

Indoor Environmental Quality Management Ontology

Gabriel Jacoby-Cooper, Jihoon Chung and Kelsey Rook

Abstract

This project aims to develop an ontology that recommends a viable solution to improve indoor environmental quality (IEQ) for occupants and reduce energy use in a room. Buildings consume one-third of the world's energy and are some of the major energy consumers on the planet. In commercial and residential buildings, 46.2% of the energy is consumed for heating, cooling, ventilation, and lighting. Occupants use this energy for enhancing IEQ which is affected by many factors including temperature, humidity, airflow, air quality, etc.; however, each building is under different environmental conditions, such as weather, outdoor air quality, direction/location of the building, etc. Additionally, every occupant has a different clothing level and metabolic rate. Potential solutions may be available; but, it is difficult to find them because of the complicated mechanism. In this project, we propose an ontology that suggests a viable solution to enhance IEQ and decrease energy use by combining several sets of knowledge: 1) indoor environmental conditions including air temperature, relative humidity, and air speed, 2) outdoor environmental conditions, such as outdoor air quality and daylight intensity, and 3) occupant profile including sex, height, weight, age, clothing level, and activity level. In future works, this ontology can be a basis to develop an industrial-scale IEQ management system by integrating 3D geometric models and thermodynamic simulations modules.

Introduction

According to reports written by the U.S. Energy Information Administration, commercial and residential buildings consumed 93% of electric energy in the end-use section in 2021[1], and 46.2% of energy use in buildings was for heating, cooling, ventilation, and lighting in 2014[2]. This energy is used for enhancing Indoor Environmental Quality (IEQ), which refers to a perceived experience of the building's indoor environment including thermal comfort, indoor air quality, acoustics, and control systems [3].

In a room, IEQ is affected by many factors: air temperature, mean radiant temperature, relative humidity, airflow, air quality, clothing, human activity, or an occupant's profile [4-5]. The problem is that different buildings are under different environmental conditions including weather, outdoor air quality, direction and location of the building, etc., and each occupant has different clothing and occupant profiles, which address their personal environmental preferences. Furthermore, potential solutions — air conditioners, electric heaters, window blinds, windows, doors, fans, etc. — have an influence on IEQ in different ways. For instance, an air conditioner and a fan both cool temperature down (at least

in the right external conditions, which can be broadly considered in the knowledge base and the ontology by integrating weather API data); however, the fan doesn't affect humidity, unlike the air conditioner.

In this project, we aim to develop an ontology that finds a viable solution to improve IEQ for occupants while minimizing energy use in a room by combining several sets of knowledge: 1) indoor environmental condition including air temperature, relative humidity, air speed, 2) outdoor environmental condition, such as outdoor air quality and daylight intensity, and 3) occupant profile including sex, height, weight, age, clothing level, and activity level

A user will inform the IEQ management system of what quantifiable IEQ factors—thermal comfort and air quality—are currently causing them discomfort and to what degree, and the system will suggest the method for bringing those factors into an acceptable range.

Alternatively, to quantify IEQ, the application can use the Predicted Mean Vote (PMV) model and Air Quality Index (AQI) established by the US EPA. For the calculation, the PMV index requires air temperature, mean radiant temperature, air speed, relative humidity, clothing level, and metabolic rate [6-7]; the metabolic rate requires activity intensity, age, sex, height, and weight [8]; the AQI requires concentration of ozone (O₃), particulate matter (PM), carbon monoxide (CO), sulfur dioxide (SO₂), and nitrogen dioxide (NO₂) [9]. The user can manually enter their desired temperature and humidity ranges, or the system can infer them through the PMV model based on sensor data as well as other information that the user provides, including clothing descriptions.

As solutions to improve IEQ, several types of equipment affect thermal comfort in different ways: 1) fan increases air speed, 2) electric heater and space heater increase air temperature, 3) dehumidifier decreases humidity, 4) air conditioner decreases air temperature, and 5) window blinds decrease air temperature. Following section will describe how the ontology can be used to improve IEQ and to find a viable solution.

