0,
'out.electricity.heating fans pumps.energy consumption': 0.001,
'out.electricity.heating_fans_pumps.energy_consumption_intensity': 1.620745542949757e-06,
'out.electricity.heating hp bkup.energy consumption': 0.0,
'out.electricity.heating_hp_bkup.energy_consumption_intensity': 0.0,
'out.electricity.heating.energy_consumption': 0.03,
'out.electricity.heating.energy consumption intensity': 4.8622366288492704e-05,
'out.electricity.hot_tub_heater.energy_consumption': 0.0,
'out.electricity.hot tub heater.energy consumption intensity': 0.0,
'out.electricity.hot tub pump.energy consumption': 0.0,
'out.electricity.hot tub pump.energy consumption intensity': 0.0,
'out.electricity.hot_water.energy_consumption': 0.0,
'out.electricity.hot water.energy consumption intensity': 0.0,
'out.electricity.lighting_exterior.energy_consumption': 0.001,
'out.electricity.lighting exterior.energy consumption intensity': 1.620745542949757e-06,
'out.electricity.lighting_garage.energy_consumption': 0.0,
'out.electricity.lighting garage.energy consumption intensity': 0.0,
'out.electricity.lighting_interior.energy_consumption': 0.015,
'out electricity lighting interior energy consumption intensity': 2.4311183144246352e-05,
'out.electricity.mech_vent.energy_consumption': 0.0,
'out.electricity.mech_vent.energy_consumption_intensity': 0.0,
'out.electricity.plug_loads.energy_consumption': 0.101,
'out.electricity.plug loads.energy consumption intensity': 0.00016369529983792545,
'out.electricity.pool heater.energy consumption': 0.0,
'out.electricity.pool heater.energy consumption intensity': 0.0,
'out.electricity.pool_pump.energy_consumption': 0.0,
'out.electricity.pool pump.energy consumption intensity': 0.0,
'out.electricity.pv.energy_consumption': 0.0,
'out.electricity.pv.energy consumption intensity': 0.0,
```

```
'out.electricity.range oven.energy consumption': 0.0,
'out.electricity.range_oven.energy_consumption_intensity': 0.0,
'out.electricity.refrigerator.energy consumption': 0.011,
'out.electricity.refrigerator.energy consumption intensity': 1.7828200972447325e-05,
'out.electricity.well_pump.energy_consumption': 0.0,
'out.electricity.well pump.energy consumption intensity': 0.0,
'out.fuel oil.heating hp bkup.energy consumption': 0.0,
'out.fuel oil.heating hp bkup.energy consumption intensity': 0.0,
'out.fuel_oil.heating.energy_consumption': 0.0,
'out.fuel oil.heating.energy consumption intensity': 0.0,
'out.fuel oil.hot water.energy consumption': 0.0,
'out.fuel oil.hot water.energy consumption intensity': 0.0,
'out.natural gas.clothes dryer.energy consumption': 0.0,
'out.natural_gas.clothes_dryer.energy_consumption_intensity': 0.0,
'out.natural gas.fireplace.energy consumption': 0.0,
'out.natural_gas.fireplace.energy_consumption_intensity': 0.0,
'out.natural_gas.grill.energy_consumption': 0.0,
'out.natural gas.grill.energy consumption intensity': 0.0,
'out.natural_gas.heating_hp_bkup.energy_consumption': 0.0,
'out.natural gas.heating hp bkup.energy consumption intensity': 0.0,
'out.natural gas.heating.energy consumption': 0.0,
'out.natural_gas.heating.energy_consumption_intensity': 0.0,
'out.natural gas.hot tub heater.energy consumption': 0.0,
'out.natural gas.hot tub heater.energy consumption intensity': 0.0,
'out.natural_gas.hot_water.energy_consumption': 0.0,
'out.natural gas.hot water.energy consumption intensity': 0.0,
'out.natural_gas.lighting.energy_consumption': 0.0,
'out.natural gas.lighting.energy consumption intensity': 0.0,
'out.natural_gas.pool_heater.energy_consumption': 0.0,
'out.natural_gas.pool_heater.energy_consumption_intensity': 0.0,
'out.natural_gas.range_oven.energy_consumption': 0.0,
'out.natural gas.range oven.energy consumption intensity': 0.0,
'out.propane.clothes_dryer.energy_consumption': 0.0,
'out.propane.clothes dryer.energy consumption intensity': 0.0,
'out.propane.heating_hp_bkup.energy_consumption': 0.0,
'out.propane.heating hp bkup.energy consumption intensity': 0.0,
'out.propane.heating.energy_consumption': 0.0,
