



# 2024 ASHRAE WINTER CONFERENCE

CHICAGO, JAN 20-24 | AHR EXPO, JAN 22-24

Seminar 14: Better Data and Analytics Enable Better  
Decision Making on Building Operations and  
Decarbonization

## **Metadata Ontologies for Data Discovery and Portable Analytics**

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# Learning Objectives

- Understand FAIR principles of data: Findability, Accessibility, Interoperability, and Reusability
- Learn where to find open building performance datasets
- Understand how dataset and analytics can provide insights to improve building operations
- Learn various data tools (ontology, schema, models) used to represent semantic and metadata of building and system data

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# Acknowledgements

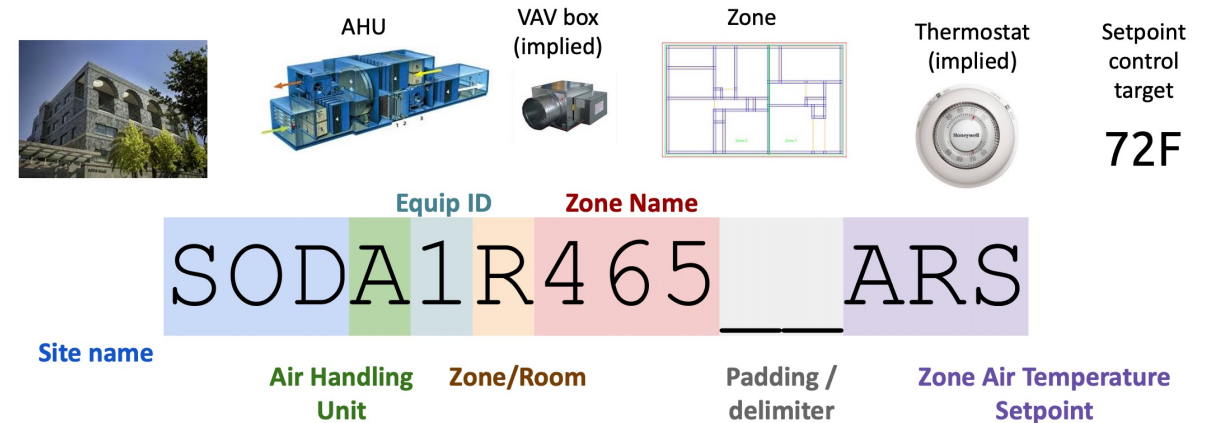
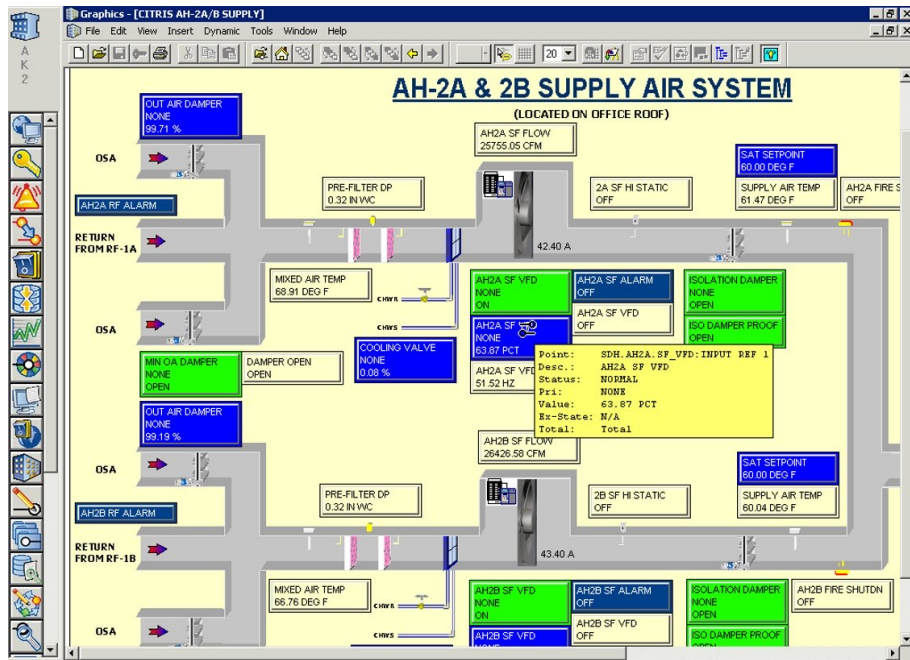
- Avijit Saha, NREL
- Matthew Steen, NREL
- Tobias Shapinsky, NREL
- Steve Bushby, NIST
- Joel Bender, Cornell University
- Brian Walker, DOE
- Amir Roth, DOE

# Outline/Agenda

- Overview of 223P and Brick ontologies
- Modeling buildings and building data with ontologies
- Accessing data through ontologies
- Using data to build fault detection and thermal models