Use Case

The goal of this ontology is to provide suggestions to improve IEQ in a room based on indoor and outdoor environments and occupant profiles. The scope of this use

case is limited to a small room that one to three people can use. The target population of this application is individuals who regularly occupy the room. This use case is designed for users (specifically occupants of the building) or facility managers, and the language must be understandable to laypeople. If room occupants input their demographic information, the system is able to suggest a solution about what room components they should manipulate to increase/decrease IEQ parameters. If non-power-consuming components are available, it gives priority to them rather than power-consuming components to minimize energy consumption. This system cannot automatically manipulate opening/closing windows, HVAC systems, electric heaters, etc. In addition, this system doesn't include 3D geometries, fluid dynamics, and thermodynamic simulations to understand different effects depending on the locations of the room components. Therefore, it is unable to apply to large spaces where comfort factors, such as temperature and humidity, are different depending on the location of occupant seats.

To specify the scope of our ontology and essential functionality, we focused on several usage scenarios involving indoor and outdoor environmental conditions and occupants' demographic information. Based on their requirements extracted from these scenarios, we further developed the key concepts and relations necessary in our ontology.

Further detailed information about the use case can be found in our [use case document](#).

Technical Approach

We aim to create a system that, given a small room containing specified environment-affecting components as well as the demographic information for up to several occupants, will suggest an action to take that will increase the overall comfort of the occupants. Our ontology supports this reasoning by connecting a room and its components, occupants, and environment.

Ontology Overview

Figure 1 shows how the most important high-level resources are connected in our ontology. Central to our project is a *Room*, which has *Room Components*—objects in the room that have some effect on the room's environment—and one or more *Occupants*, which have various characteristics from which we may calculate a comfort range. *Room components* are either *Power Consuming* or *Non-Power Consuming*, with priority given to actions that use *Non-Power Consuming Components* during action recommendation. Each Room Component has multiple possible *Component States* and *Component*

Actions; each action produces a new *component state*, as well as a different *Environment*. Additionally, each *Room* has one or more associated environments, including *Indoor Environments*, which refer to the *Current Indoor Environment* and some set of possible indoor environments, and *Delta-Defined Environments*, which are *Environments* defined by their difference from some other *Environment*. The *Current Indoor Environment* is defined in absolutes, while *Resultant Indoor Environments* are also *Delta-Defined Environments*. One *Ideal Environment* should exist, representing some environment that satisfies the comfort needs of the occupants as closely and possible. An *Outdoor Environment* is some environment associated with an *Indoor Environment* such that there is some influence on the *Indoor Environment* that can be exerted by opening a *Window*. (A future expansion might extend the modeling of indoor-outdoor influence to air conditioners or other relevant room components.) This *Outdoor Environment* is expressed as the difference from the *Current Indoor Environment*, as its effect on the *Indoor Environment* is dependent on whether it has a negative or positive difference from the *Indoor Environment's* attributes.

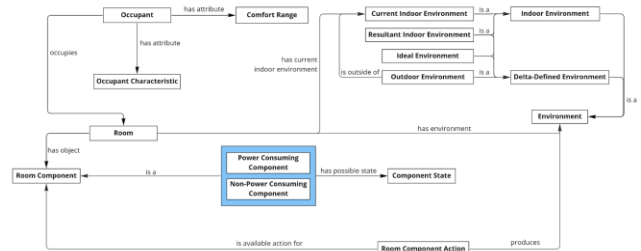


Figure 1: Ontology Overview Diagram

Room Component

Figure 2 shows, in more detail, what *Room Components* are considered in our system as well as their possible states. Each *Room Component Action* is associated with a particular *Room Component*, causes the component to have a new *Component State*, and produces a new *Environment*—specifically a *Resultant Environment*, defined in terms of the change the *Room Component Action* produces.

