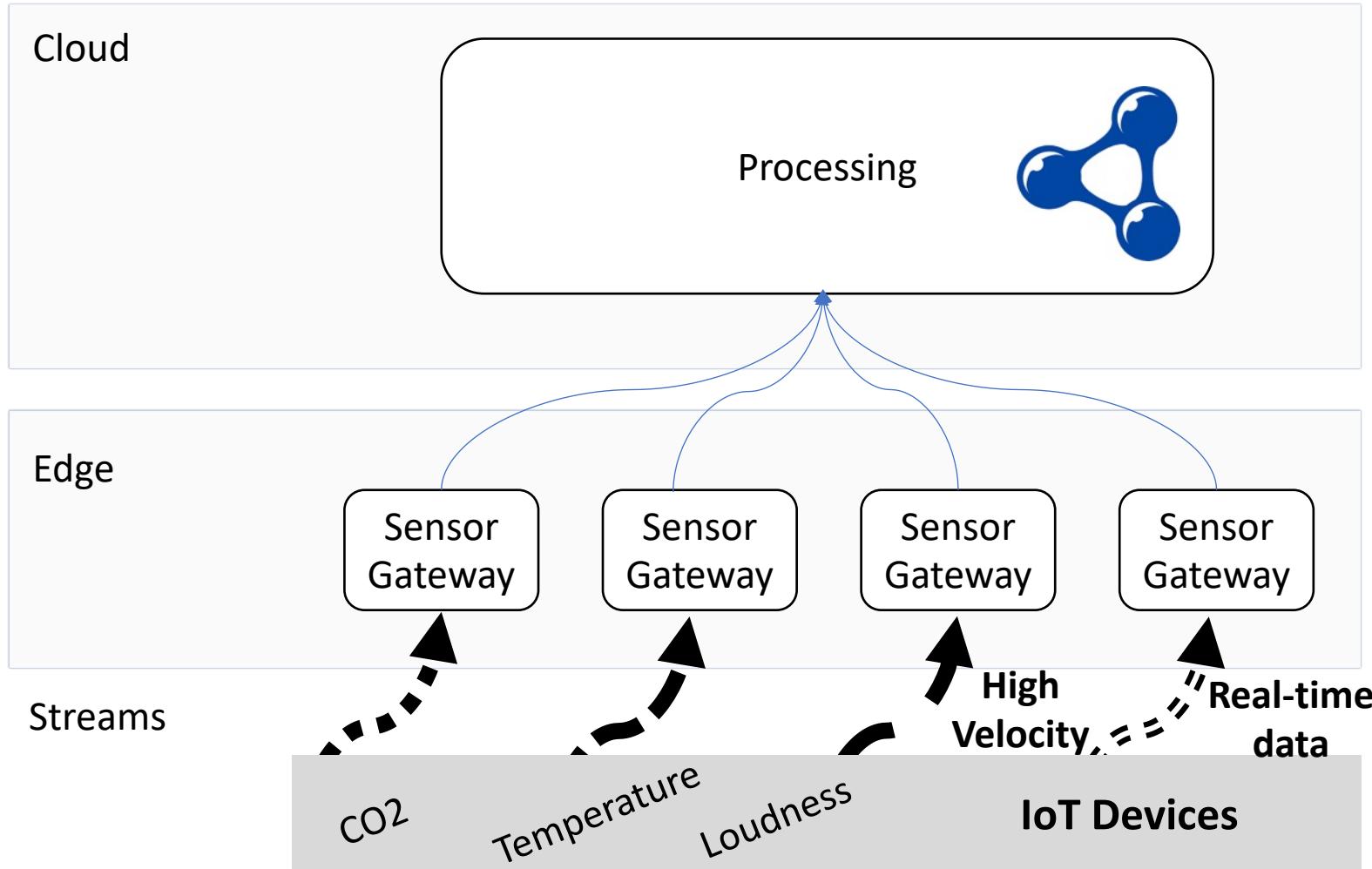


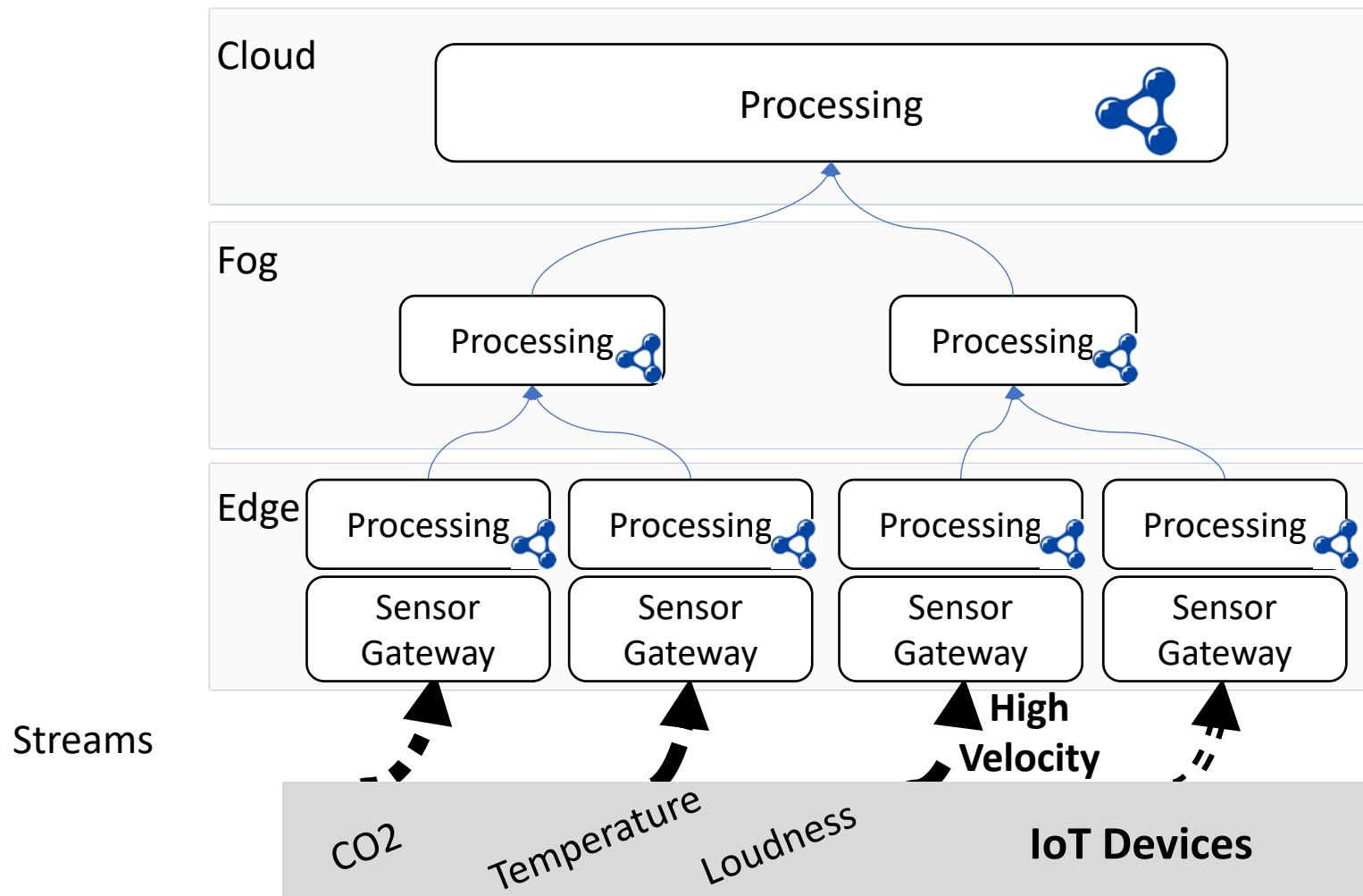
# Towards Cascading Reasoning for Generic Edge Processing