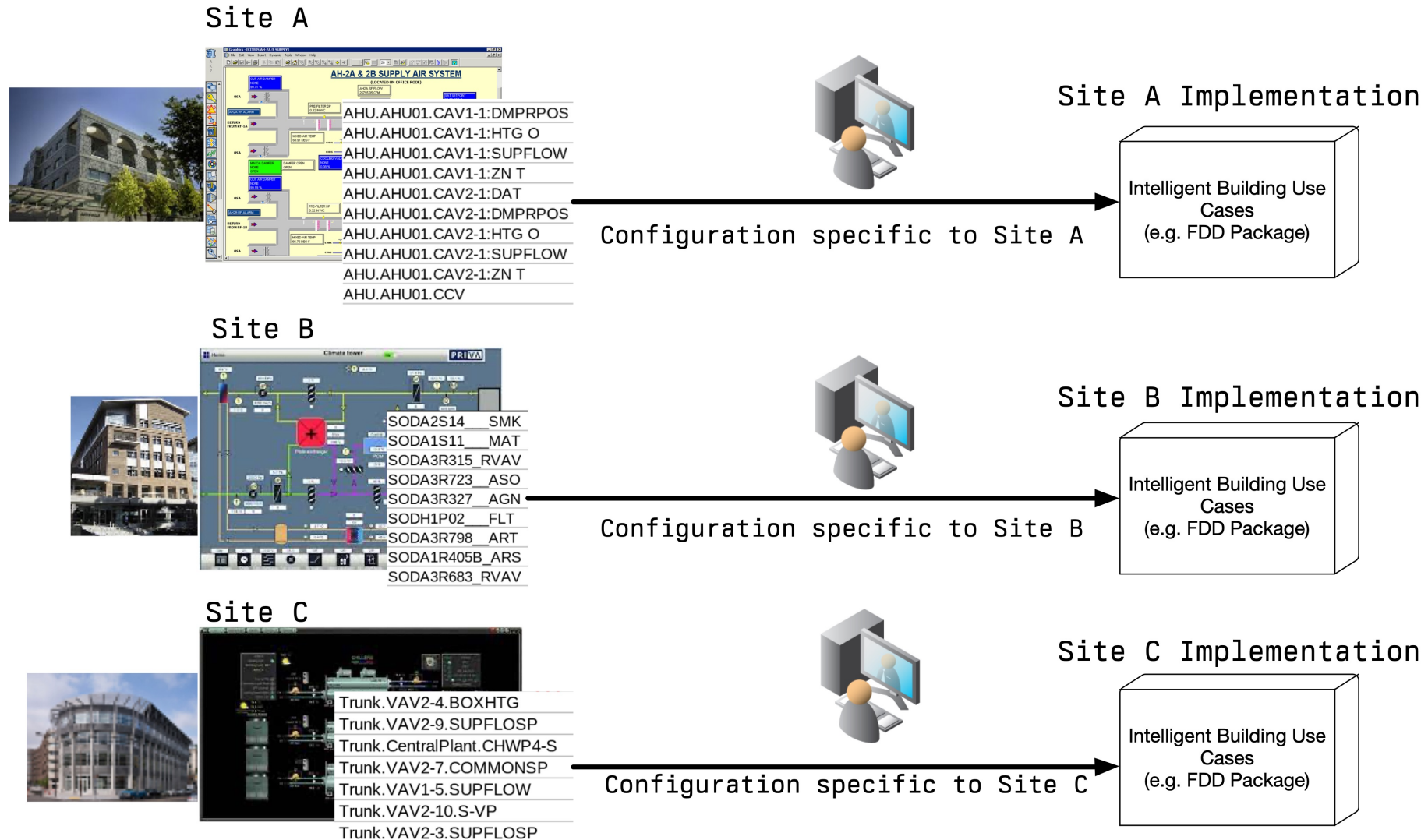
# Framing the Problem

- *Data rich, but information poor*
- Building data often hidden away behind proprietary silos, semi-structured naming conventions



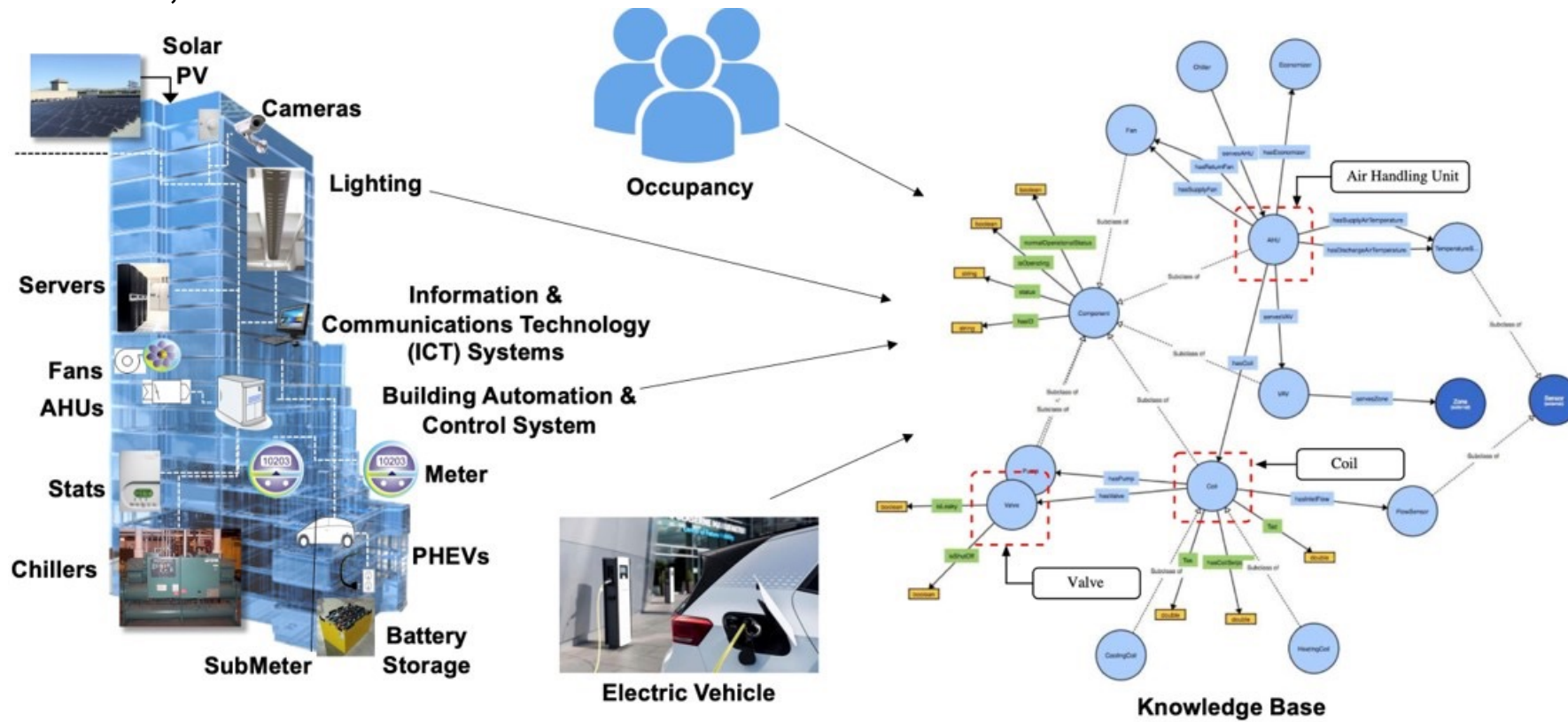
- Focus on operational data in this talk
- BMS point labels (above) are the primary identifiers of data

# Implementing Software Requires Manual Configuration



# What is ASHRAE 223P?

ASHRAE 223P standard defines concepts and methodologies to create interoperable, **machine-readable semantic models** for representing building information for analytics, control, and automation.



- Control
- Energy Auditing
- Fault Detection and Diagnostics
- Commissioning
- Smart Grid Interactions
- **ASHRAE 231P**

