

# Model-Based Systems Engineering → Semantics + Data Mining

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# Overview

1 Systems Engineering Drivers

2 Model-based Systems Engineering

3 Ontologies and Ontology-Enabled Computing

4 Ontology-Enabled Computing at JPL (2000-2006)

5 The Data-Ontology-Rule Footing

6 Case Studies: Buildings and Precision Medicine

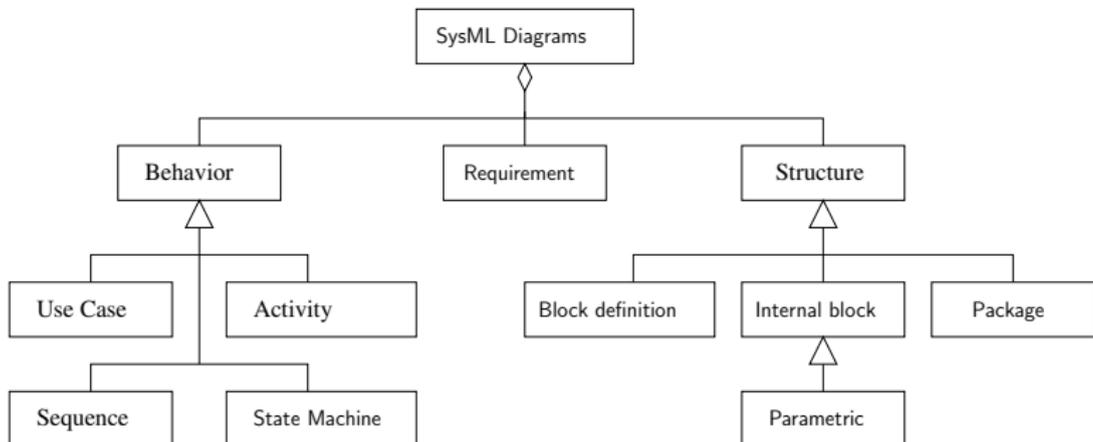
7 Multi-Domain Semantic Modeling + Data Mining

**Part 2**

# Model-based Systems Engineering

# System Modeling Techniques

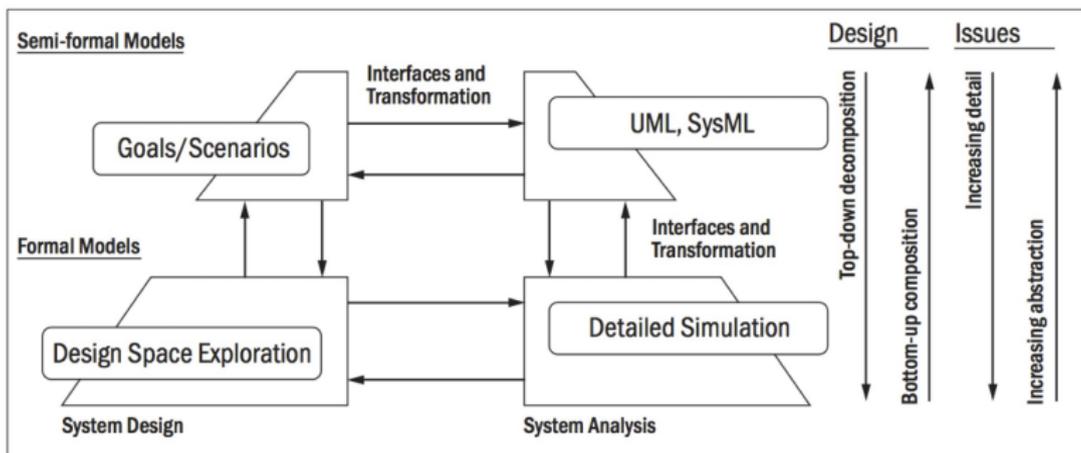
Taxonomy of diagrams in SysML:



Pillars of SysML: Structure, Behavior, Requirements, and Parametric Diagrams.

# System Modeling Techniques

Use **multi-scale approaches** to system modeling:



- Semi-Formal Models: View the complete system (efficiency).
- Formal Models: Detailed view of the actual system (accuracy).



# Ontologies and Ontology-Enabled Computing

# Definition of an Ontology

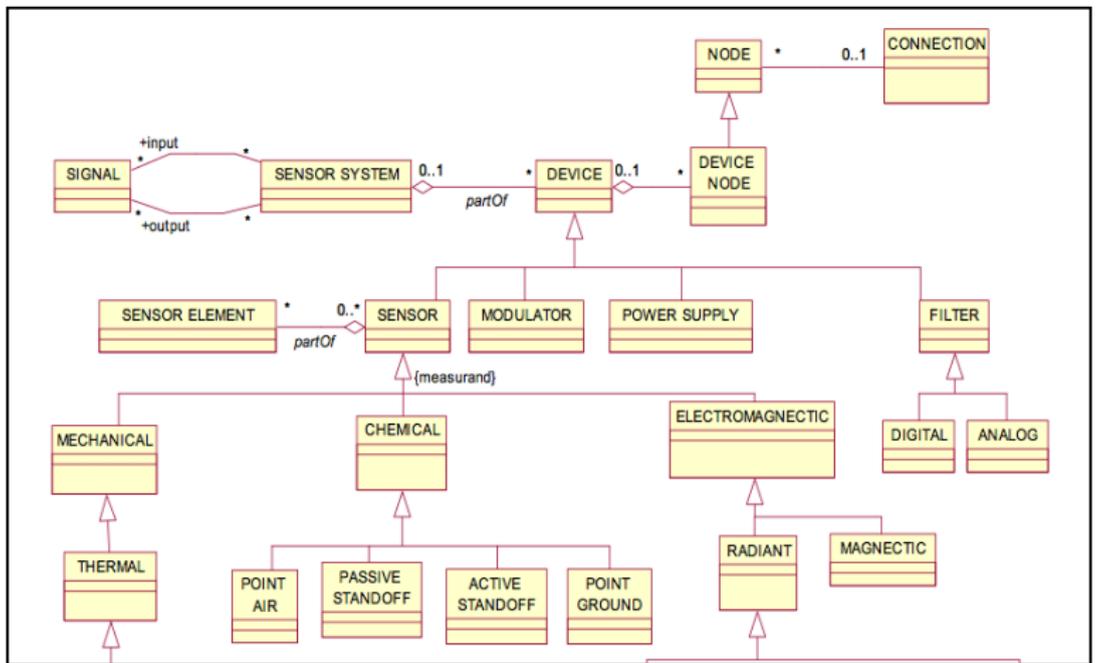
## Definition (Ontology)

An ontology is a set of **knowledge terms**, including the vocabulary, the semantic interconnections, and some **simple rules** of **inference** and **logic** for some particular topic or domain.