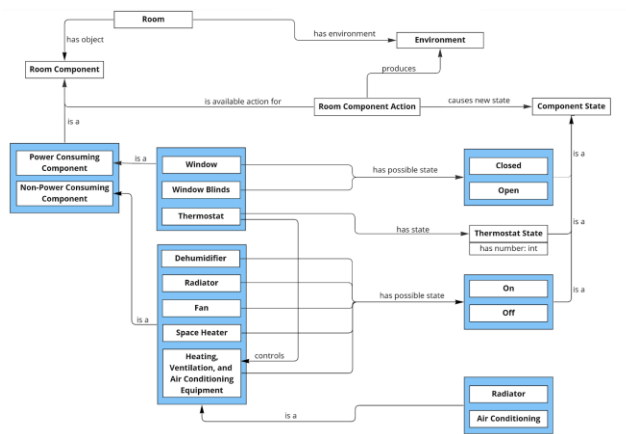


Figure 2: Room Component Diagram

Environment

Figure 3 reiterates the various subclasses of *Environment* created in our ontology, as well as a clarification of the attributes each type of *Environment* should have. The *Current Indoor Environment* is defined in absolute terms of air speed, relative humidity, and air temperature. The *Outdoor Environment* associated with an *Indoor Environment* has its air speed, humidity, and temperature defined in relative terms, but also has two absolute attributes, air quality and daylight intensity, which are so defined because of the assumption that the default *Indoor Environment* air quality is Good, and lack of daylight will never affect air speed and humidity, or decrease indoor temperature. The remainder of *Outdoor Environment* attributes, as well as *Resultant* and *Ideal Indoor Environment* attributes, are, for the scope of this project, described in general terms as having a *Positive* or *Negative* difference from the *Current Indoor Environment*.

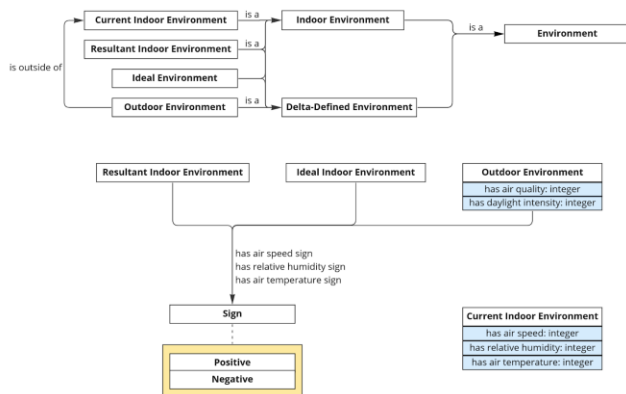


Figure 3: Environment Diagram

Outdoor Air Quality

Figure 4 shows how our ontology models the relationship between outdoor and indoor air quality, which is a special case: while turning some component on and off will be one-to-one with an increase or decrease in some environment attribute, actions that allow an *Outdoor Environment* to start or stop affecting the *Current Indoor Environment* depend on the status of the *Outdoor Environment* to determine what the *Resultant Indoor Environment* will be. To infer such a result, we use a specific *Outdoor Affected Action*, which takes into account some *Outdoor Environment* to produce a *Resultant Indoor Environment* with an inferred *Air Quality Level*.

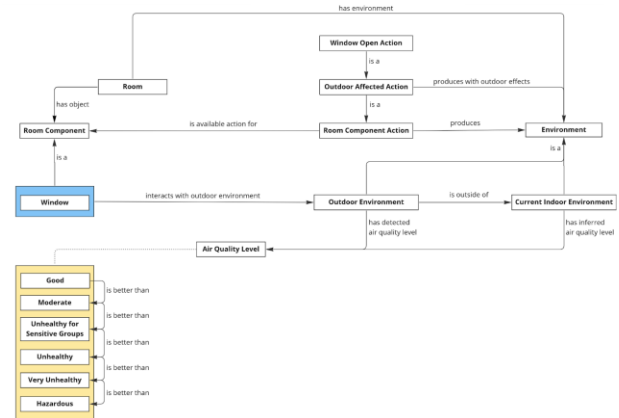


Figure 4: Air Quality Diagram

Evaluation

Competency Question 1

Question: What IEQ parameters, such as temperature, humidity, airflow, etc., make the multiple occupants feel comfortable in an office room? There are three occupants who prefer temperatures in the range of 73°F to 77°F, 74°F to 78°F, and 75° to 78°F, respectively. All other factors are already ideal. The outdoor temperature is 18°F. The current HVAC thermostat setting is 75°F, which is the current indoor temperature. An electric space heater is available but currently switched off.