## Physical, logical systems

represents

## Semantic Model

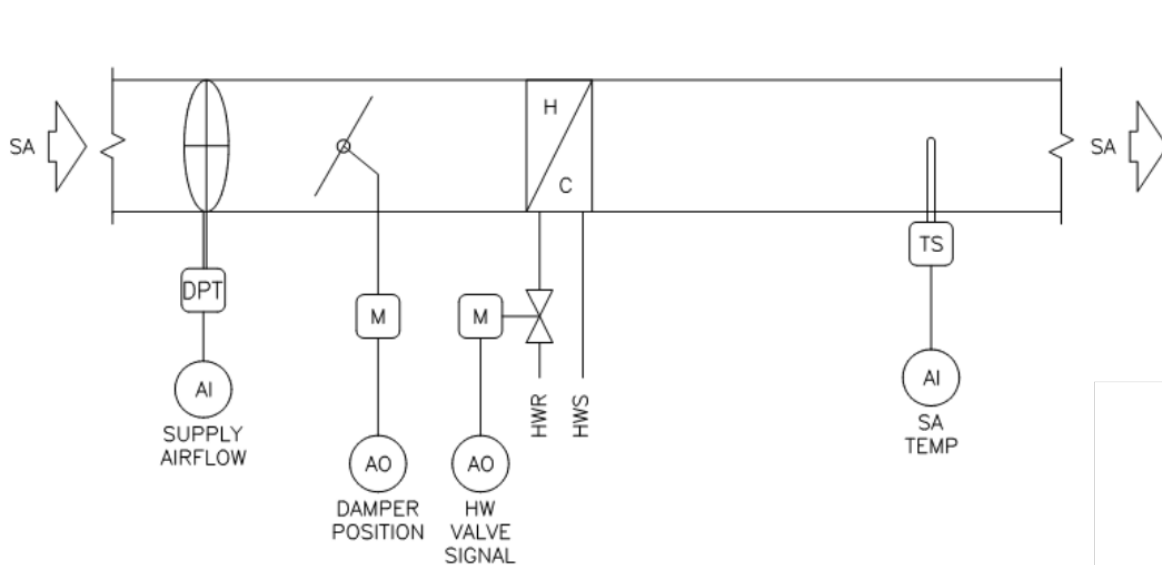
access

## Applications

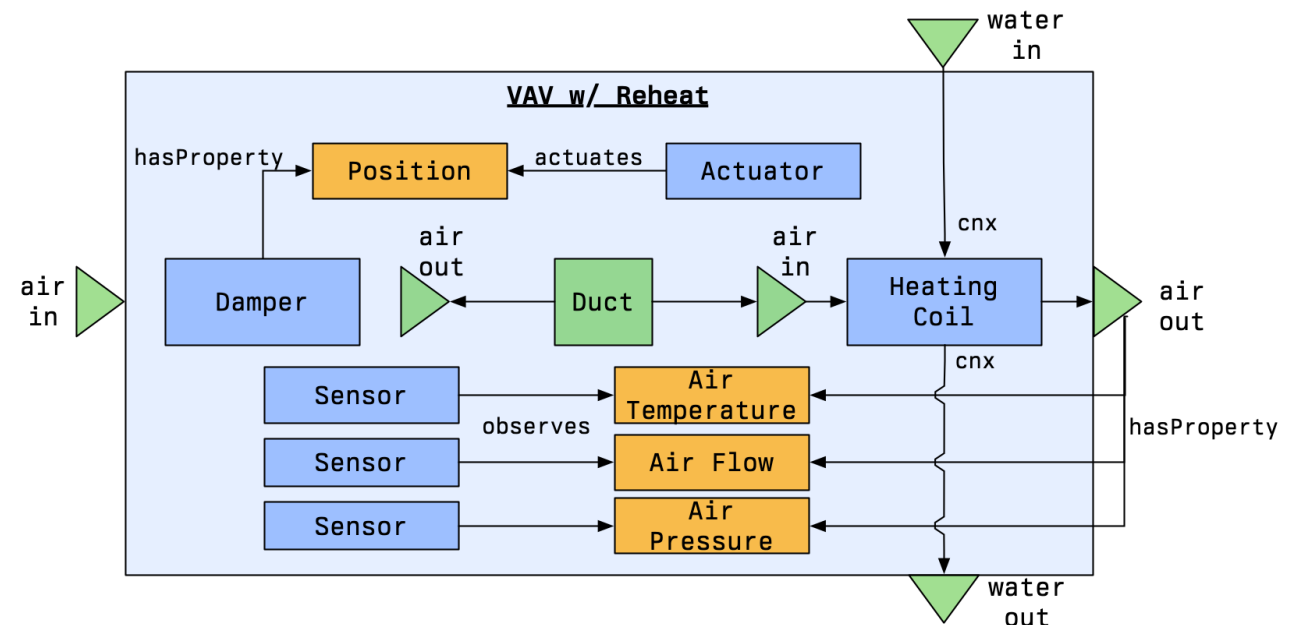


# Ontologies and Semantic Models

- A **semantic model** is a digital graph-based representation of a building
  - *Entities*: equipment, sensors, actuators, properties, connections
  - Includes useful attributes of these entities
  - Models how entities relate to each other and compose into systems