Three Goals:

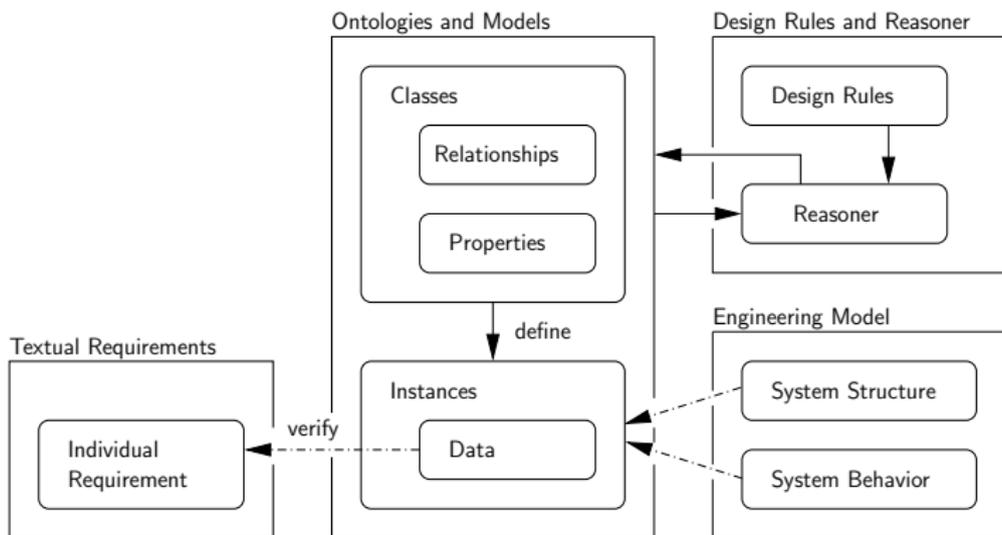
- Provide a **semantic representation** of each entity and its relationships to other entities;
- Provide **constraints and rules** that permit **reasoning within the ontology**;
- Describe behavior associated with stated or **inferred facts**.

# High-Level Sensor Ontology



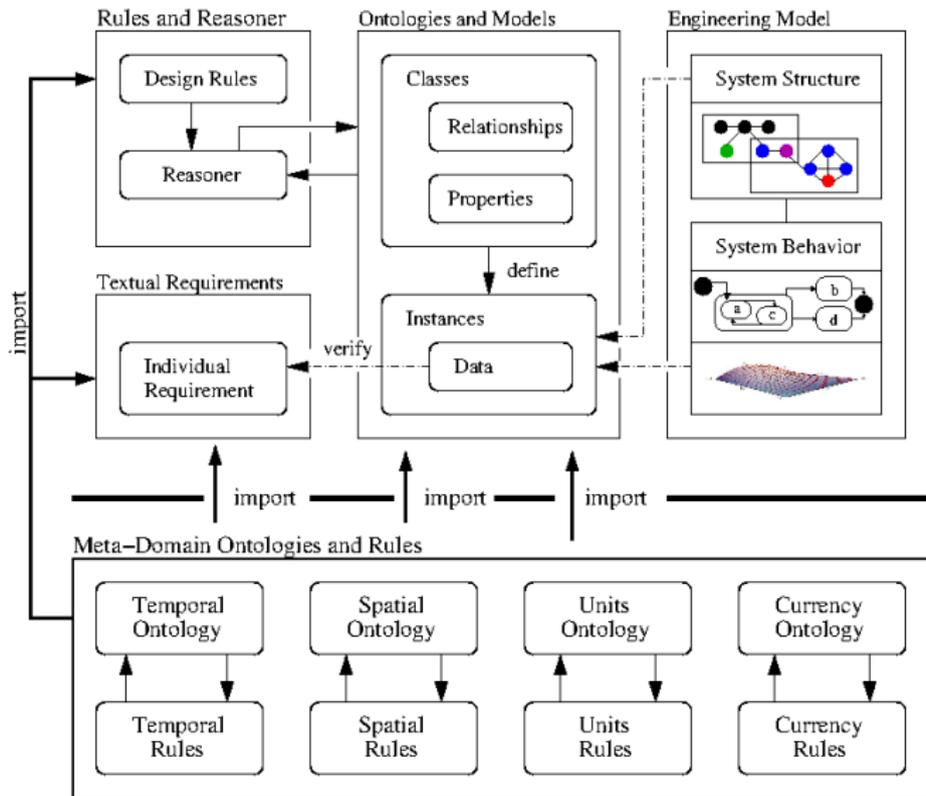
# Ontologies and Rule Sets

Framework for Ontology-Enabled Design Assessment (Version 1):



Source: Parastoo Delgoshaei, MSSE Student, 2010-2012. Ph.D. Student in Civil Systems, 2013-2017.

# Framework for Model-Based Design



# Ontologies and Rule Sets

## Benefits of Rule-Based Approaches to Problem Solving:

- Rules that represent policies are easily communicated and understood,
- Rules retain a higher level of independence than logic embedded in systems,
- Rules separate knowledge from its implementation logic, and
- Rules can be changed without changing source code or underlying model.

### Benefits of Rules

A rule-based approach to problem solving is particularly beneficial when the **application logic** is **dynamic**.

# Semantic Web Support for Ontologies

## Goals of the WWW

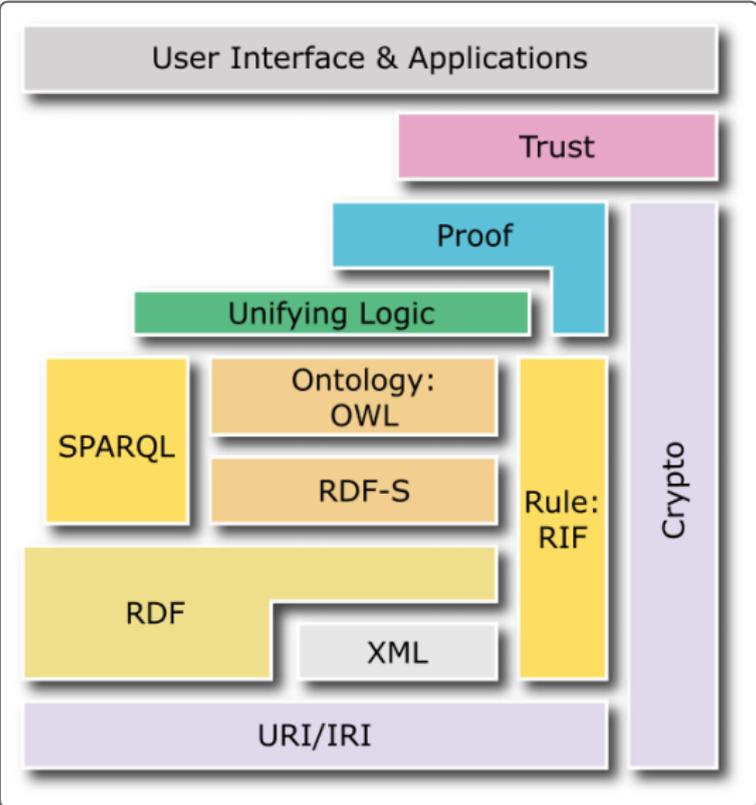
In his original vision for the World Wide Web, Tim Berners-Lee described two key objectives:

- To make the Web a **collaborative medium**, and
- To make the Web **understandable** and, thus, **processable by machines**.

## Goals of the Semantic Web

Give information a **well-defined meaning**, thereby creating a pathway for **machine-to-machine communication** and **automated services** based on descriptions of semantics.

# Semantic Web Support for Ontologies

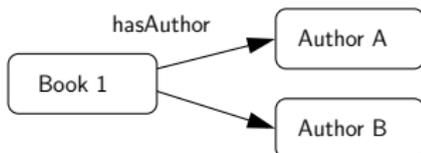


# Semantic Web Support for Ontologies

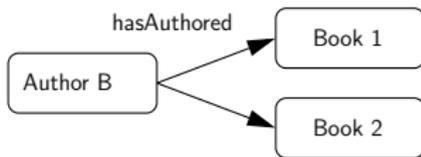
Process for merging trees of data into graphs:

Modeling Books and Authors  $\xrightarrow{\text{integrate sources}}$  Integrated View of Data Sources

Viewpoint 1: A Book has Authors

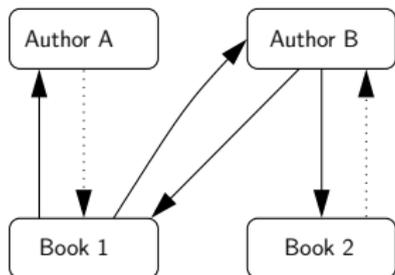


Viewpoint 2: Authors write Books



source 1

source 2



Note: dashed arrows represent relations that can be inferred.

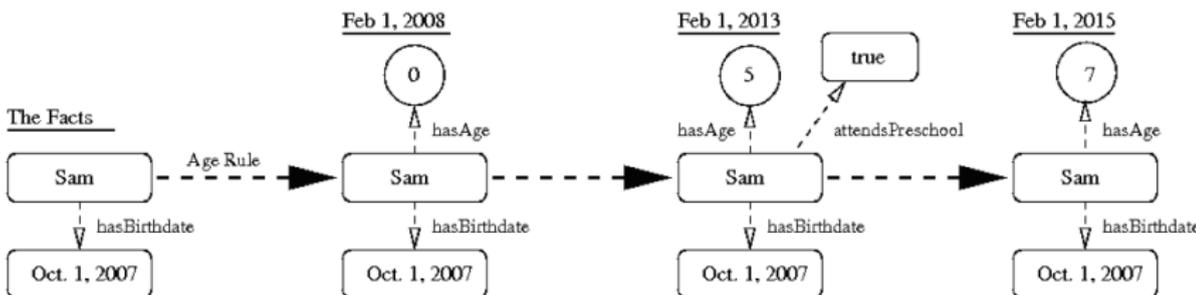
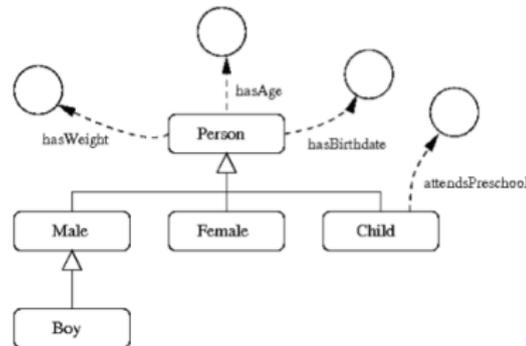
# Example 1. A Simple Family Model

Fact. Sam is a boy. He was born October 1, 2007.

Rule 1: For a given date of birth, a built-in function `getAge()` computes a person's age.

Rule 2: A child is a person with age < 18.

Rule 3: Children who are age 5 attend preschool.



# Example 1. Family Semantic Model

## Create Family Individuals:

```
mark = male.createIndividual(ns + "Mark");
sam = boy.createIndividual(ns + "Sam");
nina = female.createIndividual(ns + "Nina");

// Statements "Sam has birthdate 2007-10-01" and "Sam has weight 35"

Literal dob01 = model.createTypedLiteral("2007-10-01", ...XSDdate );
Statement samdob = model.createStatement( sam, hasDOB, dob01 );
model.add ( samdob );

Literal weight35 = model.createTypedLiteral("35.0", ...XSDdouble );
Statement samw35 = model.createStatement( sam, hasWeight, weight35 );
model.add ( samw35 );
```

## Facts in the Simple Family Model:

```
<rdf:Description rdf:about="http://austin.org/family#Sam">
  <j:hasWeight rdf:datatype="http://www.w3.org/2001/XMLSchema#double"> 35.0 </j:hasWeight>
  <j:hasBirthDate rdf:datatype="http://www.w3.org/2001/XMLSchema#date"> 2007-10-01 </j:hasBirthDate>
  <rdf:type rdf:resource="http://austin.org/family#Boy"/>
</rdf:Description>
.....
```

# Example 1. Family Rules (Apache Jena Rules)

## Apache Jena Rules:

```
@prefix af: <http://austin.org/family#>.
@prefix rdf: <http://www.w3.org/1999/02/22-rdf-syntax-ns#>.

// Rule 01: Propagate class hierarchy relationships ....

[ rdfs01: (?x rdfs:subClassOf ?y), notEqual(?x,?y) ->
  [ (?a rdf:type ?y) <- (?a rdf:type ?x) ] ]

// Rule 02: Identify a person who is also a child ...

[ Child: (?x rdf:type af:Person) (?x af:hasAge ?y) lessThan(?y, 18) ->
  (?x rdf:type af:Child) ]

// Rule 03: See if a child attends preschool ...

[ Preschool: (?x rdf:type af:Child) (?x af:hasAge ?y)
  equal(?y, 5) -> (?x af:attendsPreSchool af:True) ]

// Rule 04: Compute and store the age of a person ....

[ GetAge: (?x rdf:type af:Person) (?x af:hasBirthDate ?y)
  getAge(?y,?z) -> (?x af:hasAge ?z) ]
```