With the latest additions to our main ontology, some of these queries now require nontrivial reasoning. This means that they must be executed in “Snap SPARQL Query” instead of Protégé’s built-in SPARQL query feature. Additionally, we’re still investigating a problem

with running Pellet on our ontology, so we recommend that you activate Hermit before executing a query.

```
SELECT DISTINCT ?roomComponent ?newState WHERE {
    ?roomComponent iem:isComponentOf ind:Question2Room .
    ?roomComponent iem:hasAvailableAction ?action .
    ?action iem:causesNewState ?newState .
    ?action iem:produces ?resultantEnvironment .
    ?resultantEnvironment iem:hasAirTemperatureSign ?airTemperatureSign .
    ind:Question2EnvironmentTarget iem:hasAirTemperatureSign
    ?airTemperatureSign .
}
```

This query shouldn't return any results because in the relevant competency question, the current environment is already ideal. Therefore, no actions need to be suggested or taken.

Competency Question 2

Question: What IEQ parameters, such as temperature, humidity, airflow, etc., make the multiple occupants feel comfortable in a living room during summer? The occupants' profile is a 26-year-old son typing something on his laptop (metabolic rate: 1.1, Long-sleeve coveralls, t-shirt: 0.72 clo), a 59-year-old mother dancing (metabolic rate: 3.4, Long-sleeve coveralls, t-shirt: 0.72 clo), and a 32-year-old daughter cleaning the house (metabolic rate: 2.7, Long-sleeve coveralls, t-shirt: 0.72 clo). The outdoor weather is 89°F, relative humidity is 70%, air-speed is 1.2m/s, and outdoor air quality index is 34, 'Good'. Indoor temperature is 85°F, relative humidity is 67%, and air-speed is 0.8m/s. Air-conditioner, a fan, and a dehumidifier are available.

This query looks for two different actions: one to change the air temperature and one to change the relative humidity. Each action must be available for a particular room component that's, in turn, part of the room individual that's associated with the relevant competency question. The actions are selected by ensuring that they produce respective resultant environments with the same environment attribute delta signs as the target environment.

```
SELECT DISTINCT ?airTemperatureRoomComponent ?airTemperatureNewState
?relativeHumidityRoomComponent ?relativeHumidityNewState WHERE {
    ?airTemperatureRoomComponent iem:isComponentOf
    ind:Question4Room .
    ?airTemperatureRoomComponent iem:hasAvailableAction
    ?airTemperatureAction .
    ?airTemperatureAction iem:causesNewState ?airTemperatureNewState .
    ?airTemperatureAction iem:produces
    ?airTemperatureResultantEnvironment .
    ?airTemperatureResultantEnvironment iem:hasAirTemperatureSign
    ?airTemperatureSign .
    ind:Question4EnvironmentTarget iem:hasAirTemperatureSign
    ?airTemperatureSign .

    ?relativeHumidityRoomComponent iem:isComponentOf
    ind:Question4Room .
    ?relativeHumidityRoomComponent iem:hasAvailableAction
    ?relativeHumidityAction .
    ?relativeHumidityAction iem:causesNewState ?relativeHumidityNewState .
    ?relativeHumidityAction iem:produces
    ?relativeHumidityResultantEnvironment .
    ?relativeHumidityResultantEnvironment iem:hasRelativeHumiditySign
    ?relativeHumiditySign .
    ind:Question4EnvironmentTarget iem:hasRelativeHumiditySign
    ?relativeHumiditySign .
}
```

Example result: Turned on the fan and dehumidifier

Competency Question 3

Question: In a small gym, three people are working out. 22-year-old male Jason walking on a treadmill lifting 45kg bars (metabolic rate: 4.0, wearing shorts & short-sleeve shirt: 0.36 clo), 44-year-old male Bob seated with heavy limb movement (metabolic rate: 2.2, wearing typical summer indoor clothing: 0.5 clo), and 52-year-old female Sarah walking on a treadmill with 3 mph (metabolic rate: 3.8, wearing a short-sleeve shirt: 0.57 clo). What IEQ parameters, such as temperature, humidity, airflow, etc., make the multiple occupants feel comfortable in a gym? Indoor temperature is 82°F, relative humidity is 38%, air-speed is 0.3m/s, and air quality index is 38, 'Good'. Outdoor temperature is 80°F, relative humidity is 34%, and air-speed is 2m/s. An air conditioner is available, and windows are closed.