Pieter Bonte, Femke Ongenae

# Limitations of Cloud Computing for the IoT



# Potential of Edge and Fog Computing for the IoT

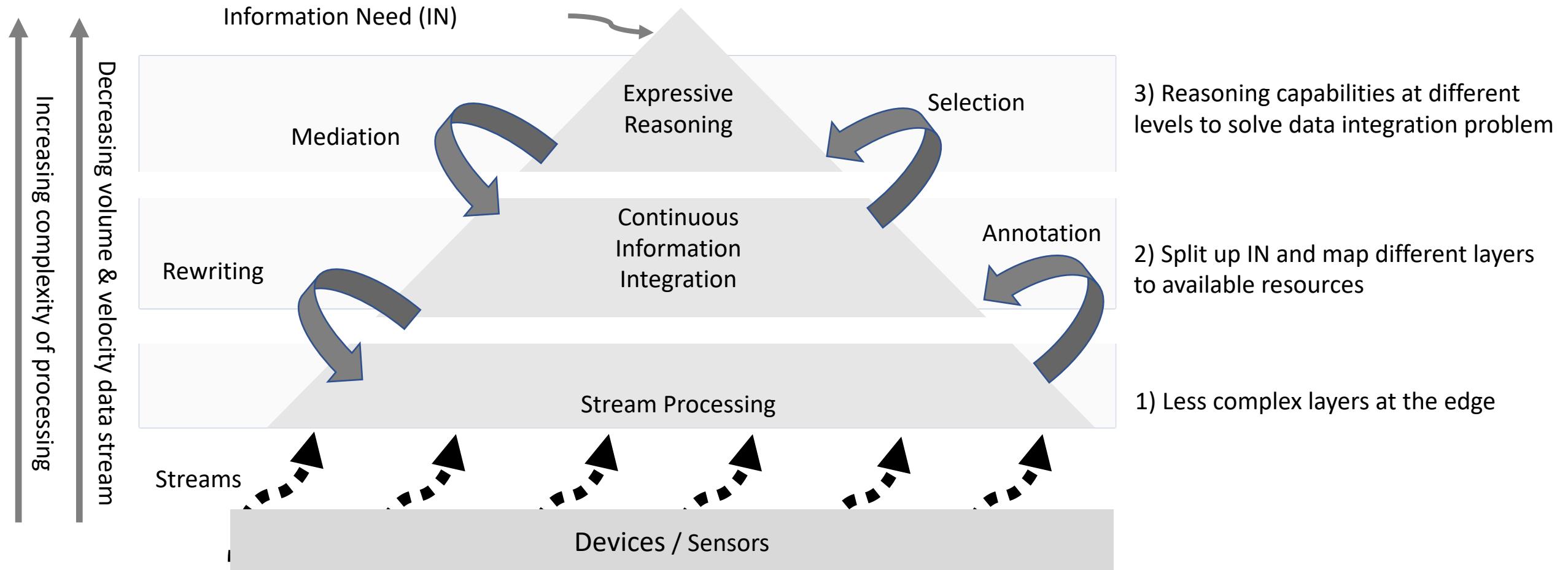


3) Data integration problem

2) Limited resources, heterogeneity, scale and complexity of the infrastructure

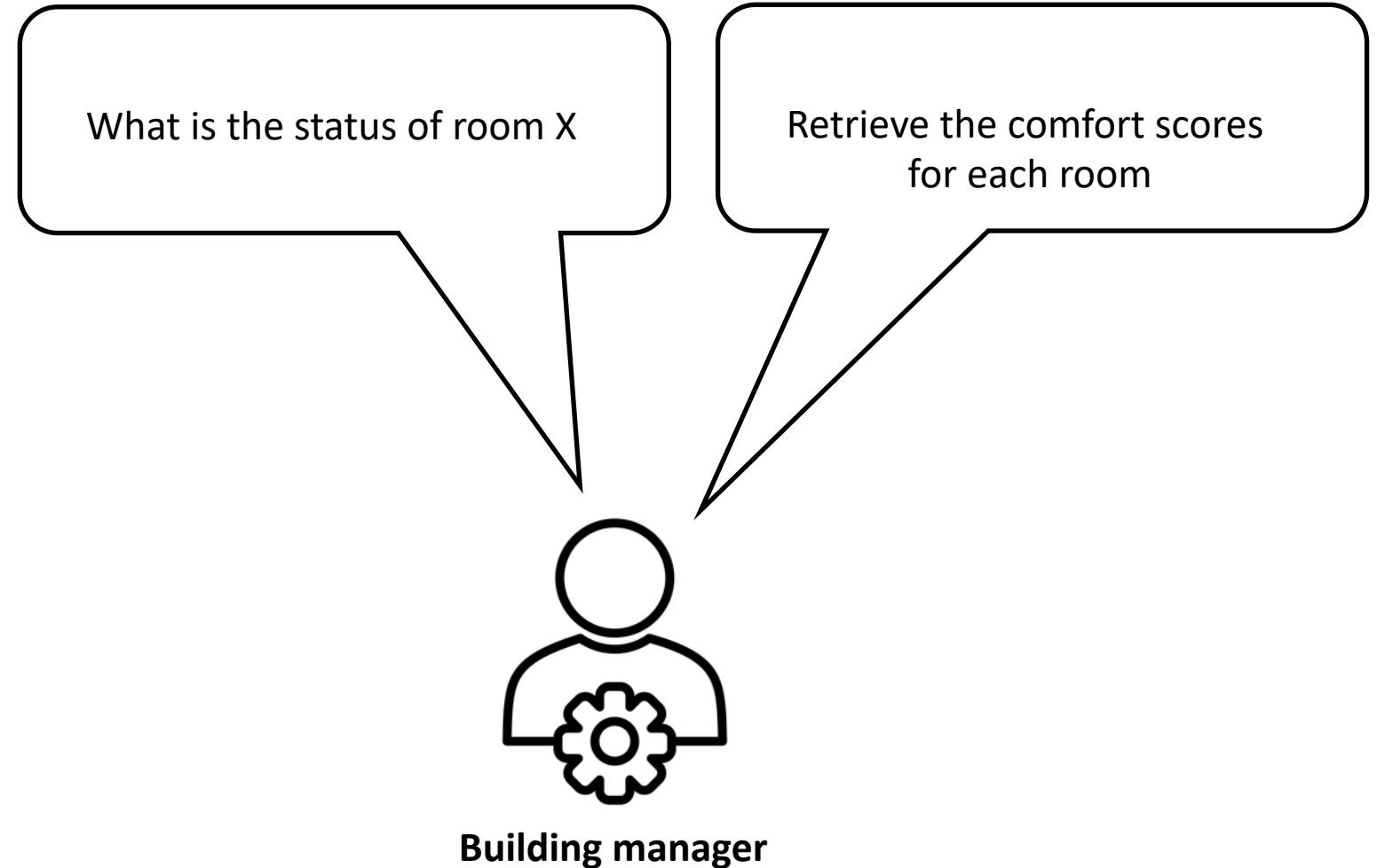
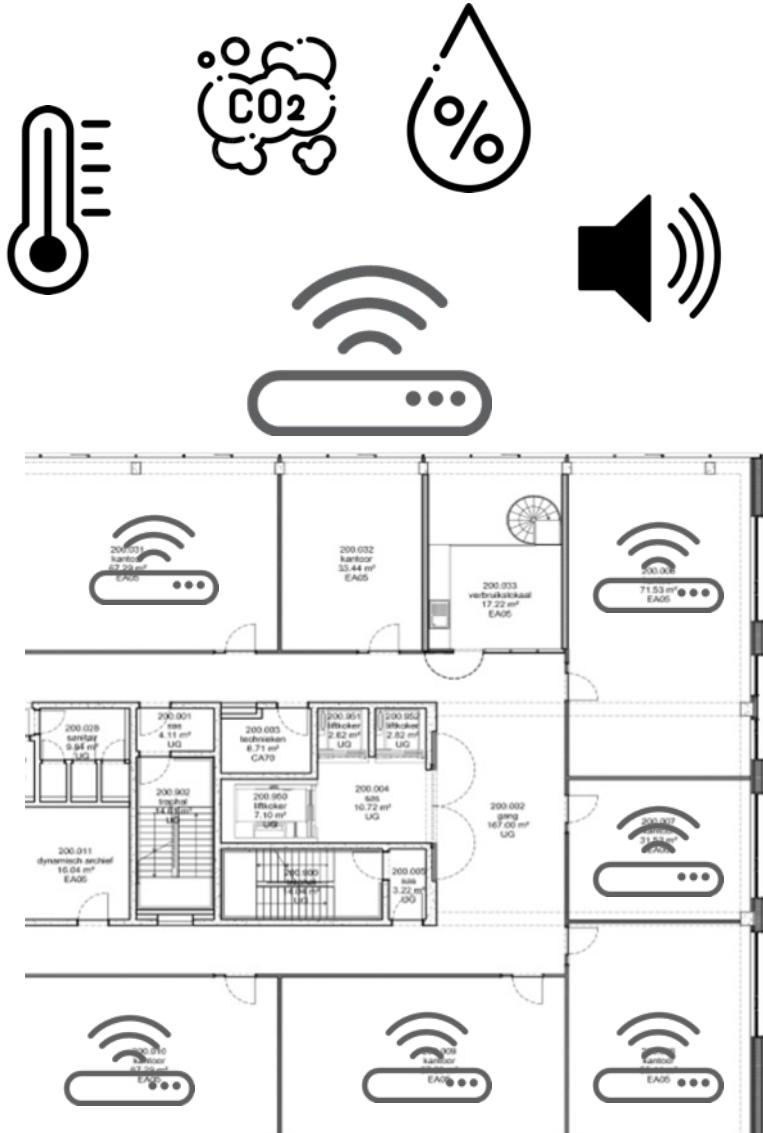
1) More data is being produced than can be meaningfully processed

# Cascading Reasoning

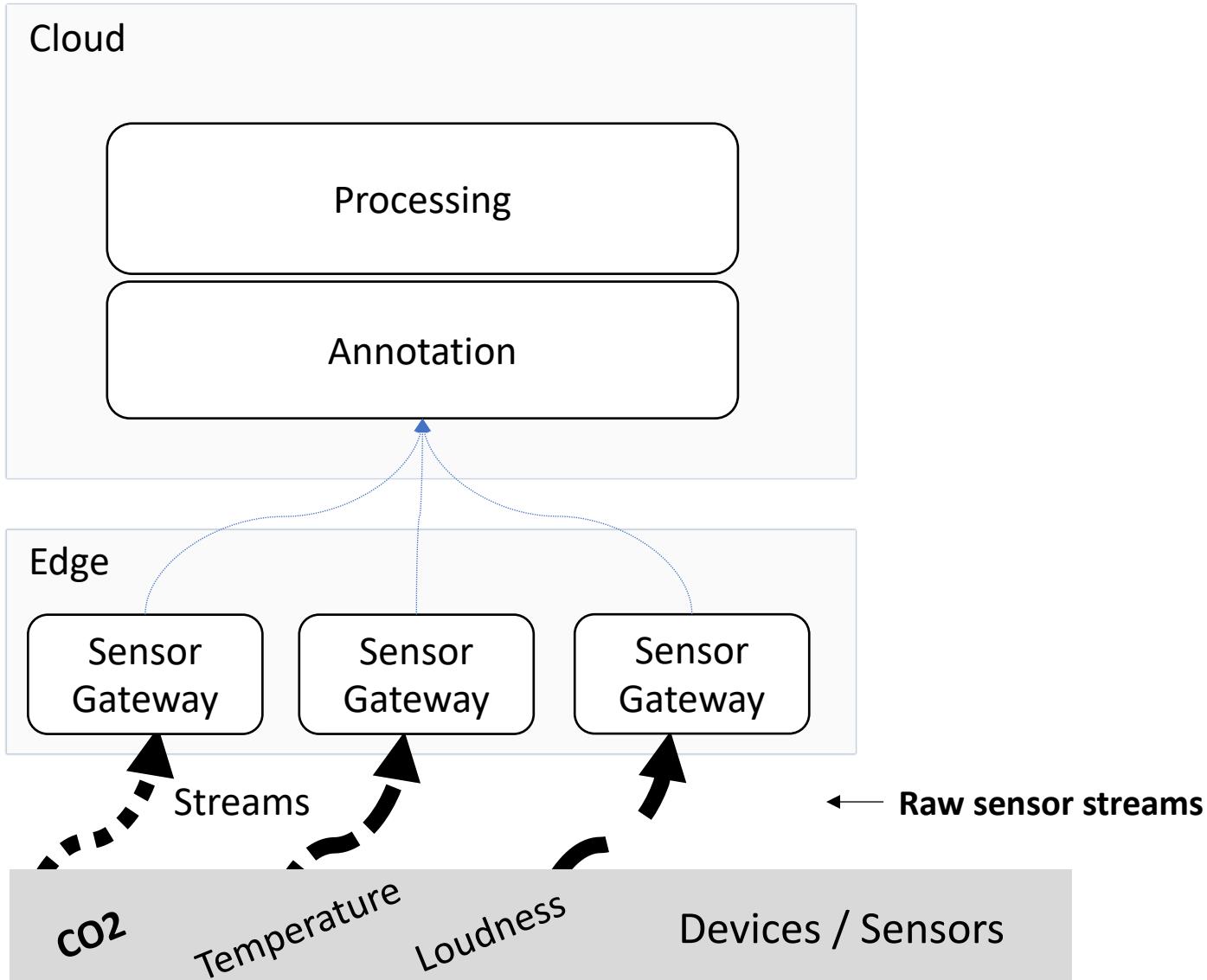


How can we rewrite queries and optimize the intermediate reasoning steps to offload them to the Edge and filter data early on?