# Example 1. Query Transformed Semantic Model

Statements: Sam ...

```
=====
Statement[1] Subject : http://austin.org/family#Sam
               Predicate: http://austin.org/family#hasAge
               Object   : "5.0~http://www.w3.org/2001/... #double"

Statement[2] Subject : http://austin.org/family#Sam
               Predicate: http://www.w3.org/1999/02/... #type
               Object   : http://austin.org/family#Child

Statement[3] Subject : http://austin.org/family#Sam
               Predicate: http://austin.org/family#attendsPreSchool
               Object   : http://austin.org/family#True

Statement[4] Subject : http://austin.org/family#Sam
               Predicate: http://austin.org/family#hasWeight
               Object   : "35.0~http://www.w3.org/2001/... #double"

Statement[5] Subject : http://austin.org/family#Sam
               Predicate: http://austin.org/family#hasBirthDate
               Object   : "2007-10-01~http://www.w3.org/2001/... #date"

Statement[6] Subject : http://austin.org/family#Sam
               Predicate: http://www.w3.org/1999/02/... #type
               Object   : http://austin.org/family#Boy
=====
```

# Distributed System Behavior Modeling

Small Networks of Semantic Graphs  
Employ Software Design Patterns

## MSSE/Ph.D. (Civil Systems) Students

- 1 Parastoo Delgoshaei (2013-2017);
- 2 Maria Coelho (2015-present).

# Motivation

**ENCE 688P:** Behaviors in the built environment are distributed and concurrent:

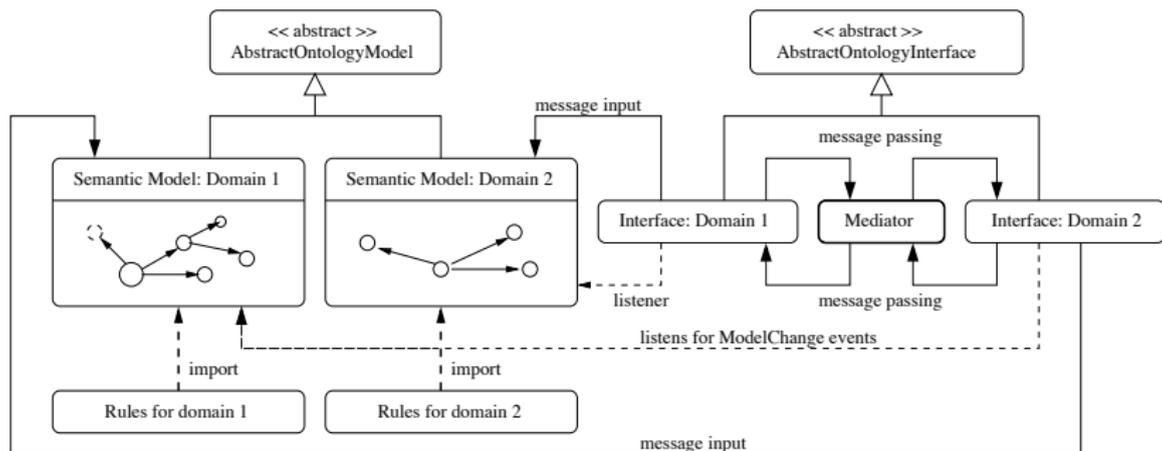
- Cities are **system of systems**.
- City subsystems may have a preference to operating as independently as possible from the other subsystems.
- Strategic **collaboration** among subsystems is often **needed** to either **avoid cascading failures** across systems and/or **recover from a loss of functionality**.

Systems-of-systems need not be complicated:

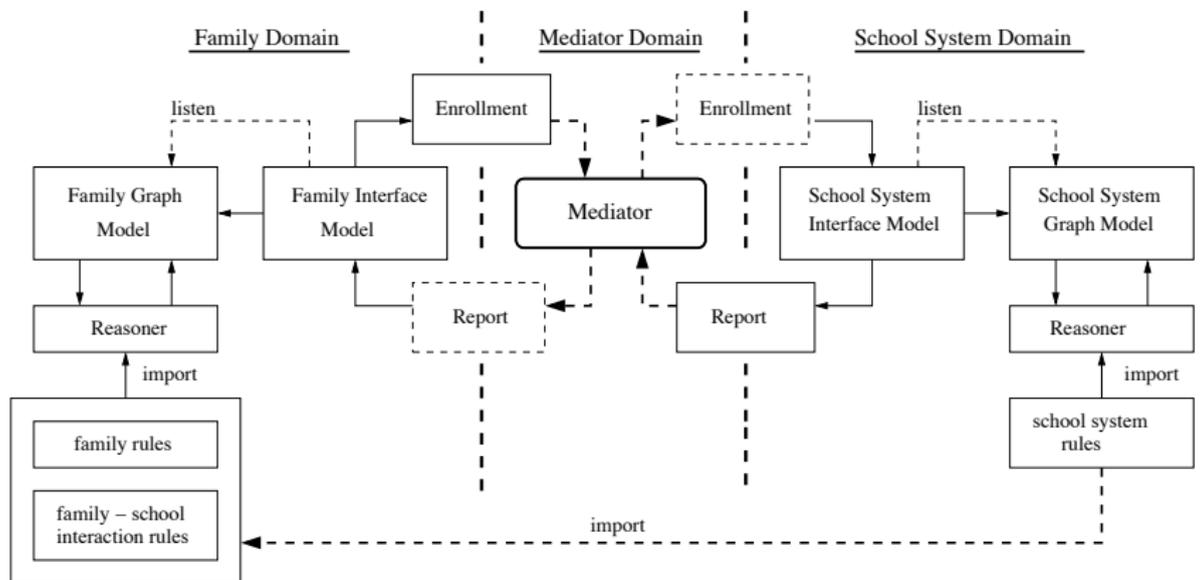


# Distributed Behavior Modeling (Initial)

**Initial Idea:** Use **semantic graphs** to model **behavior** of **individual entities** (e.g., a family). Wrap entities with **interfaces**. Enable **communication** among entities with **message passing**.