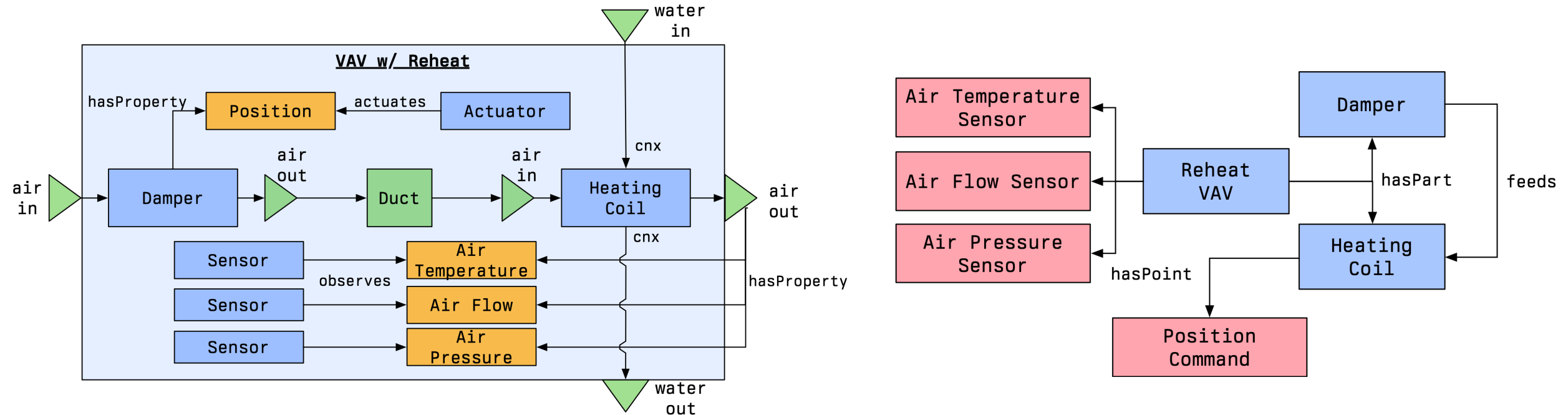
VAV with Reheat Mechanical Diagram



Graphical representation of 223P model



# Brick is a Simplification of 223P

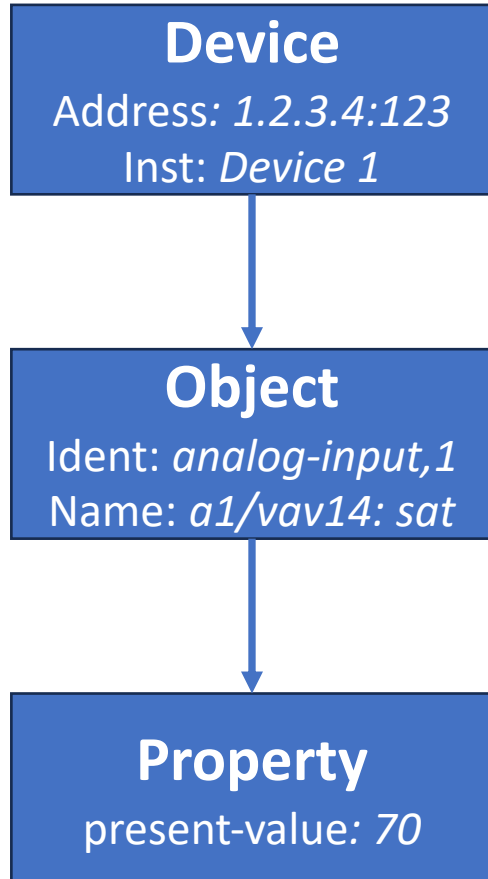


- Detailed topological information in 223P is helpful for some apps, but unnecessary for many others
- Use familiar terminology found in point lists, application descriptions
- Smaller models, easier to query → works better for common systems
- Can always reach into 223P for concepts not covered by Brick

# Ontologies and Semantic Models

- ASHRAE 223P and Brick are **ontologies**
  - Formal definition of directed, labeled graph data structure
  - Analogous to a schema (think XML, databases, etc)
- Provides structure to semantic models, enabling
  - Automated verification/validation of semantic models
  - (Semi-)automated configuration of applications
  - (Semi-)automated creation and maintenance of semantic models
- Builds on open standards
  - **RDF (Resource Description Framework)**: W3C standard for directed graphs
  - **SPARQL**: W3C standard query language for graphs
  - **SHACL**: W3C standard constraint language for graph validation

# How do Ontologies Work with Building Data?



**BACnet**

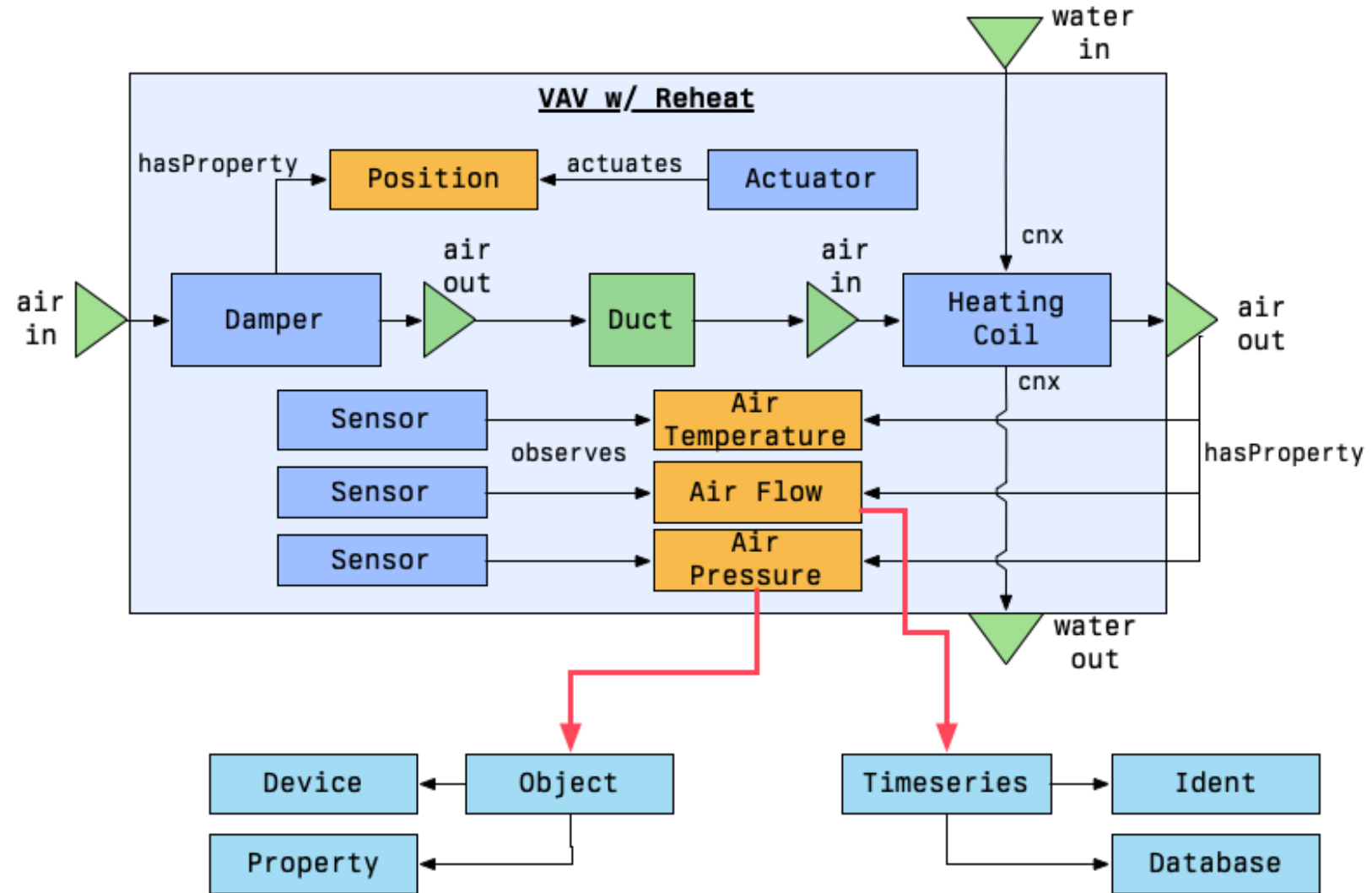
Ident	Time	Value
a1/vav14: sat	2024-06-21T10:15:00	70
a1/vav14: sat	2024-06-21T10:30:00	70
a1/vav14: sat	2024-06-21T10:45:00	70.5
a1/vav14: sat	2024-06-21T11:00:00	70.1

**Timeseries DB**

- Consider two sources of data
- **Live data** through interacting with BACnet objects
- **Historical data** through an archival service
- Nothing fundamental here:
  - Easily support MQTT, BACnet-SC, Modbus, ...