## Running Example

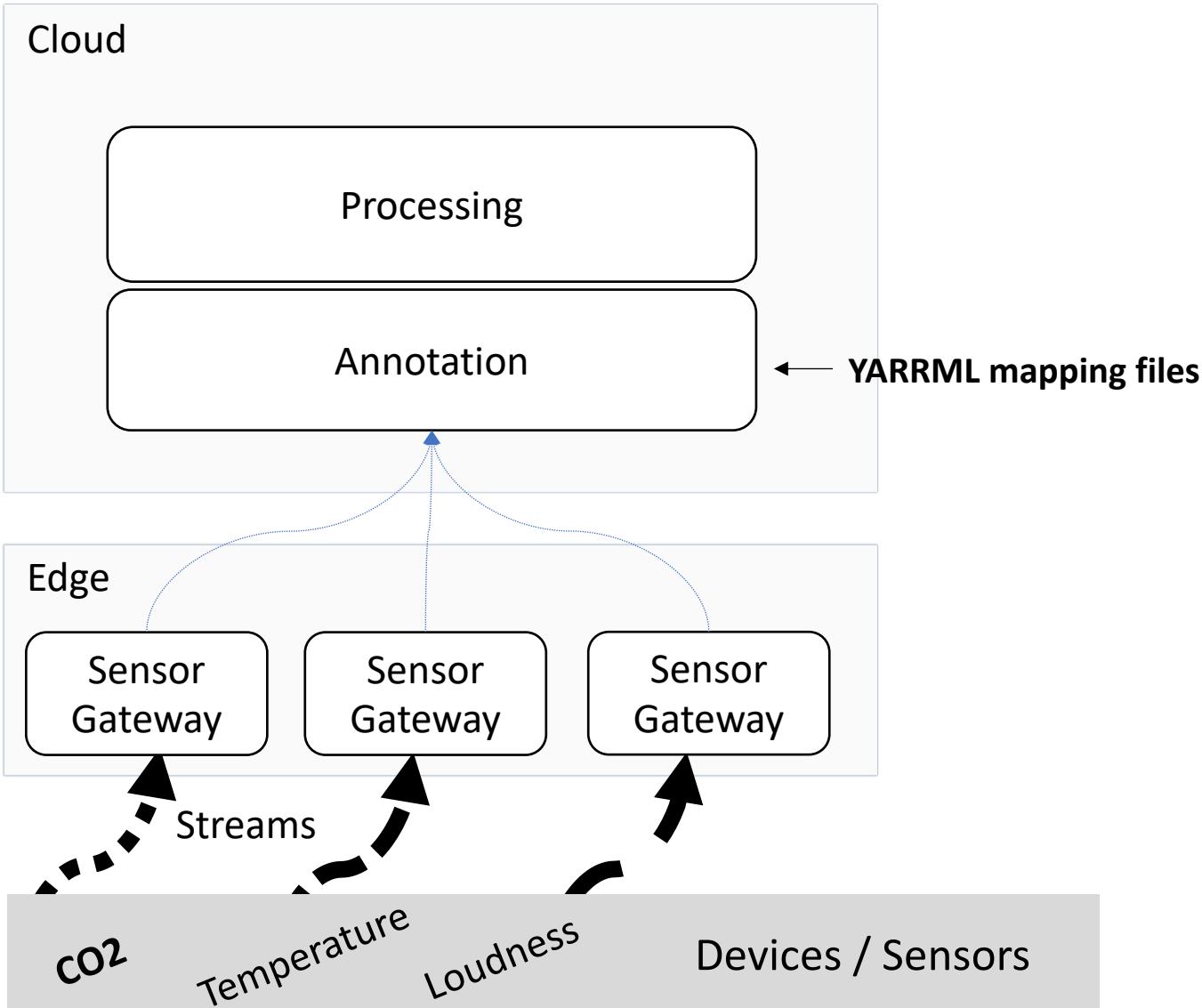


## Running Example



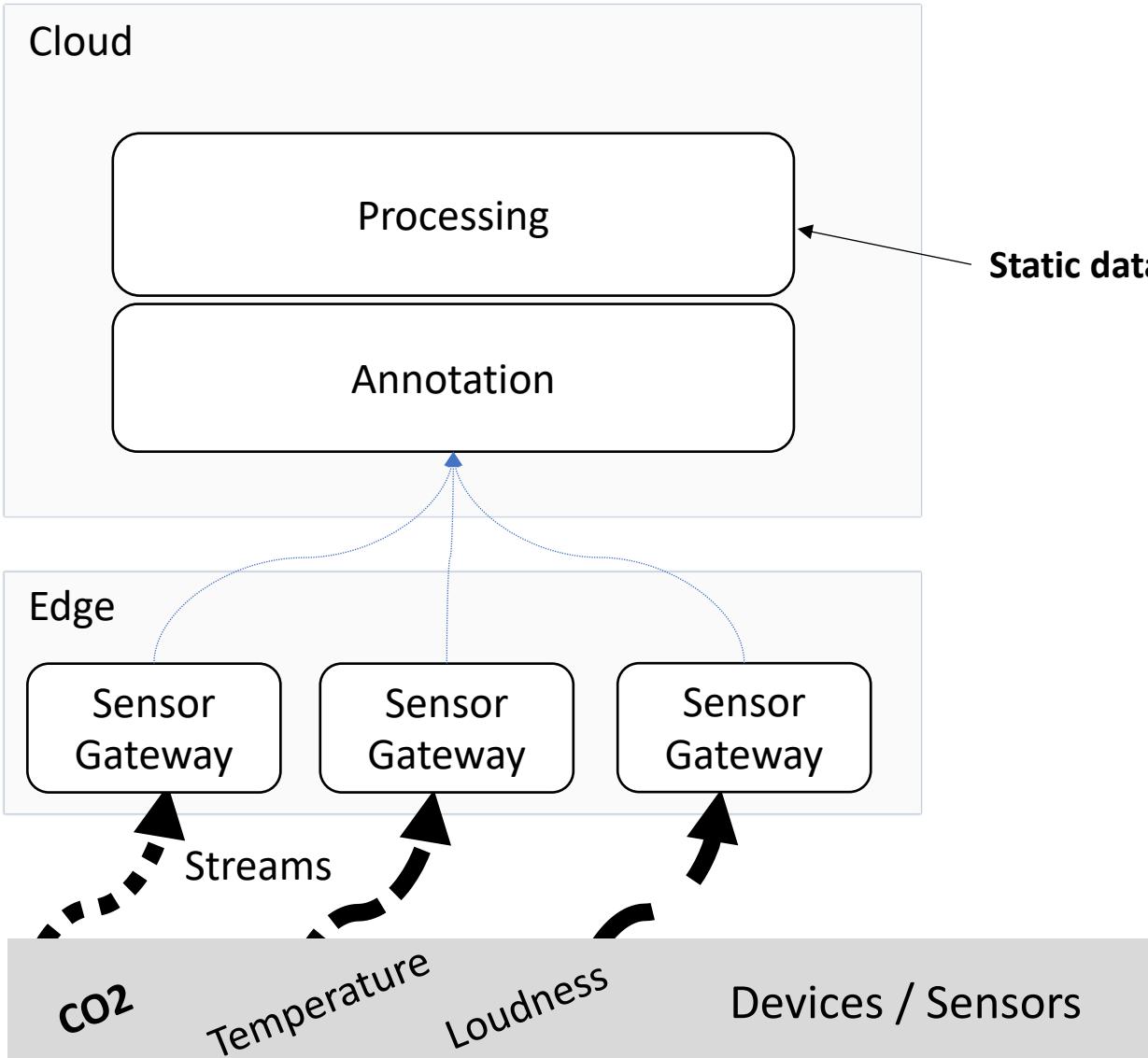
```
{ "sensorID": "1234",  
  "observationID": "5674",  
  "value": 765 }
```

## Running Example



```
mappings:  
sensor:  
sources:  
s: iot:${observationID}  
po:  
- [a, ssn:Observation]  
- [ssn:madeBySensor, iot:${sensorID}]  
- [sosa:hasSimpleResult, ${value}]
```

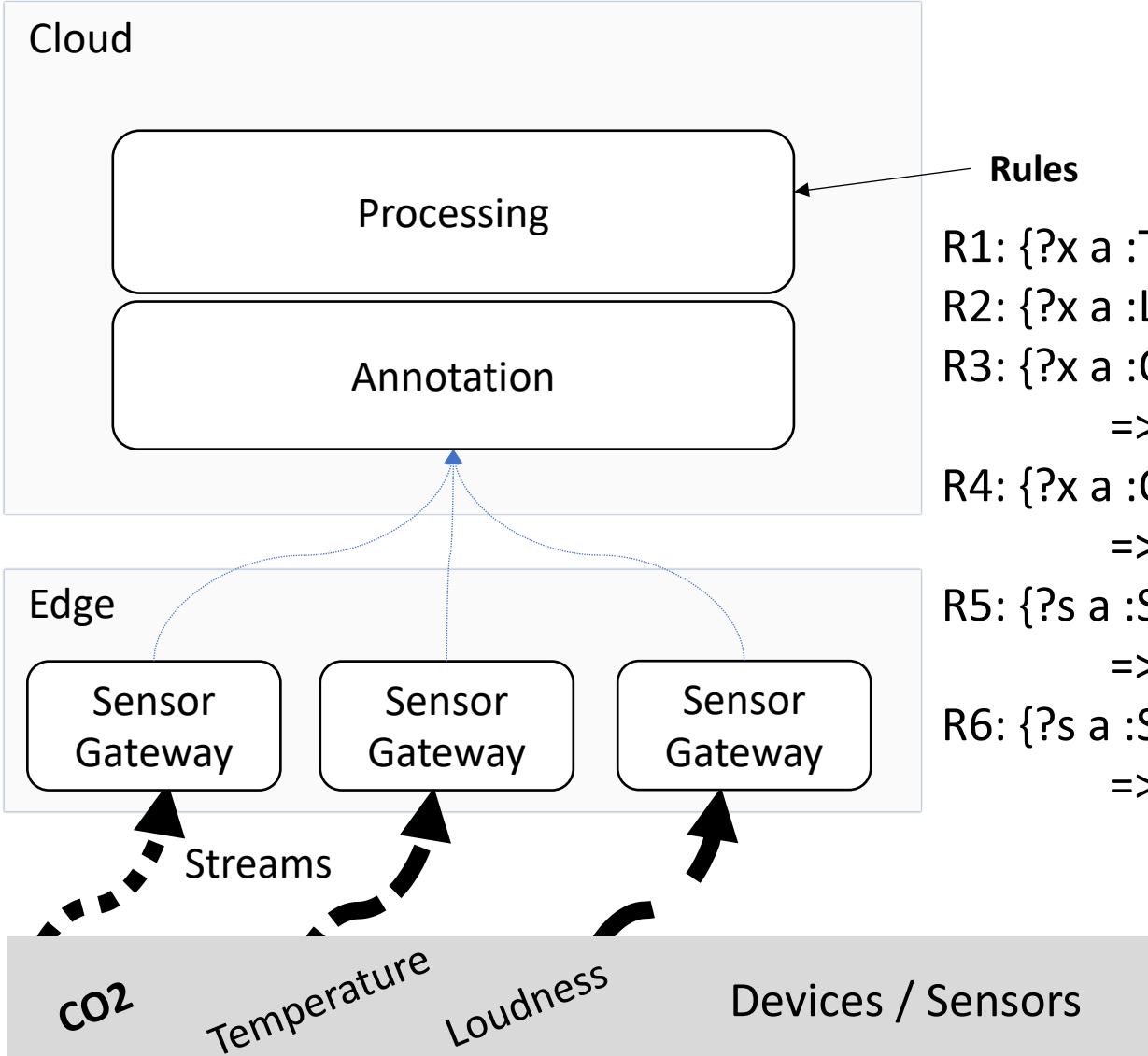
## Running Example



```
...
:sensorX a sosa:Sensor;
  sosa:observes :temp, :loudness, :co2, humidity;
  :hasLocation :officeY.
:officeY :connectedTo :officeZ, officeQ;
  :hasName "200.009"^^xsd:string.
```

...