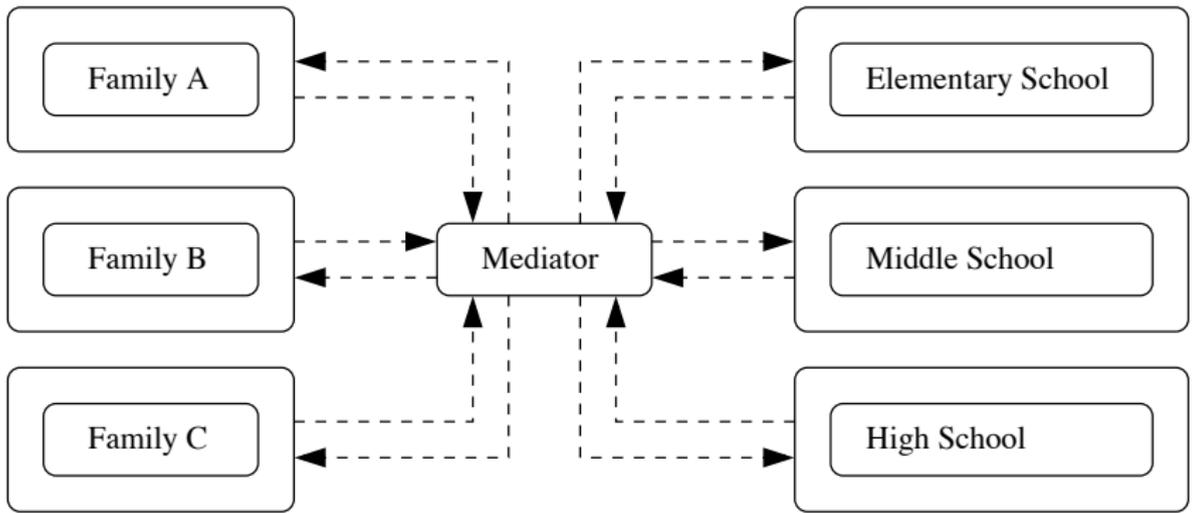
# Example 2. Family-School System Dynamics



# Example 2. Framework for Communication

Family Domain

School Domain



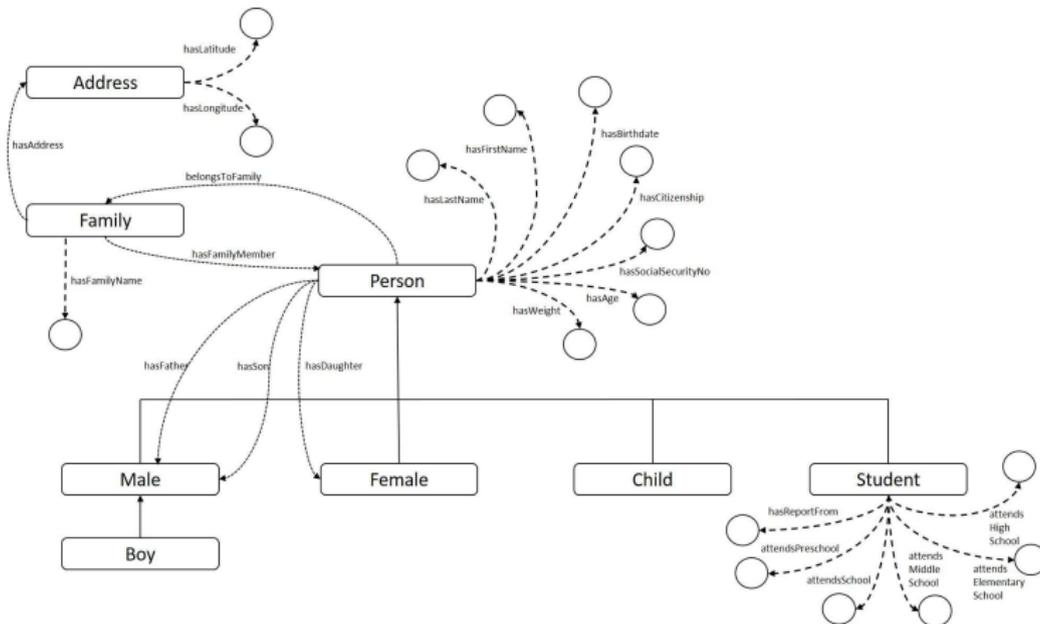
## Example 2. Family Datafile (XML)

```
<?xml version="1.0" encoding="UTF-8"?>
<FamilyModel author="Maria Coelho" date="2017" source="UMD">
<Family>
  <attribute text="FamilyName" value="Austin"/>
  <attribute text="Address" value="6242 Heather Glen Way, Clarksville, MD 21029"/>
  <Person>
    <attribute text="Type" value="Male"/>
    <attribute text="FirstName" value="Mark"/>
    <attribute text="MiddleName" value="William"/>
    <attribute text="LastName" value="Austin"/>
    <attribute text="BirthDate" value="1704-06-10"/>
    <attribute text="Weight" value="170.0"/>
    <attribute text="Citizenship" value="New Zealand"/>
    <attribute text="SocialSecurity" value="111"/>
  </Person>
  <Person>
    ... description of other Austin family members ....
  </Person>
</Family>
<Family>
  <attribute text="FamilyName" value="Jones"/>
  <attribute text="Address" value="5807 Laurel Leaves Ln, Clarksville, MD 21029"/>
  <Person>
    ... description of Jones family members....
  </Person>
</Family>
</FamilyModel>
```