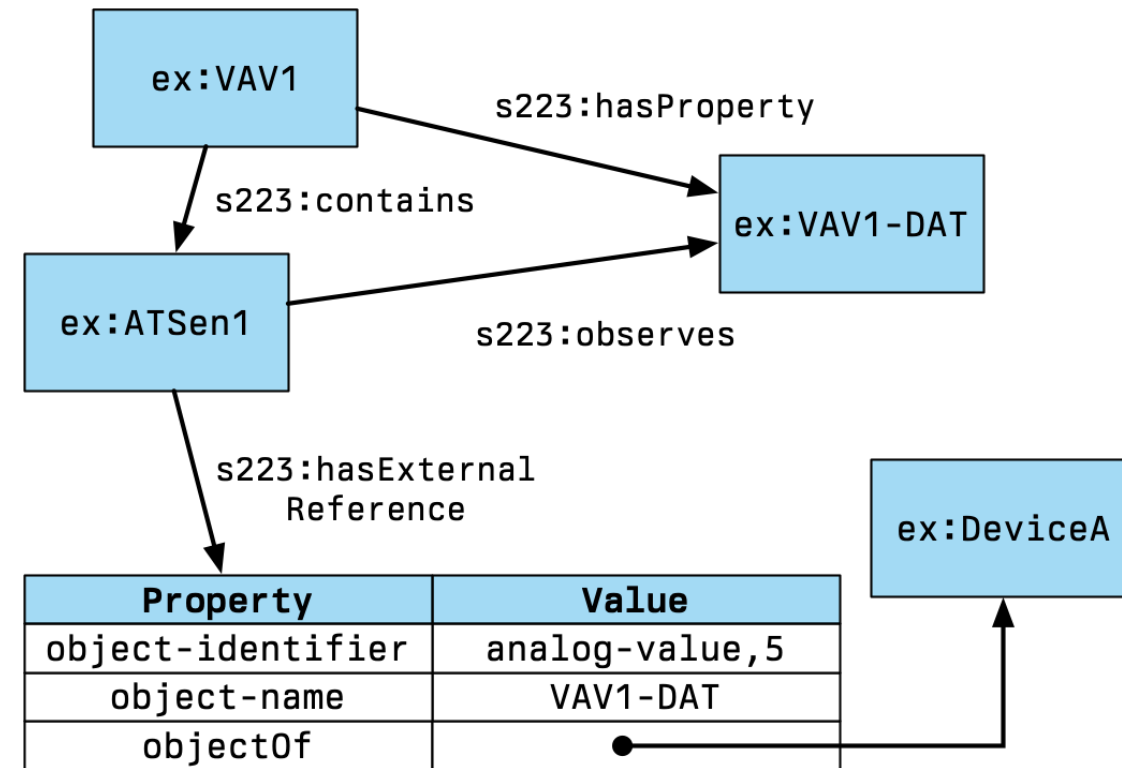
# How do Ontologies Work with Building Data?

- Explicit representation of data context
  - What kind of point, who hosts it does it relate to equipment, how those equipment connect, etc
- Move away from naming conventions and "ctl-f"
- Use queries to describe and discover data by "meaning" & "context", not by name
  - "Early" vs "late" binding
  - We use google.com, not an IP address



# Linking to data

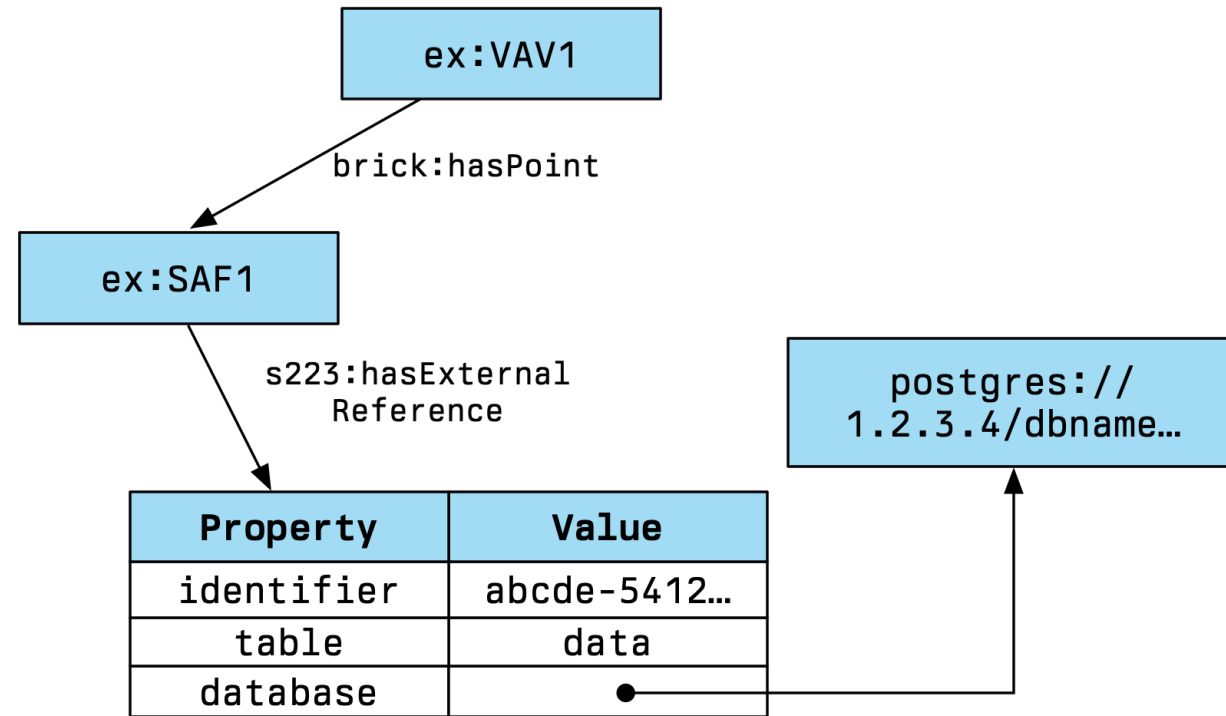
- External References are 223P entities which contain the necessary properties required to retrieve data
  - From a timeseries database...
  - From a BACnet object...
  - From a Modbus register...
  - Etc
- Query the external reference for a property to find the data



BACnet example

# Linking to data (2)

- External References are *also* supported in the Brick ontology
- Query the external reference for the foreign key, table, and database URI for historical data
- The “secret” is just including the necessary client parameters required to connect



BACnet example

# Queries to find data

- Same pattern for Brick/223P
- Use the right level of detail for the job:
  - “supply air flow sensor on a vav” → Brick
  - “all temperature sensors on the condenser water loop” → 223P or Brick
  - “all temperature sensors on the condenser water loop, and their measurement locations” → 223P

Types of points (quantity kind, substance, input/output)

External reference

Association of point to assets, equipment, connections

Context or identity of those assets, equipment, connections



# Using Queries to Find Data

Types of points (quantity kind, substance, input/output)

External reference

Association of point to assets, equipment, connections

Context or identity of those assets, equipment, connections

```
SELECT * WHERE {
```

```
  ?sensor rdf:type/rdfs:subClassOf* s223:Sensor ;  
          s223:observes ?property .  
  ?property qudt:hasQuantityKind qk:Temperature ;
```

```
          s223:hasExternalReference ?ref .  
  ?ref bacnet:isObjectOf ?device ;  
       bacnet:object-identifier ?ident .
```