'out.propane.heating.energy consumption intensity': 0.0,
'out.propane.hot_water.energy_consumption': 0.0,
'out.propane.hot water.energy consumption intensity': 0.0,
'out.propane.range oven.energy consumption': 0.0,
'out.propane.range_oven.energy_consumption_intensity': 0.0,
'out.site energy.net.energy consumption': 0.16822279417999997,
'out.site_energy.net.energy_consumption_intensity': 0.00027264634388978924,
```

```
'out.site energy.total.energy consumption': 0.16822279417999997,
'out.site_energy.total.energy_consumption_intensity': 0.00027264634388978924,
'out.electricity.net.energy consumption': 0.168,
'out.electricity.net.energy consumption intensity': 0.0002722852512155592,
'out.electricity.total.energy consumption': 0.168,
'out.electricity.total.energy consumption intensity': 0.0002722852512155592,
'out.fuel oil.total.energy consumption': 0.0,
'out.fuel oil.total.energy consumption intensity': 0.0,
'out.natural gas.total.energy consumption': 0.0,
'out.natural gas.total.energy consumption intensity': 0.0,
'out.propane.total.energy consumption': 0.0,
'out.propane.total.energy_consumption_intensity': 0.0,
'out.load.cooling.energy delivered.kbtu': 0.0,
'out.load.heating.energy_delivered.kbtu': 0.106,
'out.load.hot water.energy delivered.kbtu': 0.0,
'out.outdoor_air_dryblub_temp.c': 8.425,
'out.zone mean air temp.air source heat pump airloop ret air zone.c': 0.0,
'out.zone mean air temp.attic vented.c': 0.0,
'out.zone_mean_air_temp.basement_unconditioned.c': 0.0,
'out.zone mean air temp.central ac airloop ret air zone.c': 0.0,
'out.zone mean air temp.central ac and furnace airloop ret air zone.c': 0.0,
'out.zone_mean_air_temp.crawlspace_unvented.c': 0.0,
'out.zone mean air temp.crawlspace vented.c': 0.0,
'out.zone mean air temp.furnace airloop ret air zone.c': 23.3739714605263,
'out.zone_mean_air_temp.garage.c': 0.0,
'out.zone mean air temp.living space.c': 23.05555490043732,
'out.zone_mean_air_temp.mini_split_heat_pump_airloop_ret_air_zone.c': 0.0,
'out.total.lrmer 95decarbby2035 15 2025start.co2e kg': 0.0350264028114,
'out.total.lrmer_lowrecost_15_2025start.co2e_kg': 0.0331938896366,
'out.total.lrmer_lowrecost_25_2025start.co2e_kg': 0.025913732098100002,
'out.total.lrmer midcase 15 2025start.co2e kg': 0.0397029401461}
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Example of one row of metadata

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{'bldg_id': '7',
    'applicability': 'True',
    'in.sqft': '617.0',
    'weight': '242.13101272727272',
    'in.ahs_region': 'Non-CBSA Pacific',
    'in.ashrae_iecc_climate_zone_2004': '3B',
    'in.ashrae_iecc_climate_zone_2004_2_a_split': '3B',
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'in.bathroom spot vent hour': 'Hour3',
'in.bedrooms': '1',
'in.building america climate zone': 'Hot-Dry',
'in.cec climate zone': '10',
'in.ceiling fan': 'Standard Efficiency',
'in.census division': 'Pacific',
'in.census division recs': 'Pacific',
'in.census region': 'West',
'in.city': 'In another census Place',
'in.clothes dryer': nan,
'in.clothes washer': nan,
'in.clothes washer presence': nan,
'in.cooking_range': 'Electric, 120% Usage',
'in.cooling_setpoint': '70F',
'in.cooling setpoint has offset': 'No',
'in.cooling setpoint offset magnitude': '0F',
'in.cooling_setpoint_offset_period': nan,
'in.corridor': 'Double-Loaded Interior',
'in.county': 'G0600730',
'in.county and puma': 'G0600730, G06007307',
'in.dehumidifier': nan,
'in.dishwasher': nan,
'in.door area': '20 ft^2',
'in.doors': 'Fiberglass',
'in.ducts': '10% Leakage, R-4',
'in.eaves': '2 ft',
'in.electric vehicle': nan,
'in.emissions electricity folders':
'data/cambium/LRMER MidCase 15 2025start,data/cambium/LRMER LowRECost 15 2025st
art,data/cambium/LRMER_95DecarbBy2035_15_2025start,data/cambium/LRMER_LowRECost
25 2025start',
'in.emissions electricity units': 'kg/MWh,kg/MWh,kg/MWh,kg/MWh',
'in.emissions_electricity_values_or_filepaths':
/lib/resources/data/cambium/LRMER MidCase 15 2025start/CAMXc.csv,/lib/resources/data/ca