## Example 2. School Datafile (XML)

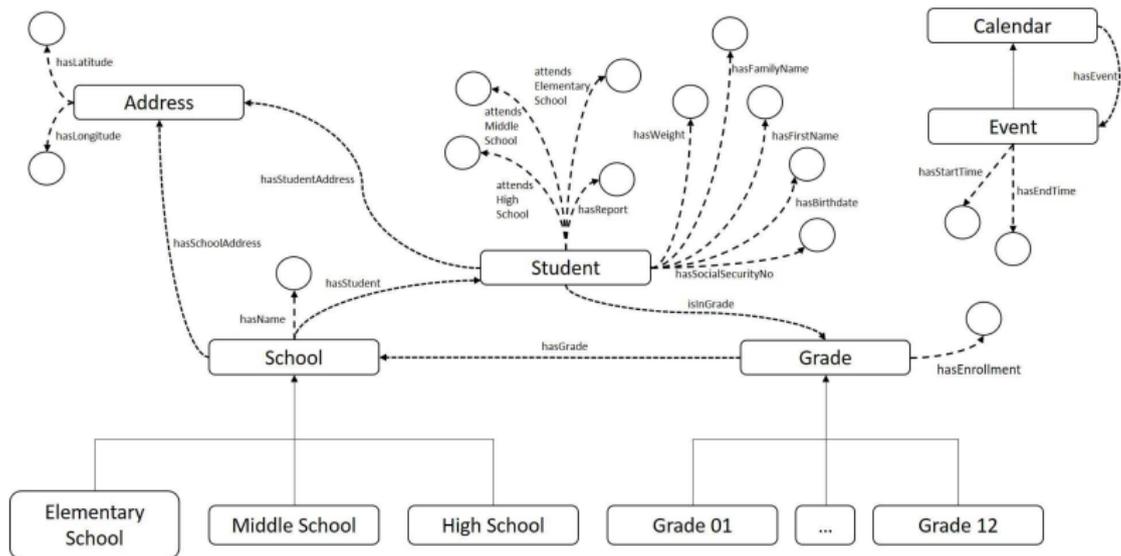
```
<?xml version="1.0" encoding="UTF-8"?>
<SchoolSystemModel author="Maria Coelho" date="2017" source="UMD">
  <School>
    <attribute text="Type" value="High School"/>
    <attribute text="Name" value="River Hill High School"/>
    <attribute text="Grade" value="Grade09"/>
    <attribute text="Grade" value="Grade10"/>
    <attribute text="Grade" value="Grade11"/>
    <attribute text="Grade" value="Grade12"/>
    <attribute text="Report Period Start Time" value="2016-09-01T00:00:00"/>
    <attribute text="Report Period End Time" value="2020-10-20T00:00:00"/>
  </School>
  <School>
    ... description of Clarksville Middle School ...
  </School>
  <School>
    ... description of Pointers Run Elementary School ...
  </School>
</SchoolSystemModel>
```

# Example 2. Family and School Ontologies



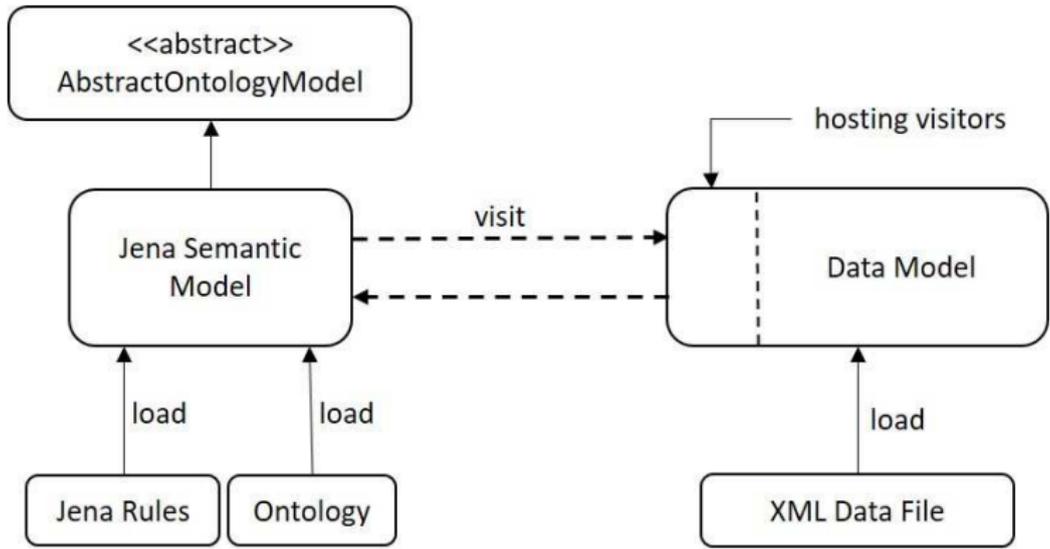
Source: Maria Coelho, MS Thesis, 2017.

# Example 2. Family and School Ontologies



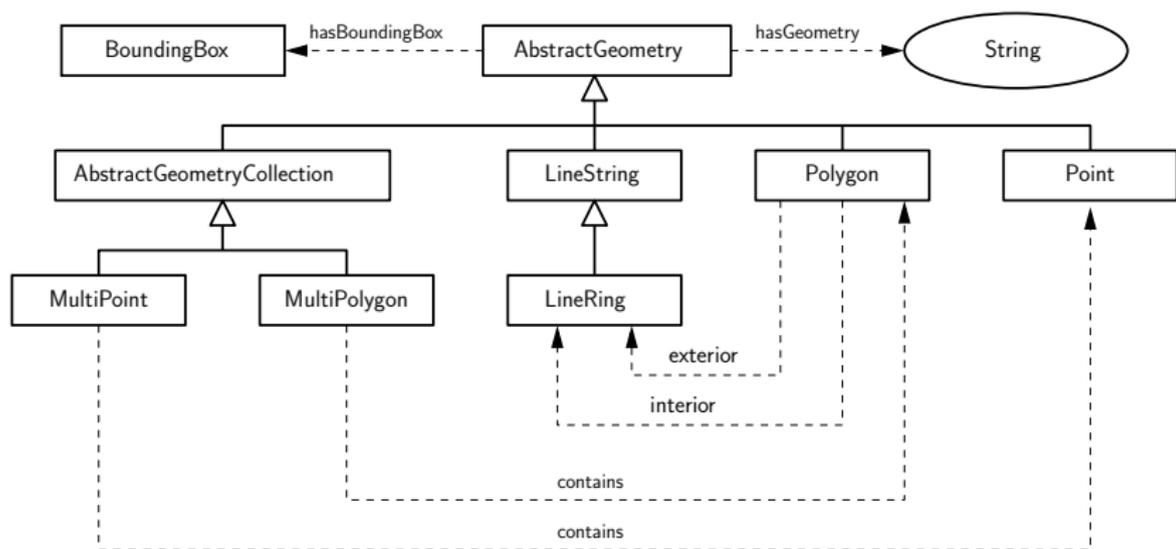
Source: Maria Coelho, MS Thesis, 2017.