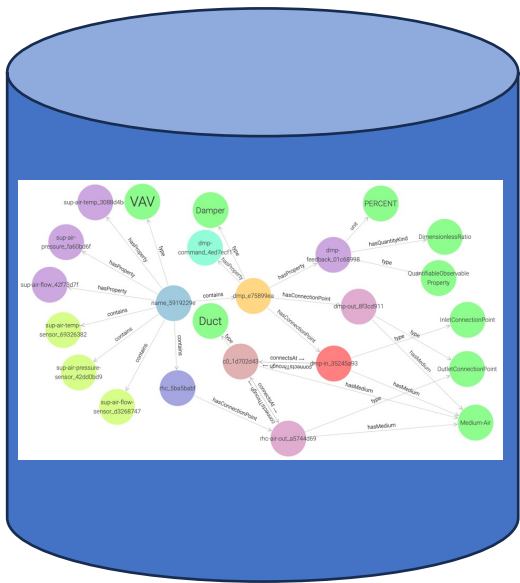
```
  ?device rdf:type s223:TerminalUnit ;  
          s223:contains ?sensor .
```

```
  ?device s223:connectsFrom building:AHU1 .
```

```
}
```

# Using Queries to Find Data

- **SPARQL queries** retrieve information from semantic models
- Example: retrieving all temperature sensors and where they observe temperature



Semantic model stored  
in graph database

```
SELECT ?sensor ?location WHERE {  
  ?sensor rdf:type/rdfs:subClassOf* s223:Sensor .  
  ?sensor s223:observes ?property .  
  ?property qudt:hasQuantityKind quantitykind:Temperature .  
  ?sensor s223:hasObservationLocation ?location  
}
```

?sensor	?location
sup-air-temp-sensor_69326382	vav_out_name_a871635f
rhc-ret-water-temp-sensor_40bc	rhc-valve-in_5060b895

*From our earlier VAV Reheat example*

# Building Applications with Data

- Example: Fault Condition from ASHRAE Guideline 36
  - Low Mixed Air Temperature detection for single zone VAVs

FC #2 (omit if no MAT sensor)	Equation	$\text{MAT}_{\text{AVG}} + \epsilon_{\text{MAT}} < \min[(\text{RAT}_{\text{AVG}} - \epsilon_{\text{RAT}}), (\text{OAT}_{\text{AVG}} - \epsilon_{\text{OAT}})]$
	Description	MAT too low; should be between OAT and RAT
	Possible Diagnosis	RAT sensor error MAT sensor error OAT sensor error

- Use a SPARQL query to
  - a) identify all locations in the model (building) where this rule can run
  - b) retrieve the data necessary to run the rule
- Write the rule itself in the Python programming language

# Example FDD rule application

FC #2 (omit if no MAT sensor)	Equation	$\text{MAT}_{\text{AVG}} + \epsilon_{\text{MAT}} < \min[(\text{RAT}_{\text{AVG}} - \epsilon_{\text{RAT}}), (\text{OAT}_{\text{AVG}} - \epsilon_{\text{OAT}})]$
	Description	MAT too low; should be between OAT and RAT
	Possible Diagnosis	RAT sensor error MAT sensor error OAT sensor error

## Need to find:

- Mixed air temperature
- Return air temperature
- Outside air temperature

```
PREFIX s223: <http://data.ashrae.org/standard223#>
PREFIX rdf: <http://www.w3.org/1999/02/22-rdf-syntax-ns#>
PREFIX qudt: <http://qudt.org/schema/qudt/>
PREFIX quantitykind: <http://qudt.org/vocab/quantitykind/>
PREFIX bacnet: <http://data.ashrae.org/bacnet/2020#>
```

```
SELECT ?oat ?oatId ?mat ?matId ?rat ?ratId ?inst WHERE {
  ?ahu rdf:type s223:AirHandlingUnit .
  ?bacnet a bacnet:BACnetDevice ;
    bacnet:device-instance ?inst .
  # Outside Air Temperature Sensor
  ?oat rdf:type s223:Sensor ;
    s223:observes ?outsideAir .
  ?outsideAir rdf:type s223:QuantifiableObservableProperty ;
    s223:hasAspect s223:Role-Outside ;
    qudt:hasQuantityKind quantitykind:Temperature ;
    s223:hasExternalReference/bacnet:object-identifier ?oatId .
```

```
  # Mixed Air Temperature Sensor
  ?mat rdf:type s223:Sensor ;
    s223:observes ?mixedAir .
  ?mixedAir rdf:type s223:QuantifiableObservableProperty ;
    s223:hasAspect s223:Role-Mixed ;
    qudt:hasQuantityKind quantitykind:Temperature ;
    s223:hasExternalReference/bacnet:object-identifier ?matId .
```

```
  # Return Air Temperature Sensor
  ?rat rdf:type s223:Sensor ;
    s223:observes ?returnAir .
  ?returnAir rdf:type s223:QuantifiableObservableProperty ;
    s223:hasAspect s223:Role-Return ;
    qudt:hasQuantityKind quantitykind:Temperature ;
    s223:hasExternalReference/bacnet:object-identifier ?ratId .
```

```
}
```

```
SELECT ?oat ?oatId ?mat ?matId ?rat ?ratId ?inst WHERE {
  ?ahu rdf:type s223:AirHandlingUnit .
  ?bacnet a bacnet:BACnetDevice ;
    bacnet:device-instance ?inst .
  # Outside Air Temperature Sensor
  ?oat rdf:type s223:Sensor ;
    s223:observes ?outsideAir .
  ?outsideAir rdf:type s223:QuantifiableObservableProperty ;
    s223:hasAspect s223:Role-Outside ;
    qudt:hasQuantityKind quantitykind:Temperature ;
    s223:hasExternalReference/bacnet:object-identifier ?oatId .
```