This query looks for a single action to change the air speed. The action must be available for a particular room component that's, in turn, part of the room individual that's associated with the relevant competency question. The action is selected by ensuring that it produces a resultant environment with the same air speed environment attribute delta sign as the target environment. The query also requires that the resultant environment have a "good" air quality level, which is inferred by the reasoner from the fact that opening a window must produce a resultant environment with the same air quality level as the relevant outdoor environment.

```
SELECT DISTINCT ?airSpeedRoomComponent ?airSpeedNewState WHERE {
  ?airSpeedRoomComponent iem:isComponentOf ind:Question5Room .
  ?airSpeedRoomComponent iem:hasAvailableAction ?airSpeedAction .
  ?airSpeedAction iem:causesNewState ?airSpeedNewState .
  ?airSpeedAction iem:produces ?airSpeedResultantEnvironment .
  ?airSpeedResultantEnvironment iem:hasAirQualityLevel
iem:AirQualityLevelGood .
  ?airSpeedResultantEnvironment iem:hasAirSpeedSign ?airSpeedSign .
  ind:Question5EnvironmentTarget iem:hasAirSpeedSign ?airSpeedSign .
}
```

Example result: Open windows

Competency Question 4

Question: In a room, only one occupant sits on a chair. Is this occupant feel comfortable? The occupant has a preferred temperature range of 72°F to 80°F and a preferred humidity range of 28% to 40%. The room temperature is 75°F and the relative humidity is 55%.

This query corresponds with competency question 6. Given a specific room, it returns the occupants whose corresponding comfort ranges include the environment values and who therefore currently feel comfortable. Since there are no currently comfortable occupants in competency question 6, this query intentionally returns no results.

```
SELECT ?occupant WHERE {
  ?occupant iem:occupies ind:Question6Room .
  ?occupant iem:hasAirTemperatureComfortRangeLowerBound
?airTemperatureLowerBound .
  ?occupant iem:hasRelativeHumidityComfortRangeLowerBound
?relativeHumidityLowerBound .
  ?occupant iem:hasAirTemperatureComfortRangeUpperBound
?airTemperatureUpperBound .
  ?occupant iem:hasRelativeHumidityComfortRangeUpperBound
?relativeHumidityUpperBound .
  ind:Question6EnvironmentCurrent iem:hasAirTemperatureValue
?airTemperatureValue .
  ind:Question6EnvironmentCurrent iem:hasRelativeHumidityValue
?relativeHumidityValue .
  FILTER(?airTemperatureValue <= ?airTemperatureUpperBound) .
  FILTER(?airTemperatureValue >= ?airTemperatureLowerBound) .
  FILTER(?relativeHumidityValue <= ?relativeHumidityUpperBound) .
  FILTER(?relativeHumidityValue >= ?relativeHumidityLowerBound) .
}
```

Since there are no currently comfortable occupants in competency question 6, this query intentionally returns no results.

Competency Question 5

Question: In a small office space with three occupants, who is currently comfortable? Occupant 1 has a preferred temperature range of 64°F to 68°F, prefers lower humidity (25% to 35%), and enjoys a light breeze (1 m/s to 2 m/s). Occupant 2 has a preferred temperature range of 70°F to 75°F, is comfortable in varied humidity (30% to 40%), and likes a light to moderate breeze (1 m/s to 3 m/s). Occupant 3 has a preferred temperature range of 68°F to 74°F, is

comfortable in most humidity settings (30% to 50%), and prefers no breeze (0 m/s to 1 m/s). The office temperature is 70°F, the relative humidity is 30%, and the air speed is 2 m/s.