# Example 2. Populating Models with Data

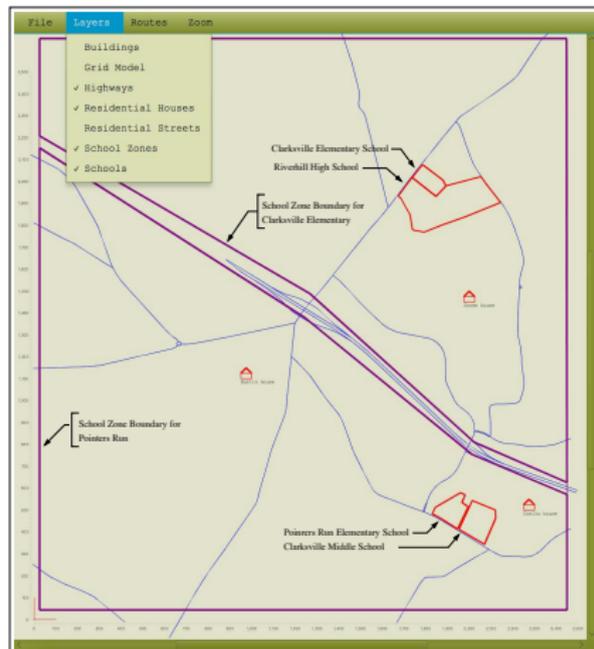
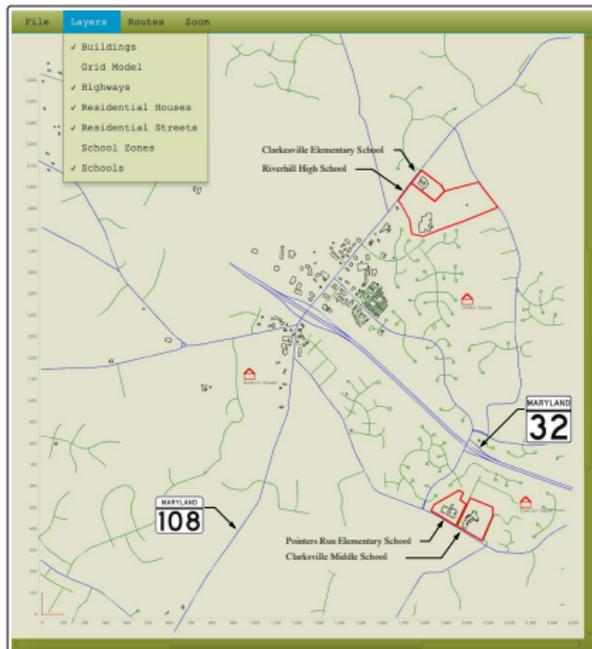


# Example 3. Spatial Ontology

Abbreviated Spatial Ontology:

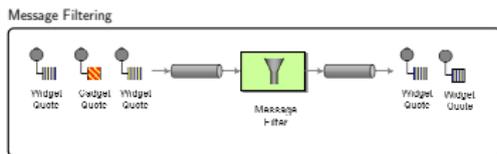
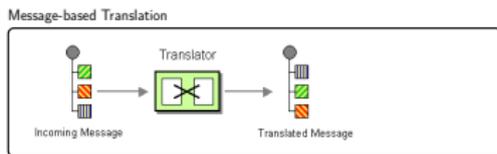
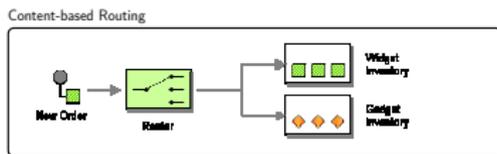
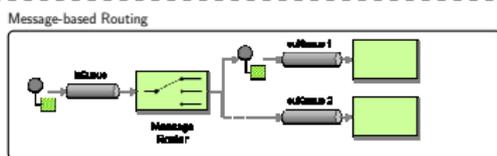


# Example 3. Family-School-Urban-Geography Dynamics

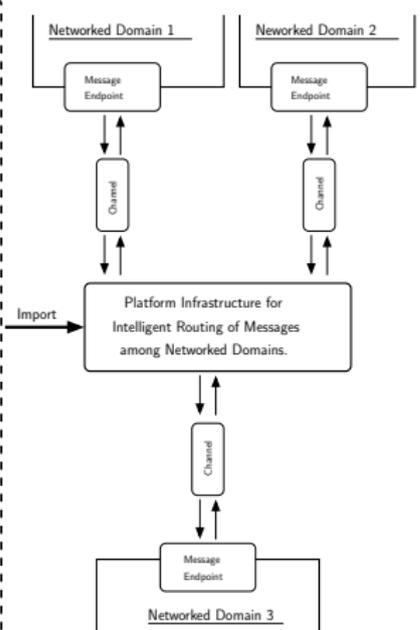


# Future Work. Smart Messages with Apache Camel

Mechanisms for Message Transmission and Processing in Apache Camel.



Distributed System Behavior Modeling

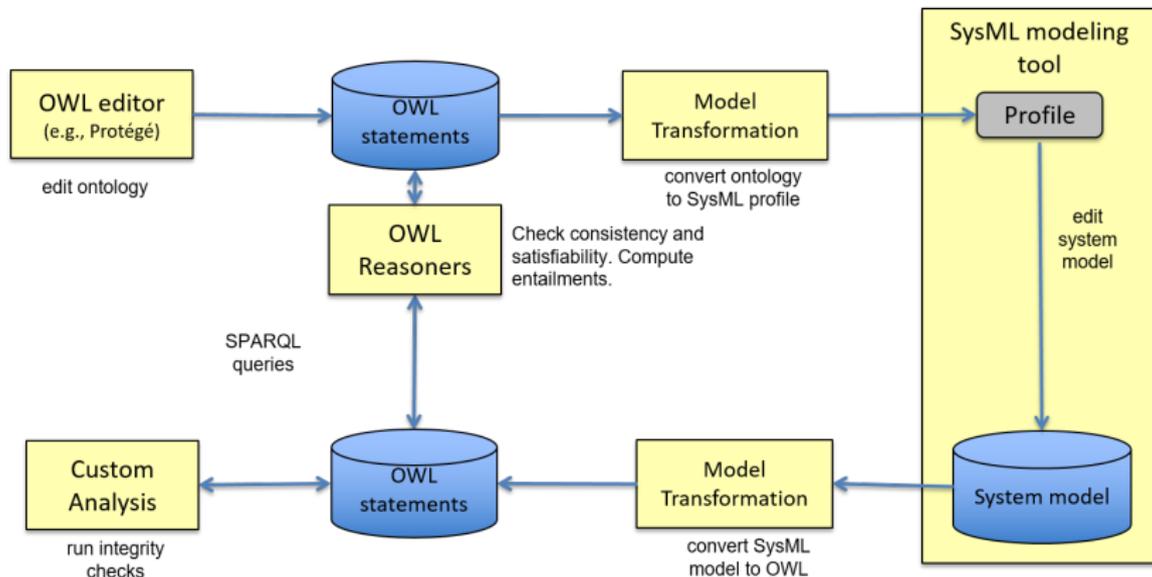


# Ontology-Enabled Computing at JPL

Time frame: 2000-2006



# Side-by-Side: Semantic/SysML Modeling at JPL



**Task 2:** Investigate opportunities adding value to the MBSE process through integration of OWL ontologies and reasoning mechanisms with state-of-the-art SysML tools such as MagicDraw. How well does the proposed interaction of OWL and SysML actually work? What is actually be transformed in the model transformations? Is the model transformation process robust?