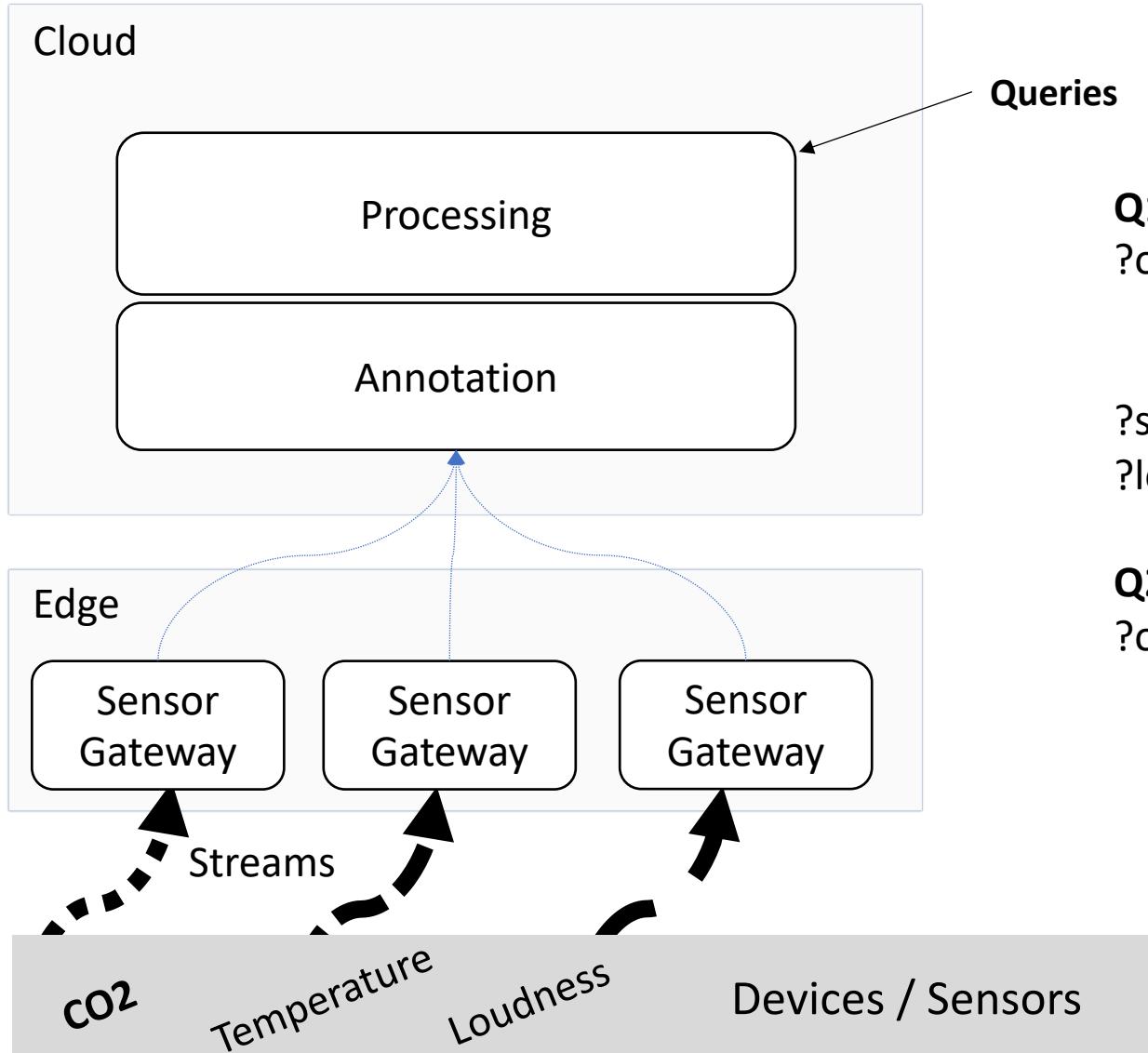
## Running Example



### Rules

- R1:  $\{?x \text{ a :TempObservation}\} \Rightarrow \{?x \text{ a :ComfortObservation}\}$
- R2:  $\{?x \text{ a :LoudnessObservation}\} \Rightarrow \{?x \text{ a :ComfortObservation}\}$
- R3:  $\{?x \text{ a :Observation}, ?x \text{ :madeBySensor ?s}, ?s \text{ a :TempSensor}\} \Rightarrow \{?x \text{ a :TempObservation}\}$
- R4:  $\{?x \text{ a :Observation}, ?x \text{ :madeBySensor ?s}, ?s \text{ a :LoudnessSensor}\} \Rightarrow \{?x \text{ a :LoudnessObservation}\}$
- R5:  $\{?s \text{ a :Sensor}, ?s \text{ :observes ?p}, ?p \text{ a :Temperature}\} \Rightarrow \{?s \text{ a :TempSensor}\}$
- R6:  $\{?s \text{ a :Sensor}, ?s \text{ :observes ?p}, ?p \text{ a :Loudness}\} \Rightarrow \{?s \text{ a :LoudnessSensor}\}$

## Running Example



**Q1:**

```
?obs a Observation;      // stream  
    hasSimpleResult ?value; // stream  
    madeBySensor ?sensor. // stream  
?sensor hasLocation ?loc. // static  
?loc hasName "200.009"   // static
```

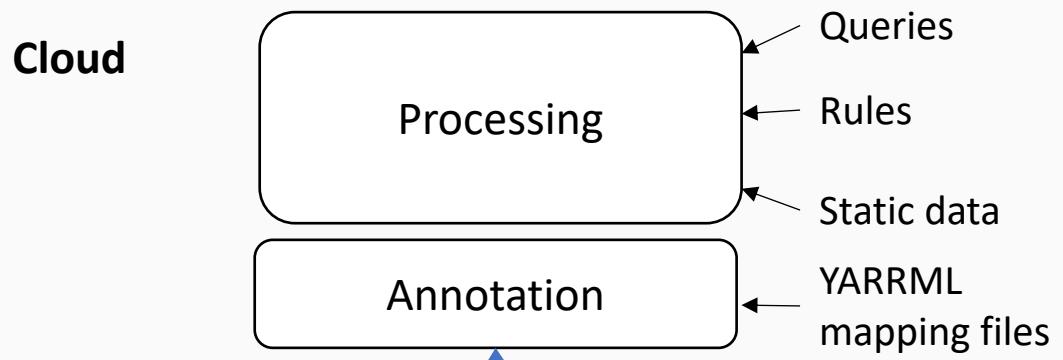
**Q2:**

```
?obs a ComfortObservation; // stream + domain knowledge  
    hasSimpleResult ?value. // stream
```

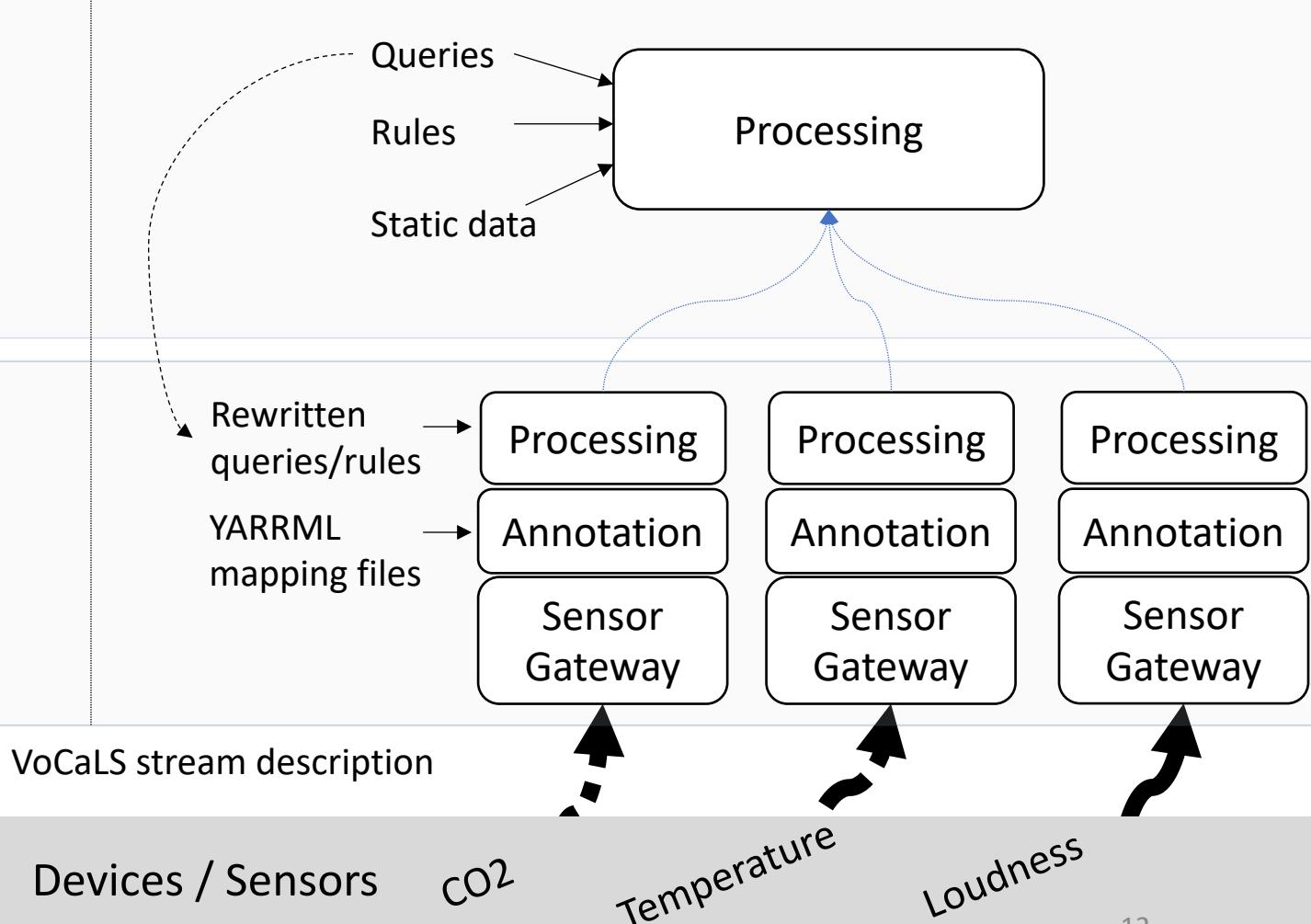
## How do we get there?