SPARQL query retrieves names and BACnet object IDs for all sensors

# Example FDD rule application

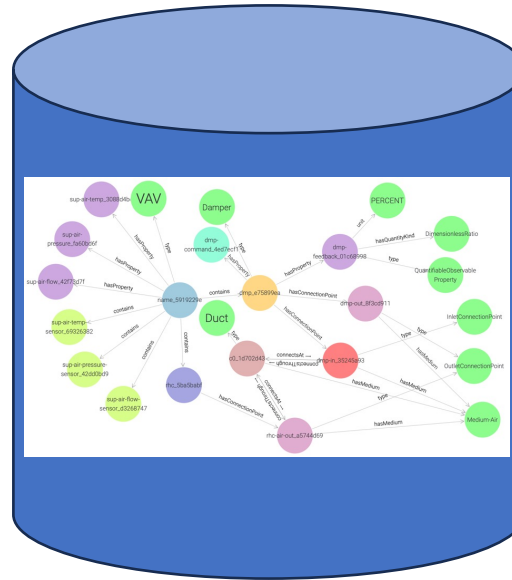
```
PREFIX s223: <http://data.ashrae.org/standard223#>
PREFIX rdf: <http://www.w3.org/1999/02/22-rdf-syntax-ns#>
PREFIX qudt: <http://qudt.org/schema/qudt/>
PREFIX quantitykind: <http://qudt.org/vocab/quantitykind/>
PREFIX bacnet: <http://data.ashrae.org/bacnet/2020#>

SELECT ?oat ?oatId ?mat ?matId ?rat ?ratId ?inst WHERE {
  ?ahu rdf:type s223:AirHandlingUnit .
  ?bacnet a bacnet:BAcnetDevice ;
    bacnet:device-instance ?inst .
  # Outside Air Temperature Sensor
  ?oat rdf:type s223:Sensor ;
    s223:observes ?outsideAir .
  ?outsideAir rdf:type s223:QuantifiableObservableProperty ;
    s223:hasAspect s223:Role-Outside ;
    qudt:hasQuantityKind quantitykind:Temperature ;
    s223:hasExternalReference/bacnet:object-identifier ?oatId .

  # Mixed Air Temperature Sensor
  ?mat rdf:type s223:Sensor ;
    s223:observes ?mixedAir .
  ?mixedAir rdf:type s223:QuantifiableObservableProperty ;
    s223:hasAspect s223:Role-Mixed ;
    qudt:hasQuantityKind quantitykind:Temperature ;
    s223:hasExternalReference/bacnet:object-identifier ?matId .

  # Return Air Temperature Sensor
  ?rat rdf:type s223:Sensor ;
    s223:observes ?returnAir .
  ?returnAir rdf:type s223:QuantifiableObservableProperty ;
    s223:hasAspect s223:Role-Return ;
    qudt:hasQuantityKind quantitykind:Temperature ;
    s223:hasExternalReference/bacnet:object-identifier ?ratId .
}
```

Execute query  
against semantic  
model



ahu		inst	matId
urn:ex/single-zone-ahu		123	analog-value,6
oatId		ratId	
analog-value,5		analog-value,7	

Query Results

- Now we have all the information necessary to read live data from our BACnet network!
- External references also let us read data out of databases, etc

# Example FDD rule application

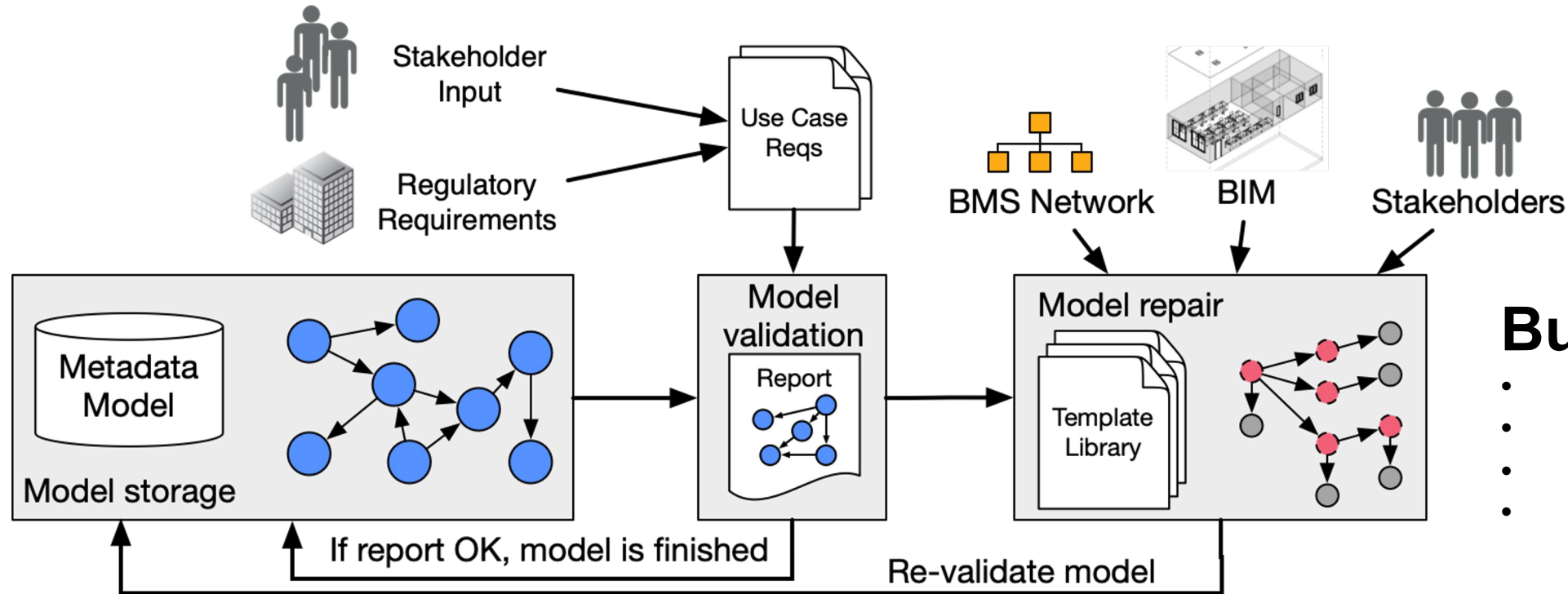
FC #2 (omit if no MAT sensor)	Equation	$\text{MAT}_{\text{AVG}} + \epsilon_{\text{MAT}} < \min[(\text{RAT}_{\text{AVG}} - \epsilon_{\text{RAT}}), (\text{OAT}_{\text{AVG}} - \epsilon_{\text{OAT}})]$
	Description	MAT too low; should be between OAT and RAT
	Possible Diagnosis	RAT sensor error MAT sensor error OAT sensor error

- Write out FDD rule as a Python function
- Use query results to generate a dataset with the correct column names
- Run the function!

```
def run_fc2(df):  
    """  
    Check  $\text{MAT} + \epsilon_{\text{MAT}} < \min[(\text{RAT} - \epsilon_{\text{RAT}}), (\text{OAT} - \epsilon_{\text{OAT}})]$  at each timestamp and  
    print out the timestamps where the inequality is true.  
    """  
  
    # Assuming  $\epsilon$  values as constants, they can be changed as per actual values  
    epsilon_MAT = epsilon_RAT = epsilon_OAT = 1  
    # List to store timestamps where the inequality holds true  
    timestamps_where_true = []  
    # Iterate over the dataframe  
    for index, row in df.iterrows():  
        # Check the inequality condition for each row  
        if row['mat'] + epsilon_MAT < min(row['rat'] - epsilon_RAT, row['oat'] - epsilon_OAT):  
            timestamps_where_true.append(index)  
    # Print out the timestamps  
    for timestamp in timestamps_where_true:  
        print(f"Fault condition true at: {timestamp}")
```

```
[19]: run_fc2(df)  
  
Fault condition true at: 2023-01-01 06:30:00  
Fault condition true at: 2023-01-01 08:30:00  
Fault condition true at: 2023-01-01 09:45:00
```