This query corresponds with competency question 7. Given a specific room, it returns the occupants whose corresponding comfort ranges include the environment values and who therefore currently feel comfortable.

```
SELECT ?occupant WHERE {
  ?occupant iem:occupies ind:Question7Room .
  ?occupant iem:hasAirSpeedComfortRangeLowerBound
?airSpeedLowerBound .
  ?occupant iem:hasAirTemperatureComfortRangeLowerBound
?airTemperatureLowerBound .
  ?occupant iem:hasRelativeHumidityComfortRangeLowerBound
?relativeHumidityLowerBound .
  ?occupant iem:hasAirSpeedComfortRangeUpperBound
?airSpeedUpperBound .
  ?occupant iem:hasAirTemperatureComfortRangeUpperBound
?airTemperatureUpperBound .
  ?occupant iem:hasRelativeHumidityComfortRangeUpperBound
?relativeHumidityUpperBound .
  ind:Question7EnvironmentCurrent iem:hasAirTemperatureValue
?airTemperatureValue .
  ind:Question7EnvironmentCurrent iem:hasAirSpeedValue
?airSpeedValue .
  ind:Question7EnvironmentCurrent iem:hasRelativeHumidityValue
?relativeHumidityValue .
  FILTER(?airTemperatureValue <= ?airTemperatureUpperBound) .
  FILTER(?airTemperatureValue >= ?airTemperatureLowerBound) .
  FILTER(?airSpeedValue <= ?airSpeedUpperBound) .
  FILTER(?airSpeedValue >= ?airSpeedLowerBound) .
  FILTER(?relativeHumidityValue <= ?relativeHumidityUpperBound) .
  FILTER(?relativeHumidityValue >= ?relativeHumidityLowerBound) .
}
```

Example result: Occupant 2 and Occupant 3 is comfortable

Discussion

Key Features

Our ontology is designed such that queries can discover available actions that produce the ideal indoor environment and that meet various acceptability criteria. It's available as an RDF file on our website: <https://indoor-environment-manager--rpi-ontology-engineering.netlify.app/oe2022/indoor-environment-manager/>

Value of Semantics

We use semantics to infer whether particular actions are “acceptable” given a set of general rules and heuristics. For example, our ontology is designed such that a reasoner can infer that opening a window produces a resultant indoor environment with the same air quality level as the relevant outdoor environment. A query might then restrict the set of actions that it returns to just those that produce a “good” or “moderate” indoor air quality level. Resultant indoor

environments are predicted, not detected in the real world, so a query on a regular database without semantics wouldn't be able to filter out actions that cause unacceptable indoor air quality levels because the necessary information wouldn't be present in the database.

Limitations

Perhaps the most significant limitation of our model is its reliance purely on "sign-based" deltas for air temperature, air speed, and relative humidity. For instance, an ideal indoor environment must be declared in terms of a positive or negative delta from the current indoor environment for each of the three IEQ metrics, and reasoning on precise numeric values is unsupported. Future work, which we discuss in a later section of this paper, could include improving the fidelity of the model to be able to reason with qualitative "buckets" or even precise numeric values, but there are significant unsolved challenges to doing this.

Websites

Detailed information can be found on [our website](#). The website contains information pertaining to all the aspects of this project, such as use case documents, terminology lists, conceptual model diagrams, ontology files, SPARQL queries, presentations, and weekly reports. Furthermore, all the previous versions of the artifacts are available on the website.