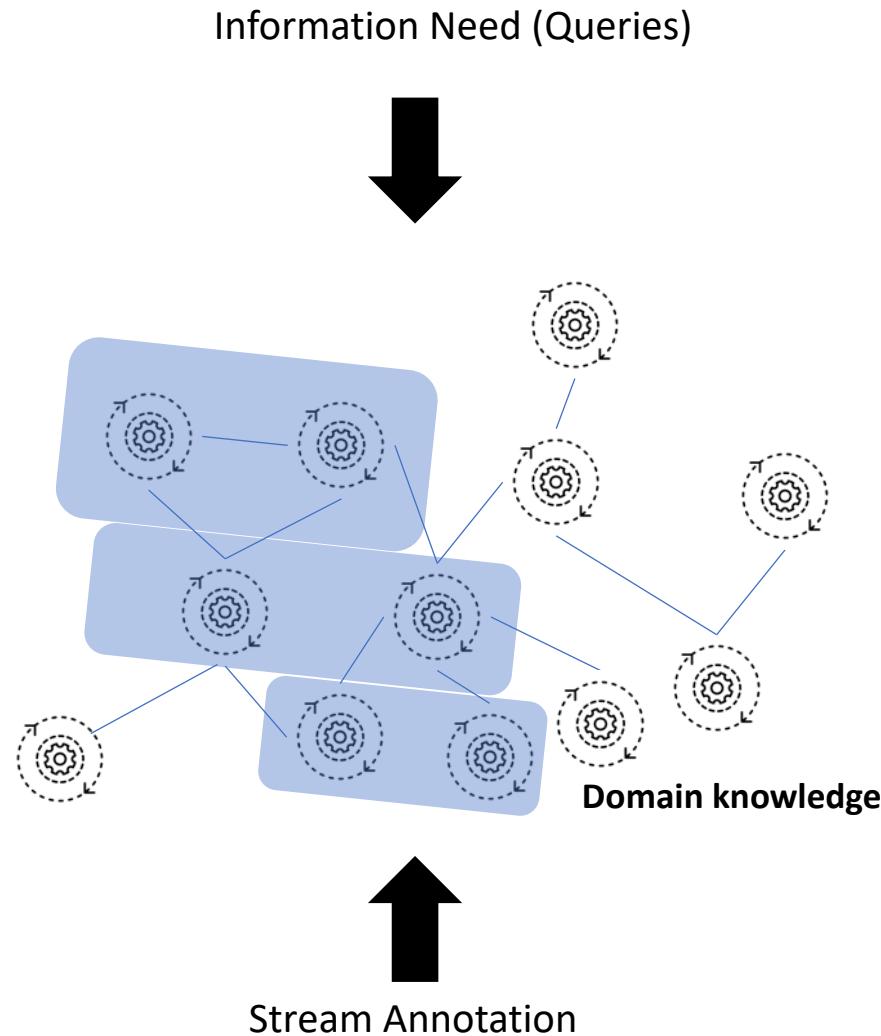
a) Cloud paradigm



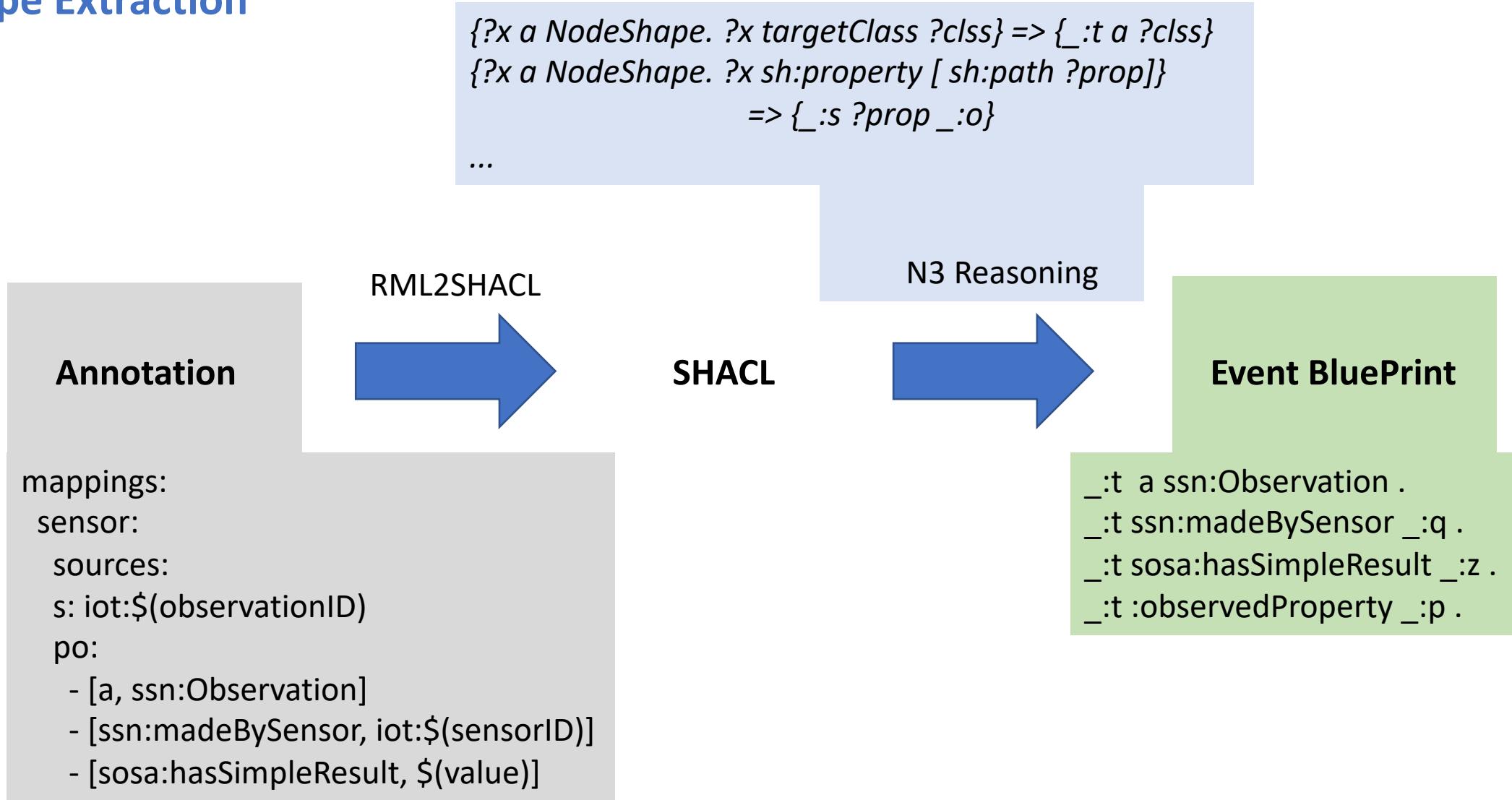
b) Edge paradigm



## How do we get there?



## Shape Extraction



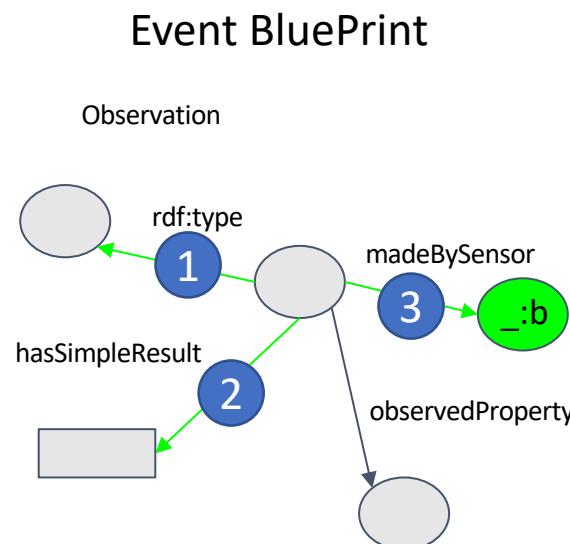
# Query Rewriting

- 1 ?obs a Observation;
- 2 hasSimpleResult ?value;
- 3 madeBySensor ?sensor.
- 4 ?sensor hasLocation ?loc.
- 5 ?loc hasName "200.009"

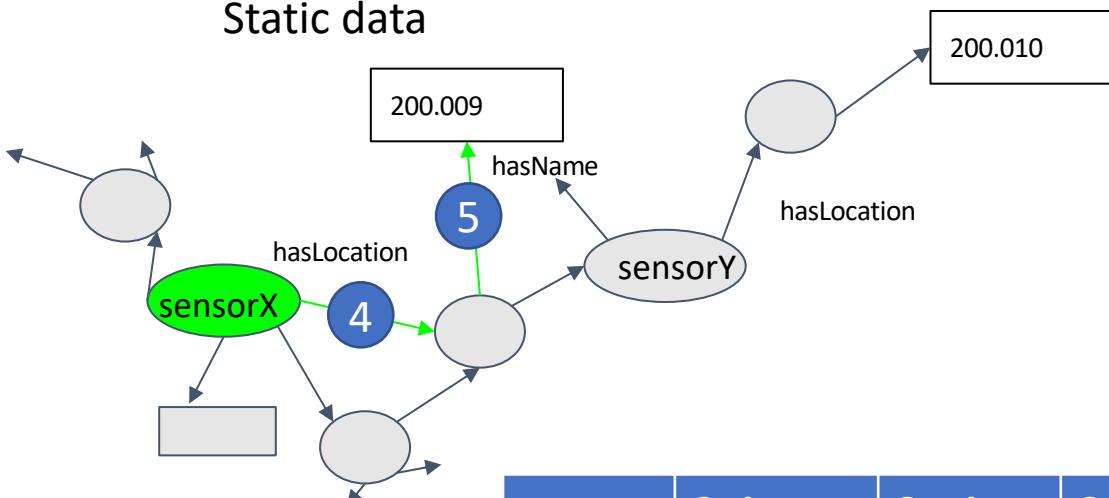


Rewritten Query:

- ```
?obs a Observation;          // stream
hasSimpleResult ?value;    // stream
madeBySensor :sensorX.   // stream
```



Static data



|        | ?obs  | ?value | ?sensor      | ?loc     |
|--------|-------|--------|--------------|----------|
| value  | _:t   | _:z    | :sensorX     | :officeY |
| origin | Event | Event  | Event/Static | static   |

# Reasoning-enabled Rewriting

## Query

```
?obs a :ComfortObservation;  
    :hasSimpleResult ?val.
```

## Rules

R1:  $\{?x \text{ a :TempObservation}\} \Rightarrow \{?x \text{ a :ComfortObservation}\}$

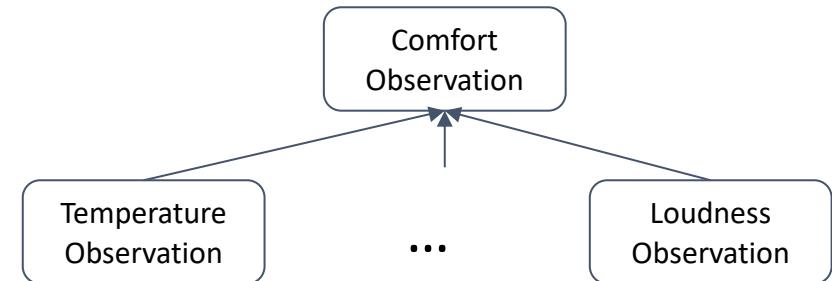
R2:  $\{?x \text{ a :LoudnessObservation}\} \Rightarrow \{?x \text{ a :ComfortObservation}\}$

R3:  $\{?x \text{ a :Observation}, ?x \text{ :madeBySensor ?s}, ?s \text{ a :TempSensor}\} \Rightarrow \{?x \text{ a :TempObservation}\}$

R4:  $\{?x \text{ a :Observation}, ?x \text{ :madeBySensor ?s}, ?s \text{ a :LoudnessSensor}\} \Rightarrow \{?x \text{ a :LoudnessObservation}\}$

R5:  $\{?s \text{ a :Sensor}, ?s \text{ :observes ?p}, ?p \text{ a :Temperature}\} \Rightarrow \{?s \text{ a :TempSensor}\}$

R6:  $\{?s \text{ a :Sensor}, ?s \text{ :observes ?p}, ?p \text{ a :Loudness}\} \Rightarrow \{?s \text{ a :LoudnessSensor}\}$



# Reasoning-enabled Rewriting

## Query

?obs a :ComfortObservation;  
  :hasSimpleResult ?val.