# Open-Source Software for Semantic Models



## BuildingMOTIF

- Open source, BSD-licensed
- Developed by NREL
- Available on GitHub
- “Software 1”

- Incorporate formal use case requirements into iterative workflow
- Ensure that delivered metadata model fulfills all use cases
- Automate / simplify authoring through templates, imports from other sources
- Generate SPARQL queries from application requirements



# Deriving Queries from “Shapes”

```
:zone-temp-model a sh:NodeShape ;
  sh:targetClass brick:RVAV ;
  sh:property [
    sh:path brick:hasPoint ;
    sh:name "hvac_mode" ;
    sh:qualifiedMinCount 1 ;
    sh:qualifiedValueShape [ sh:class brick:HVAC_Mode_Command ] ;
  ] ;
  sh:property [
    sh:path brick:hasPoint ;
    sh:name "supply_air" ;
    sh:qualifiedMinCount 1 ;
    sh:qualifiedValueShape [ sh:class brick:Supply_Air_Temperature_Sensor ] ;
  ] ;
  sh:property [
    sh:path brick:feeds
    sh:qualifiedMinCount 1 ;
    sh:name "room" ;
    sh:qualifiedValueShape [
      sh:class brick:Room ;
      sh:property [
        sh:path brick:hasPoint ;
        sh:qualifiedMinCount 1 ;
        sh:name "room_temp" ;
        sh:qualifiedValueShape [ sh:class brick:Air_Temperature_Sensor ] ;
      ] ;
    ] ;
  ] ;
  sh:property [
    sh:path brick:hasPart ;
    sh:qualifiedMinCount 1 ;
```



```
SELECT * WHERE {
  ?target    rdf:type/rdfs:subClassOf* brick:RVAV ;
             brick:hasPoint      ?supply_air ;
             brick:feeds         ?room ;
             brick:hasPart       ?coil .

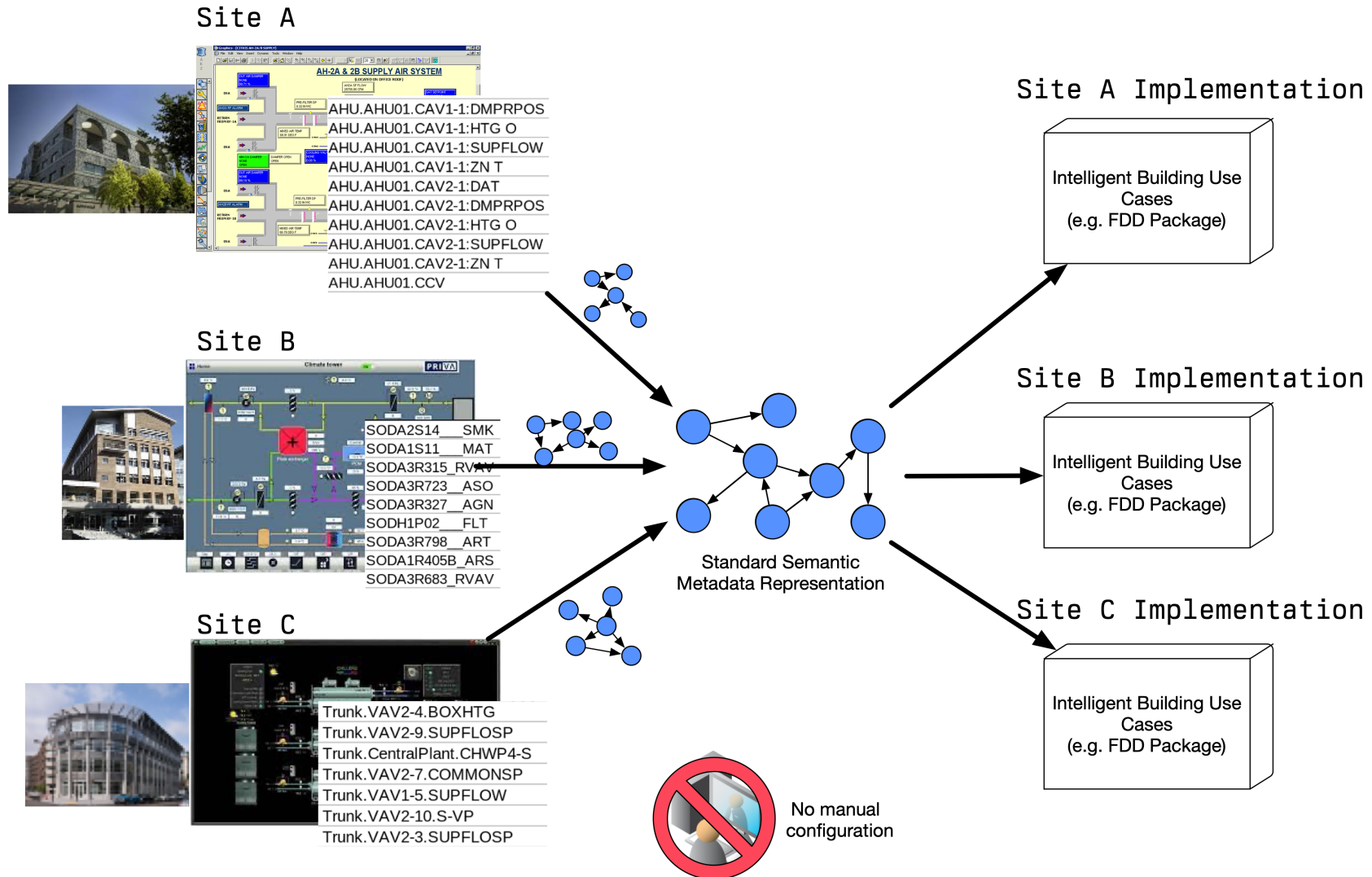
  ?room      rdf:type/rdfs:subClassOf* brick:Room ;
             brick:hasPoint      ?room_temp .

  ?coil       rdf:type/rdfs:subClassOf* brick:Heating_Coil ;
             brick:hasPoint      ?heating_valve .

  ?supply_air a brick:Supply_Air_Temperature_Sensor .
  ?room_temp  a brick:Air_Temperature_Sensor .
  ?heating_valve a brick:Position_Command .
}
```

- Shape is a specification of what information **must** be contained within a model
  - Check for required points, equipment, annotations
  - *Software 1* evaluates requirements on a model and suggests fixes
- Think of a shape as a **schema** for a desired dataset
- *Software 1* can convert shapes (validation) into queries (retrieval)

# Portable Analytics



# Conclusion

- Semantic models like Brick and 223P can provide rich contextual annotations to building data sets
- Queries retrieve data sources from models using properties and characteristics, *not identifiers*
- Semantic models can link to external data sources like BACnet objects and timeseries historian services
- All of this is built on open standards; open-source software provides simpler and easier interfaces

# Questions?

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