mbium/LRMER_LowRECost_15_2025start/CAMXc.csv,/lib/resources/data/cambium/LRMER_9
5DecarbBy2035 15 2025start/CAMXc.csv,/lib/resources/data/cambium/LRMER LowRECost 2
5 2025start/CAMXc.csv',
'in.emissions fossil fuel units': 'lb/MBtu,lb/MBtu,lb/MBtu,lb/MBtu',
'in.emissions fuel_oil_values': '195.9,195.9,195.9,195.9',
'in.emissions_natural_gas_values': '147.3,147.3,147.3,147.3',
'in.emissions propane values': '177.8,177.8,177.8,177.8',
'in.emissions scenario names':
'LRMER MidCase 15 2025start,LRMER LowRECost 15 2025start,LRMER 95DecarbBy203
5 15 2025start, LRMER LowRECost 25 2025start',
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'in.emissions types': 'CO2e,CO2e,CO2e,CO2e',
'in.emissions_wood_values': '200.0,200.0,200.0,200.0',
'in.federal poverty level': '400%+',
'in.generation and emissions assessment region': 'CAMXc',
'in.geometry attic type': nan,
'in.geometry building horizontal location mf': 'Right',
'in.geometry building horizontal location sfa': nan,
'in.geometry building level mf': 'Bottom',
'in.geometry building number units mf': '16',
'in.geometry building number units sfa': nan,
'in.geometry building type acs': '10 to 19 Unit',
'in.geometry building type height': 'Multifamily with 5+ units, 1-3 stories',
'in.geometry building type recs': 'Multi-Family with 5+ Units',
'in.geometry floor area': '500-749',
'in.geometry floor area bin': '0-1499',
'in.geometry_foundation_type': 'Slab',
'in.geometry garage': nan,
'in.geometry stories': '3',
'in.geometry stories low rise': '3',
'in.geometry story bin': '<8',
'in.geometry wall exterior finish': 'Stucco, Light',
'in.geometry_wall_type': 'Wood Frame',
'in.has pv': 'No',
'in.heating fuel': 'Electricity',
'in.heating setpoint': '80F',
'in.heating setpoint has offset': 'Yes',
'in.heating_setpoint_offset_magnitude': '3F',
'in.heating setpoint offset period': 'Night -2h',
'in.holiday lighting': 'No Exterior Use',
'in.hot_water_distribution': 'Uninsulated',
'in.hot water fixtures': '200% Usage',
'in.hvac cooling efficiency': 'Room AC, EER 12.0',
'in.hvac_cooling_partial_space_conditioning': '100% Conditioned',
'in.hvac cooling type': 'Room AC',
'in.hvac has ducts': 'Yes',
'in.hvac has shared system': nan,
'in.hvac has zonal electric heating': 'No',
'in.hvac heating efficiency': 'Electric Furnace, 100% AFUE',
'in.hvac_heating_type': 'Ducted Heating',
'in.hvac heating type and fuel': 'Electricity Electric Furnace',
'in.hvac secondary heating efficiency': nan,
'in.hvac_secondary_heating_type_and_fuel': nan,
'in.hvac shared efficiencies': nan,
'in.hvac system is faulted': 'No',
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'in.hvac system single speed ac airflow': nan,
'in.hvac_system_single_speed_ac_charge': nan,
'in.hvac system single speed ashp airflow': nan,
'in.hvac system single speed ashp charge': nan,
'in.income': '80000-99999',
'in.income recs 2015': '80000-99999',
'in.income recs 2020': '60000-99999',
'in.infiltration': '10 ACH50',
'in.insulation ceiling': nan,
'in.insulation floor': nan,
'in.insulation foundation wall': nan,
'in.insulation rim joist': nan,
'in.insulation roof': 'Finished, R-38',
'in.insulation slab': 'Uninsulated',
'in.insulation wall': 'Wood Stud, Uninsulated',
'in.interior_shading': 'Summer = 0.7, Winter = 0.85',
'in.iso rto region': 'CAISO',
'in.lighting': '100% LED',
'in.lighting interior use': '100% Usage',
'in.lighting other use': '100% Usage',
'in.location region': 'CR11',
'in.mechanical_ventilation': nan,
'in.misc extra refrigerator': nan,
'in.misc freezer': nan,
'in.misc_gas_fireplace': nan,
'in.misc gas grill': nan,
'in.misc_gas_lighting': nan,
'in.misc hot tub spa': nan,
'in.misc pool': nan,
'in.misc_pool_heater': nan,
'in.misc pool pump': nan,
'in.misc well pump': nan,
'in.natural ventilation': 'Cooling Season, 7 days/wk',
'in.neighbors': '12',
'in.occupants': '1',
'in.orientation': 'Northwest',
'in.overhangs': nan,
'in.plug load diversity': '200%',
'in.plug loads': '93%',
'in.puma': 'G06007307',