R5: {?s a :Sensor, ?s :observes ?p, ?p a :Temperature} => {?s a :TempSensor}

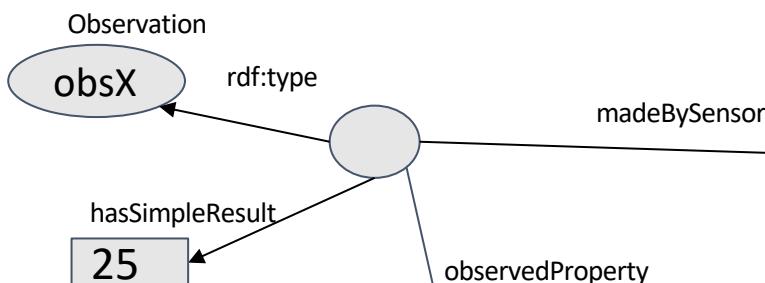
R3: {?x a :Observation, ?x :madeBySensor ?s, ?s a :TempSensor}  
=> {?x a :TempObservation}

R1: {?x a :TempObservation} => {?x a :ComfortObservation}

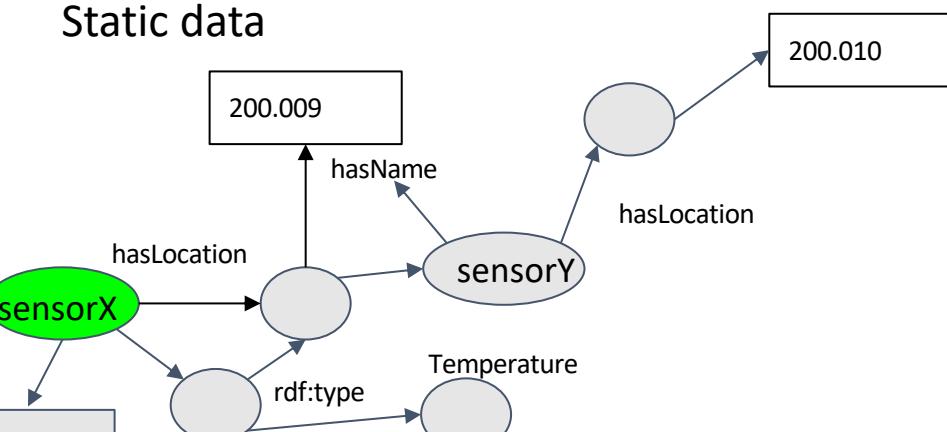
## Inferred:

:sensorX a :TempSensor  
  :obsX a :TempObservation  
  :obsX a :ComfortObservation

## Real Example Event



## Static data



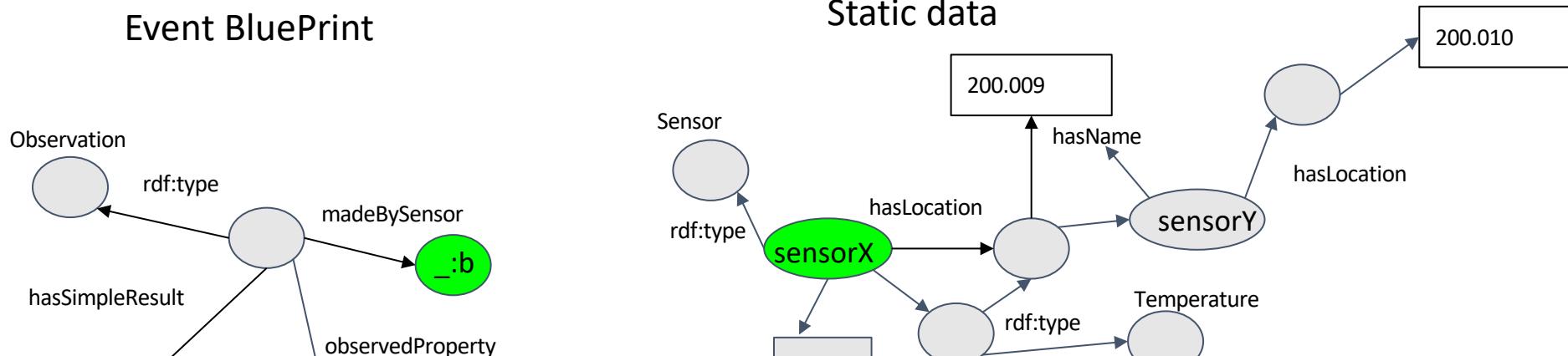
# Reasoning-enabled Rewriting

## Query

```
?obs a :ComfortObservation;  
    :hasSimpleResult ?val.
```

R1:  $\{?x \text{ a :TempObservation}\} \Rightarrow \{?x \text{ a :ComfortObservation}\}$   
R2:  $\{?x \text{ a :LoudnessObservation}\} \Rightarrow \{?x \text{ a :ComfortObservation}\}$

R3:  $\{?x \text{ a :Observation}, ?x \text{ :madeBySensor } ?s, ?s \text{ a :TempSensor}\} \Rightarrow \{?x \text{ a :TempObservation}\}$   
R4:  $\{?x \text{ a :Observation}, ?x \text{ :madeBySensor } ?s, ?s \text{ a :LoudnessSensor}\} \Rightarrow \{?x \text{ a :LoudnessObservation}\}$   
R5:  $\{?s \text{ a :Sensor}, ?s \text{ :observes } ?p, ?p \text{ a :Temperature}\} \Rightarrow \{?s \text{ a :TempSensor}\}$   
R6:  $\{?s \text{ a :Sensor}, ?s \text{ :observes } ?p, ?p \text{ a :Loudness}\} \Rightarrow \{?s \text{ a :LoudnessSensor}\}$

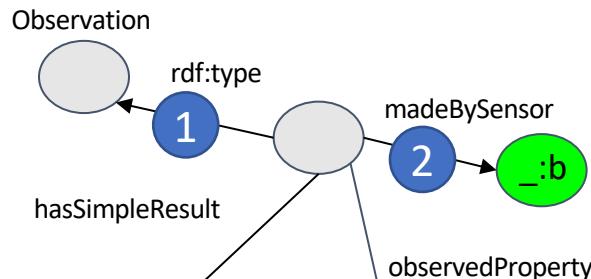


# Reasoning-enabled Rewriting

## Query

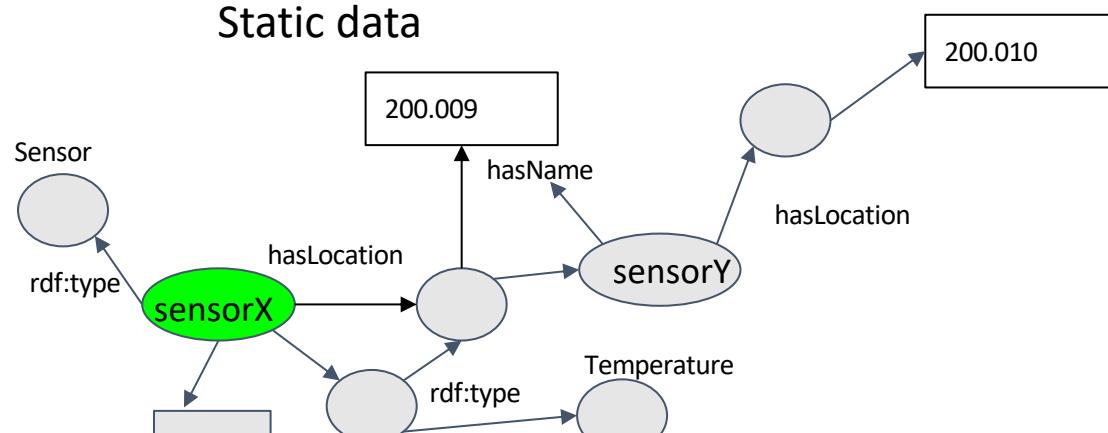
```
?obs a :ComfortObservation;  
    :hasSimpleResult ?val.
```

## Event Blueprint



- R1:  $\{?x \text{ a :TempObservation}\} \Rightarrow \{?x \text{ a :ComfortObservation}\}$
- R2:  $\{?x \text{ a :LoudnessObservation}\} \Rightarrow \{?x \text{ a :ComfortObservation}\}$
- R3:  $\{?x \text{ a :Observation}, ?x \text{ :madeBySensor } ?s, ?s \text{ a :TempSensor}\} \Rightarrow \{?x \text{ a :TempObservation}\}$
- R4:  $\{?x \text{ a :Observation}, ?x \text{ :madeBySensor } ?s, ?s \text{ a :LoudnessSensor}\} \Rightarrow \{?x \text{ a :LoudnessObservation}\}$
- R5:  $\{?s \text{ a :Sensor}, ?s \text{ :observes } ?p, ?p \text{ a :Temperature}\} \Rightarrow \{?s \text{ a :TempSensor}\}$
- R6:  $\{?s \text{ a :Sensor}, ?s \text{ :observes } ?p, ?p \text{ a :Loudness}\} \Rightarrow \{?s \text{ a :LoudnessSensor}\}$

## Static data

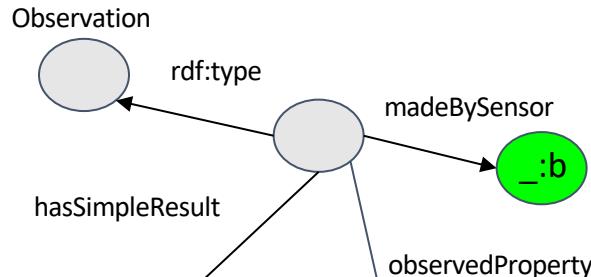


# Reasoning-enabled Rewriting

## Query

?obs a :ComfortObservation;  
:hasSimpleResult ?val.