Related Work

We will fill this section in later

Future Work

This semester, we developed an ontology for improving IEQ in a room based on indoor and outdoor environments and occupant profiles. This ontology suggests turning on/off, pulling up/down or opening/closing room components, in order to increase or decrease environmental parameters. To make this project feasible and doable during the semester, we pivoted the scope of the project several times. Firstly, we excluded sound and visual comfort concepts from the scope of IEQ to enhance the feasibility. Secondly, 3D geometries and thermodynamic parts were excluded due to their computational complexity. Thirdly, we excluded energy consumption and cost concepts because they required specifications of the equipment and thermodynamic knowledge. Fourthly, we excluded the Predicted Mean Vote (PMV) calculation in the ontology because we found that Protege didn't support mathematical calculation. Finally, we changed the bucket-based reasoning into sign-based reasoning to make the ontology simpler. After several pivots, we could specify the feasible scope of this project and implement the essential functionality of the ontology. Future

work would further develop the ontology to enable the PMV-centered suggestion by considering the interrelation between air temperature, relative humidity, and air speed. Moreover, the excluded scope would be contained in the future for achieving the ultimate goal of this project, which is to improve IEQ including indoor air quality, sound and visual comfort.

Conclusion

In this project, we developed an ontology that suggests viable solutions for enhancing IEQ in a room considering indoor environmental conditions, outdoor environmental conditions, and occupant profiles. If non-power-consuming components are available, the ontology places a higher priority on them to reduce building energy use. To specify the scope of this project and the essential functionality, we described usage scenarios and competency questions. Based on them, we designed conceptual models focusing on room components, indoor/outdoor environment, and outdoor air quality. Finally, we developed ontology and verify the functionality by answering the competency questions using SPARQL queries. In the future, we further develop to implement PMV-centered suggestions by considering the interrelation between air temperature, relative humidity, and air speed. This ontology can be a basis to develop an industrial-scale of IEQ management system by integrating 3D geometric models and thermodynamic simulations modules.

Acknowledgments

We greatly appreciate our professor Deborah McGuinness' and Elisa Kendall's help and insight during the development of our Indoor Environmental Management System Ontology. Thank you to Jade Franklin and Solar Shirai for providing feedbacks on our artifacts and presentations. Furthermore, we are thankful to Professor Dennis Shelden for sharing his insight with us as a domain expert.

References

- [1] US Energy Information Administration. "U.S. energy consumption by source and sector, 2021", available at <https://www.eia.gov/totalenergy/data/monthly/pdf/flow/total-energy-spaghettichart-2021.pdf>
- [2] US Energy Information Administration. "Quadrennial Technology Review 2015", available at <https://www.energy.gov/sites/prod/files/2017/03/f34/qtr-2015-chapter5.pdf>
- [3] ASHRAE Terminology. "indoor environment quality (IEQ)", available at [https://xp20.ashrae.org/terminology/index.php?term=indoor%20environment%20quality%20\(IEQ\)](https://xp20.ashrae.org/terminology/index.php?term=indoor%20environment%20quality%20(IEQ))

- [4] Luo, Maohui, Zhe Wang, Kevin Ke, Bin Cao, Yongchao Zhai, and Xiang Zhou. "Human metabolic rate and thermal comfort in buildings: The problem and challenge." *Building and Environment* 131 (2018): 44-52.
- [5] Hasson, Rebecca E., Cheryl A. Howe, Bryce L. Jones, and Patty S. Freedson. "Accuracy of four resting metabolic rate prediction equations: effects of sex, body mass index, age, and race/ethnicity." *Journal of Science and Medicine in Sport* 14, no. 4 (2011): 344-351.
- [6] Tartarini, F., Schiavon, S., Cheung, T., Hoyt, T., (2020). "CBE Thermal Comfort Tool: online tool for thermal comfort calculations and visualizations". *SoftwareX* 12, 100563.
- [7] International Organization for Standardization. (2005). "Ergonomics of the thermal environment — Analytical determination and interpretation of thermal comfort using calculation of the PMV and PPD indices and local thermal comfort criteria (ISO 7730)". available at <https://www.sis.se/api/document/preview/907006/>
- [8] Hasan, M. H., Alsaleem, F. M., & Rafaie, M. (2016). "Sensitivity analysis for the PMV thermal comfort model and the use of wearable devices to enhance its accuracy". *International High Performance Buildings Conference*. Paper 200.
- [9] US Energy Information Administration. "Technical Assistance Document for the Reporting of Daily Air Quality – the Air Quality Index (AQI)", available at <https://www.airnow.gov/sites/default/files/2020-05/aqi-technical-assistance-document-sept2018.pdf>