'in.puma metro status': 'In metro area, not/partially in principal city',
'in.pv orientation': nan,
'in.pv system size': nan,
'in.radiant_barrier': nan,
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'in.range spot vent hour': 'Hour16',
'in.reeds_balancing_area': '11',
'in.refrigerator': 'EF 17.6, 100% Usage',
'in.roof material': 'Asphalt Shingles, Medium',
'in.schedules': 'Stochastic',
'in.simulation control run period begin day of month': '1.0',
'in.simulation control run period begin month': '1.0',
'in.simulation control run period calendar year': '2018.0',
'in.simulation control run period end day of month': '31.0',
'in.simulation control run period end month': '12.0',
'in.simulation control timestep': '15.0',
'in.solar hot water': nan,
'in.state': 'CA',
'in.tenure': 'Renter',
'in.units represented': '1.0',
'in.usage level': 'High',
'in.vacancy_status': 'Occupied',
'in.vintage': '1960s',
'in.vintage acs': '1960-79',
'in.water heater efficiency': 'Electric Standard',
'in.water heater fuel': 'Electricity',
'in.water_heater_in_unit': 'Yes',
'in.weather file city': 'Miramar Mcas',
'in.weather file latitude': '32.87',
'in.weather_file_longitude': '-117.15',
'in.window areas': 'F12 B12 L12 R12',
'in.windows': 'Double, Clear, Metal, Air',
'out.params.door area ft 2': '0.0',
'out.params.duct unconditioned surface area ft 2': '0.0',
'out.params.floor_area_attic_ft_2': '0.0',
'out.params.floor area attic insulation increase ft 2 delta r value': '0.0',
'out.params.floor area conditioned infiltration reduction ft 2 delta ach 50': '0.0',
'out.params.floor area foundation ft 2': '617.0',
'out params floor area lighting ft 2': '617.0',
'out.params.flow rate mechanical ventilation cfm': '0.0',
'out.params.rim joist area above grade exterior ft 2': '0.0',
'out.params.roof_area_ft_2': '0.0',
'out.params.size cooling system primary k btu h': '6.54',
'out.params.size_heat_pump_backup_primary_k_btu_h': '0.0',
'out.params.size heating system primary k btu h': '8.74',
'out.params.size heating system secondary k btu h': '0.0',
'out.params.size water heater gal': '30.0',
'out.params.slab perimeter exposed conditioned ft': '51.8',
'out.params.wall area above grade conditioned ft 2': '414.7',
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'out.params.wall area above grade exterior ft 2': '414.7',
'out.params.wall_area_below_grade_ft_2': '0.0',
'out.params.window_area_ft_2': '49.8',
'out.electricity.total.lrmer 95 decarb by 2035 15 2025 start.co2e kg': '1296.39965211064',
'out.fuel_oil.total.lrmer_95_decarb_by_2035_15_2025_start.co2e_kg': '0.0',
out.natural gas.total.lrmer 95 decarb by 2035 15 2025 start.co2e kg': '0.0',
'out.propane.total.lrmer 95 decarb by 2035 15 2025 start.co2e kg': '0.0',
'out.electricity.total.lrmer low re cost 15 2025 start.co2e kg': '720.63671317484',
'out.fuel oil.total.lrmer low re cost 15 2025 start.co2e kg': '0.0',
'out.natural gas.total.lrmer low re cost 15 2025 start.co2e kg': '0.0',
'out.propane.total.lrmer low re cost 15 2025 start.co2e kg': '0.0',
'out.electricity.total.lrmer low re cost 25 2025 start.co2e kg': '600.32859451026',
'out.fuel oil.total.lrmer low re cost 25 2025 start.co2e kg': '0.0',
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'out.propane.total.lrmer low re cost 25 2025 start.co2e kg': '0.0',
'out.electricity.total.lrmer_mid_case_15_2025_start.co2e_kg': '1256.98927904319',
'out.fuel_oil.total.lrmer_mid_case_15_2025_start.co2e_kg': '0.0',
'out.natural gas.total.lrmer mid case 15 2025 start.co2e kg': '0.0',
'out.propane.total.lrmer mid case 15 2025 start.co2e kg': '0.0',
'out.electricity.ceiling fan.energy consumption': '109.02243804000001',
'out.electricity.ceiling fan.energy consumption intensity': '0.17669763053484605',
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'out.electricity.clothes_washer.energy_consumption_intensity': '0.0',
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'out.electricity.cooling fans pumps.energy consumption intensity': '0.0',
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