## Event Blueprint



R1:  $\{?x \text{ a :TempObservation}\} \Rightarrow \{?x \text{ a :ComfortObservation}\}$   
R2:  $\{?x \text{ a :LoudnessObservation}\} \Rightarrow \{?x \text{ a :ComfortObservation}\}$

R3:  $\{?x \text{ a :Observation}, ?x \text{ :madeBySensor } ?s, ?s \text{ a :TempSensor}\}$   
 $\Rightarrow \{?x \text{ a :TempObservation}\}$

R4:  $\{?x \text{ a :Observation}, ?x \text{ :madeBySensor } ?s, ?s \text{ a :LoudnessSensor}\}$   
 $\Rightarrow \{?x \text{ a :LoudnessObservation}\}$

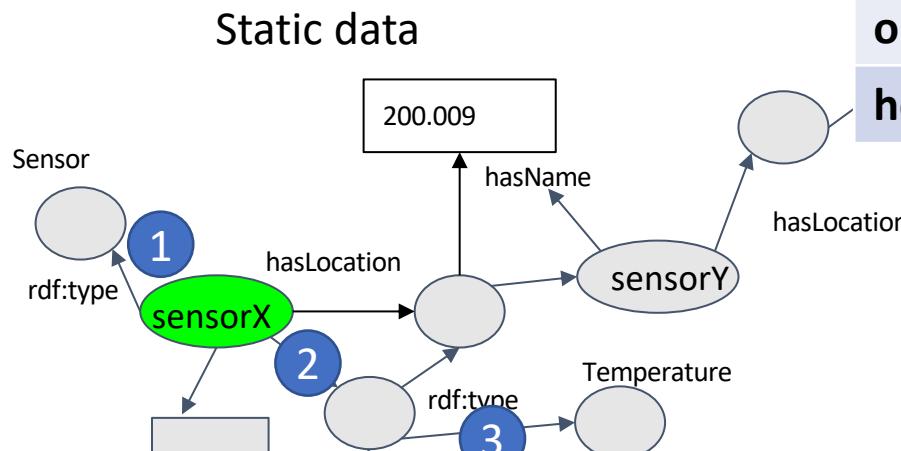
1

2

3

R5:  $\{?s \text{ a :Sensor, ?s :observes } ?p, ?p \text{ a :Temperature}\} \Rightarrow \{?s \text{ a :TempSensor}\}$   
R6:  $\{?s \text{ a :Sensor, ?s :observes } ?p, ?p \text{ a :Loudness}\} \Rightarrow \{?s \text{ a :LoudnessSensor}\}$

|        | ?s       | ?p     |
|--------|----------|--------|
| value  | :sensorX | :propY |
| origin | Static   | Static |
| head   | Yes      | No     |

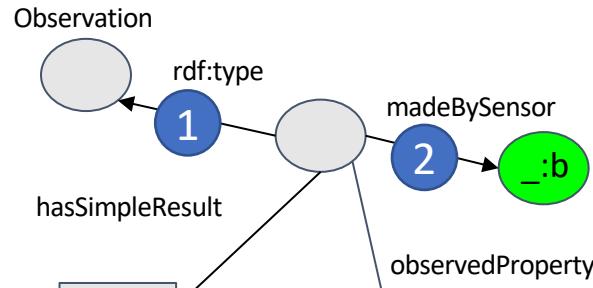


# Reasoning-enabled Rewriting

## Query

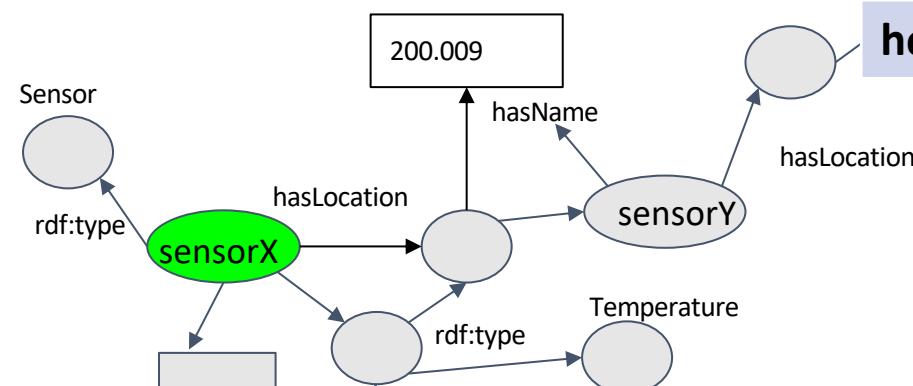
?obs a :ComfortObservation;  
:hasSimpleResult ?val.

## Event Blueprint



- R1:  $\{?x \text{ a :TempObservation}\} \Rightarrow \{?x \text{ a :ComfortObservation}\}$   
 R2:  $\{?x \text{ a :LoudnessObservation}\} \Rightarrow \{?x \text{ a :ComfortObservation}\}$
- 1                                    2
- R3':  $\{?x \text{ a :Observation, ?x :madeBySensor :sensorX}\}$   
 $\Rightarrow \{?x \text{ a :TempObservation}\}$
- R4:  $\{?x \text{ a :Observation, ?x :madeBySensor ?s, ?s a :LoudnessSensor}\}$   
 $\Rightarrow \{?x \text{ a :LoudnessObservation}\}$
- R6:  $\{?s \text{ a :Sensor, ?s observes ?p, ?p a :Loudness}\} \Rightarrow \{?s \text{ a :LoudnessSensor}\}$

## Static data



|        | ?x     |
|--------|--------|
| value  | _:t    |
| origin | Stream |
| head   | Yes    |

# Reasoning-enabled Rewriting

## Query

```
?obs a :ComfortObservation;  
    :hasSimpleResult ?val.
```

## Identified Rules

R1:  $\{?x \text{ a :TempObservation}\} \Rightarrow \{?x \text{ a :ComfortObservation}\}$

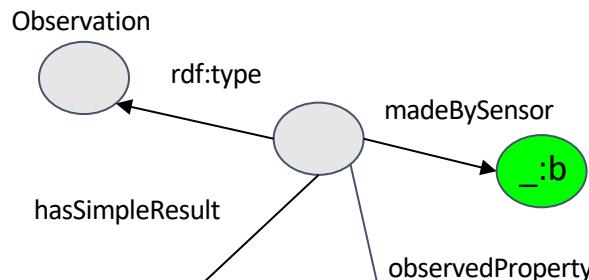
R2:  $\{?x \text{ a :LoudnessObservation}\} \Rightarrow \{?x \text{ a :ComfortObservation}\}$

R3':  $\{?x \text{ a :Observation}, ?x \text{ :madeBySensor :sensorX}\} \Rightarrow \{?x \text{ a :TempObservation}\}$

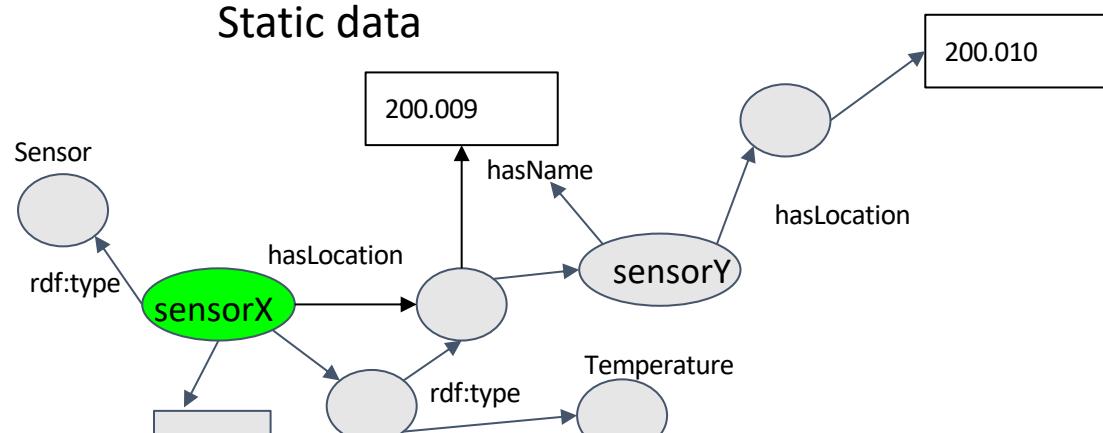
R4:  $\{?x \text{ a :Observation}, ?x \text{ :madeBySensor ?s}, ?s \text{ a :LoudnessSensor}\} \Rightarrow \{?x \text{ a :LoudnessObservation}\}$

R6:  $\{?s \text{ a :Sensor}, ?s \text{ :observes ?p}, ?p \text{ a :Loudness}\} \Rightarrow \{?s \text{ a :LoudnessSensor}\}$

## Event Blueprint



## Static data



# Reasoning-enabled Rewriting

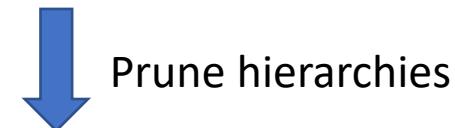
## Query

```
?obs a :ComfortObservation;  
    :hasSimpleResult ?val.
```

## Identified Rules

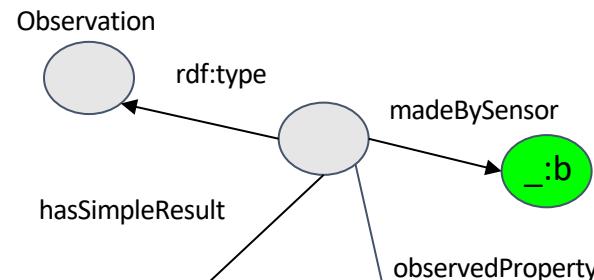
R1:  $\{?x \text{ a } \text{:TempObservation}\} \Rightarrow \{?x \text{ a } \text{:ComfortObservation}\}$

R3':  $\{?x \text{ a } \text{:Observation}, ?x \text{ :madeBySensor } \text{:sensorX}\}$   
 $\Rightarrow \{?x \text{ a } \text{:TempObservation}\}$

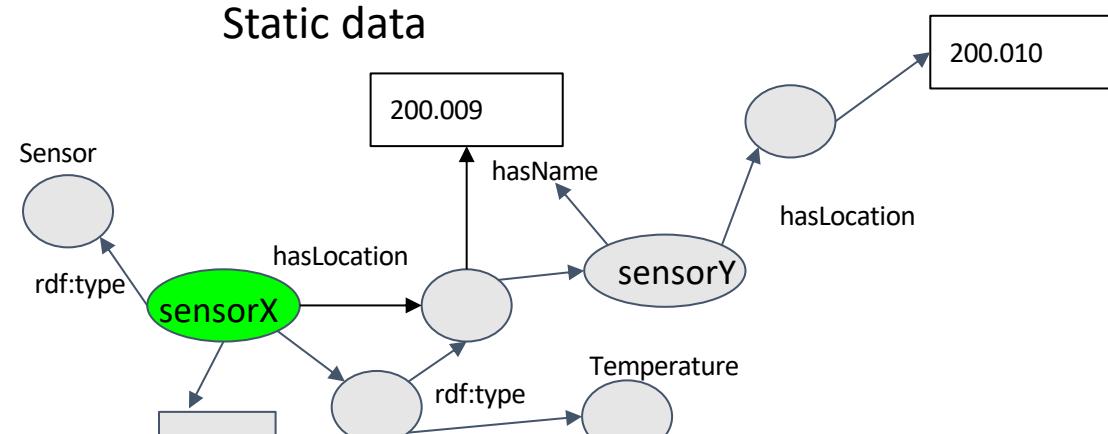


R3'':  $\{?x \text{ a } \text{:Observation}, ?x \text{ :madeBySensor } \text{:sensorX}\}$   
 $\Rightarrow \{?x \text{ a } \text{:ComfortObservation}\}$

## Event Blueprint



## Static data



# Reasoning-enabled Rewriting

## Query

```
?obs a :ComfortObservation;  
    :hasSimpleResult ?val.
```

## Rewritten Query

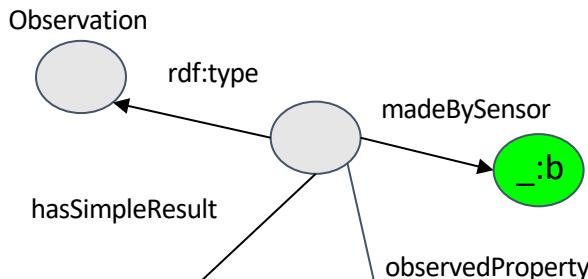
```
?obs a :Observation;  
    :madeBySensor :sensorX;  
    :hasSimpleResult ?val.
```



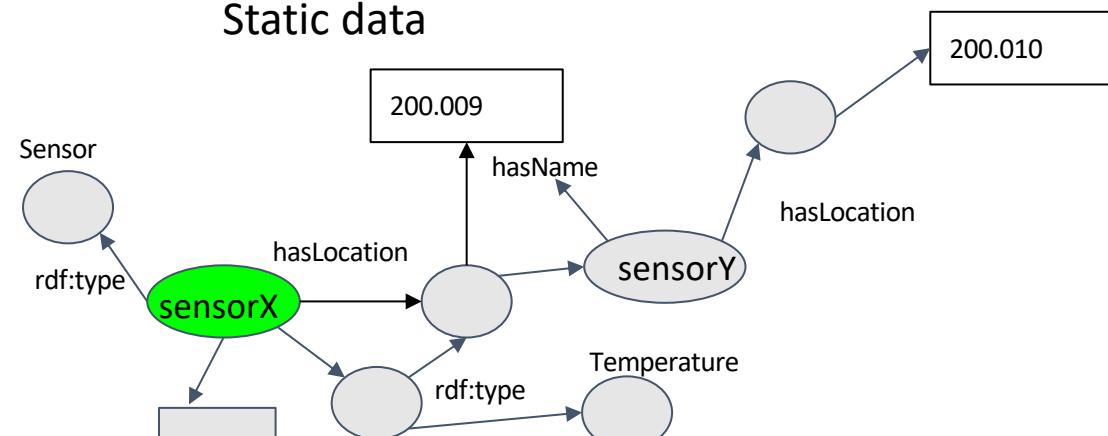
## Optimized Rules

```
R3'': {?x a :Observation, ?x :madeBySensor :sensorX}  
=> {?x a :ComfortObservation}
```

## Event Blueprint



## Static data



## Implementation

# RoXi

SHARQ Github

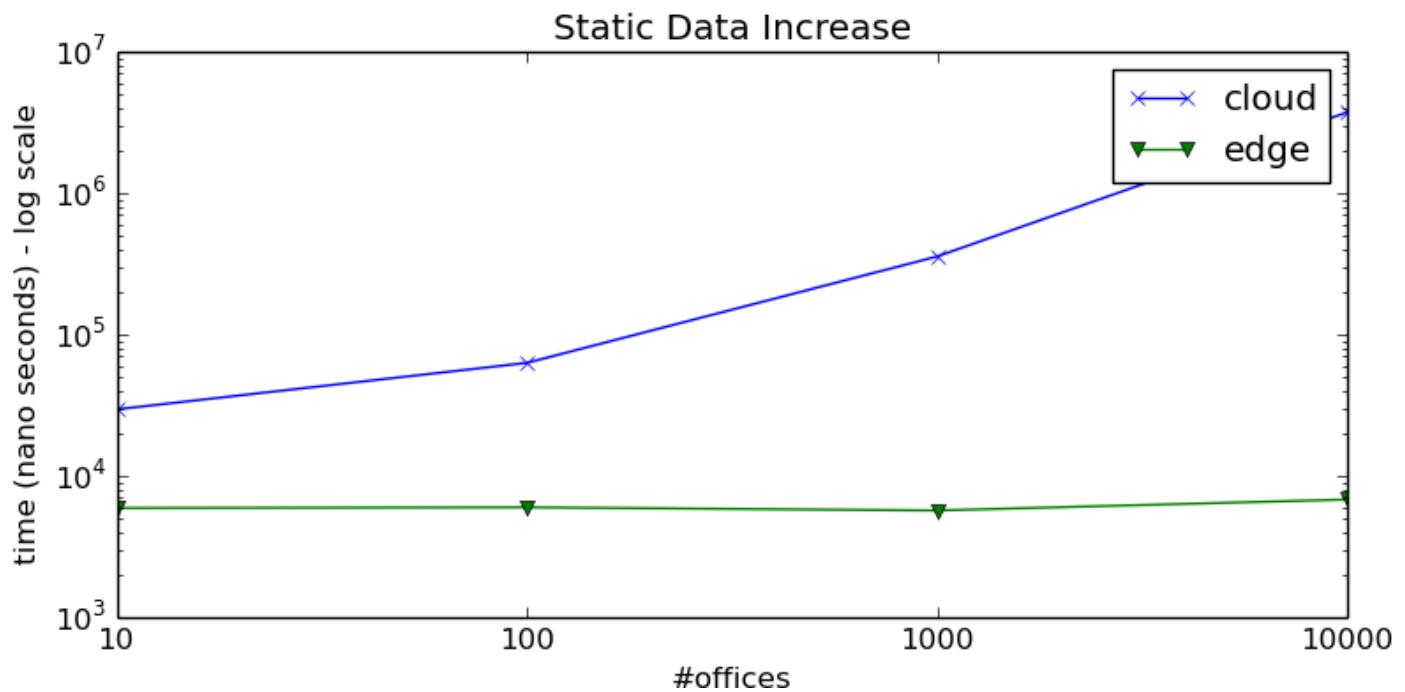


*Come check out the poster during  
the poster & demo session!*

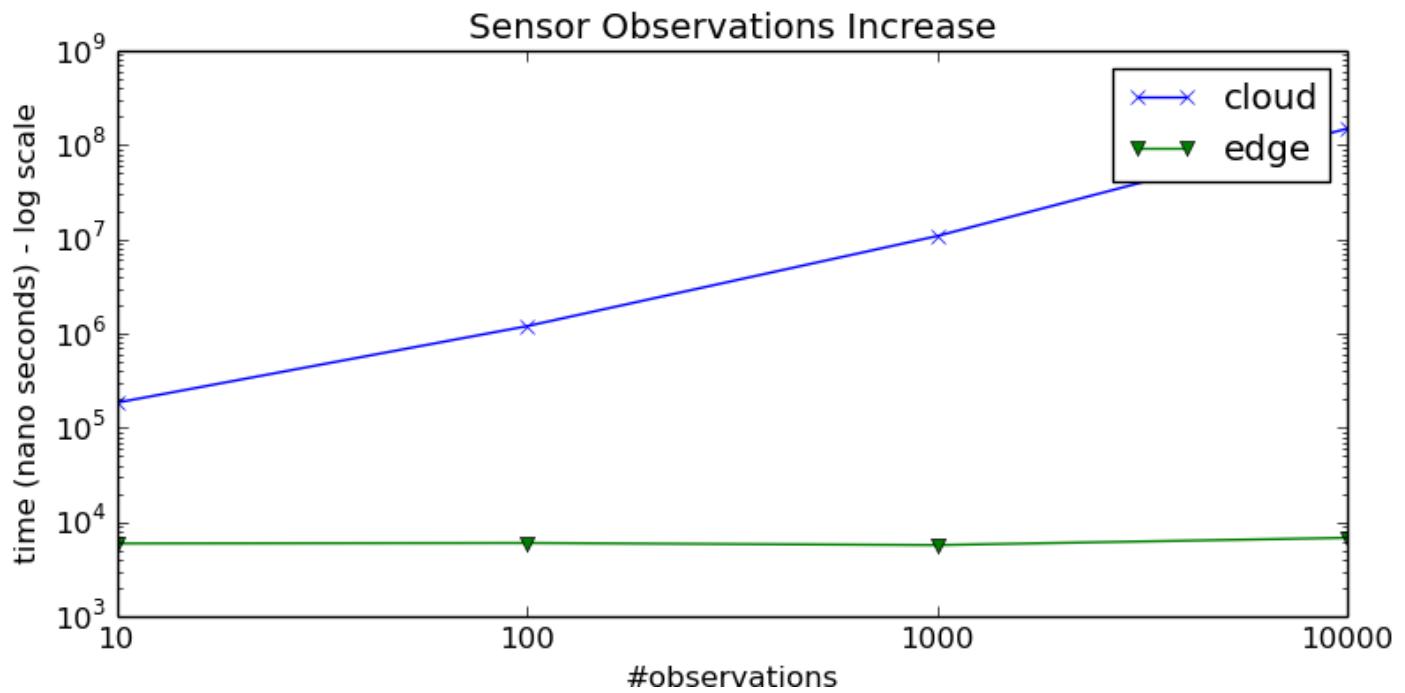
RoXi Github



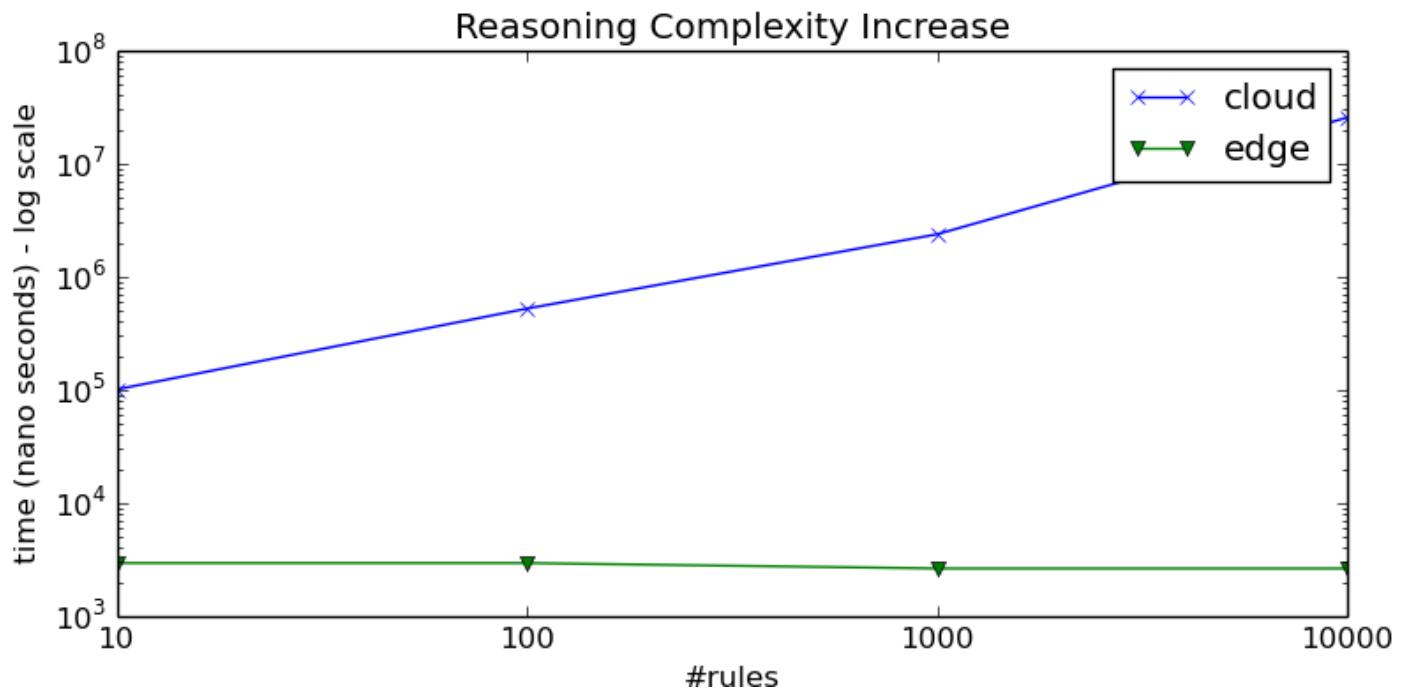
## Evaluation



## Evaluation



## Evaluation



# Conclusion

Top-down and bottom-up optimization to rewrite rules/queries  
in order to enable efficient and privacy-aware edge analytics