# Analysis Procedure at UMD

- 1 Load the individual ontologies in Jena (e.g., base.owl, analysis.owl, mechanical.owl, etc, etc).
- 2 Systematically traverse the semantic graph.
- 3 For each class, print:
  - 1 Name of the class.
  - 2 The list of super classes.
  - 3 The list of subclasses classes.
  - 4 The list of data properties and object properties.
- 4 Record the number of classes and model size (i.e., number of statements in semantic graph).
- 5 Identify SWRL rules (if they exist).
- 6 Use VOWL to visualize the ontology (classes, data properties, object properties).

**Note:** At this point there are no individuals.

# Analysis Procedure at UMD

Here's what a typical class looks like:

---

```
--- Full Name: http://imce.jpl.nasa.gov/foundation/analysis/analysis#Analysis
--- Superclass: http://imce.jpl.nasa.gov/foundation/analysis/analysis#Explanation ...
--- Subclass: http://imce.jpl.nasa.gov/foundation/analysis/analysis#TradeStudy ...
--- Subclass: http://imce.jpl.nasa.gov/foundation/analysis/analysis#KeyRequirementsExplanation ...
--- Subclass: http://imce.jpl.nasa.gov/foundation/analysis/analysis#DrivingRequirementsExplanation ...
--- Subclass: http://imce.jpl.nasa.gov/foundation/analysis/analysis#CostEstimate ...

--- Data Property Name: http://imce.jpl.nasa.gov/foundation/base/base#hasShortName ...
---      Domain: http://imce.jpl.nasa.gov/foundation/base/base#IdentifiedElement ...

... six data properties removed ...

--- Data Property Name: http://imce.jpl.nasa.gov/foundation/base/base#hasIndexEntry ...
---      Domain: http://imce.jpl.nasa.gov/foundation/base/base#IdentifiedElement ...

--- Object Property: http://imce.jpl.nasa.gov/foundation/analysis/analysis#isCharacterizedBy ...
---      Range: http://imce.jpl.nasa.gov/foundation/analysis/analysis#Characterization ...

... nine object properties removed ...

--- Object Property: http://imce.jpl.nasa.gov/foundation/analysis/analysis#isExplainedBy ...
---      Range: http://imce.jpl.nasa.gov/foundation/analysis/analysis#Explanation ...
```

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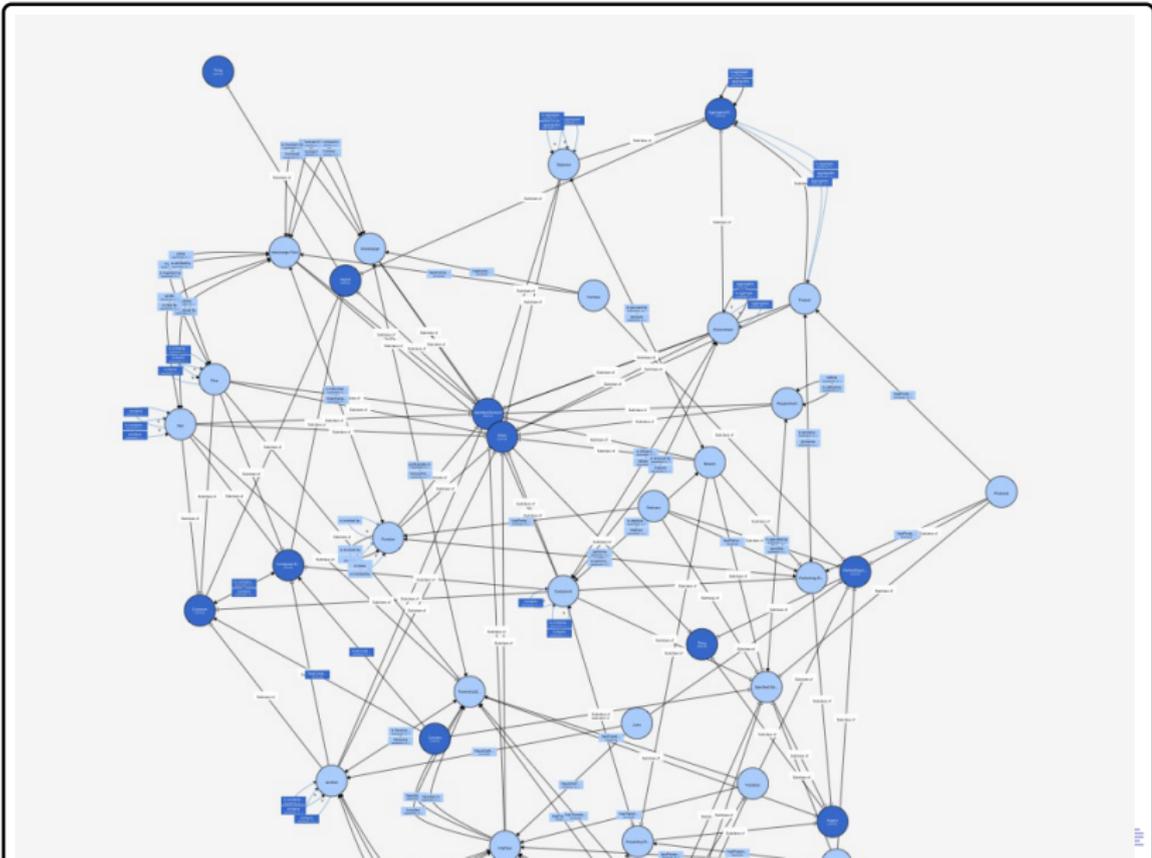
# IMCE Ontologies (Number of Classes/Model Size)

<b>Foundation Ontologies</b>	<b>Number of Classes</b>	<b>Model Size</b>
Analysis.owl	101	2,769
Base.owl	13	–
Mission.owl	64	1,991
Project.owl	227	4,920
Time.owl	48	1,000

<b>Discipline Ontologies</b>	<b>Number of Classes</b>	<b>Model Size</b>
Mechanical.owl	105	–
Electrical.owl	243	5,074

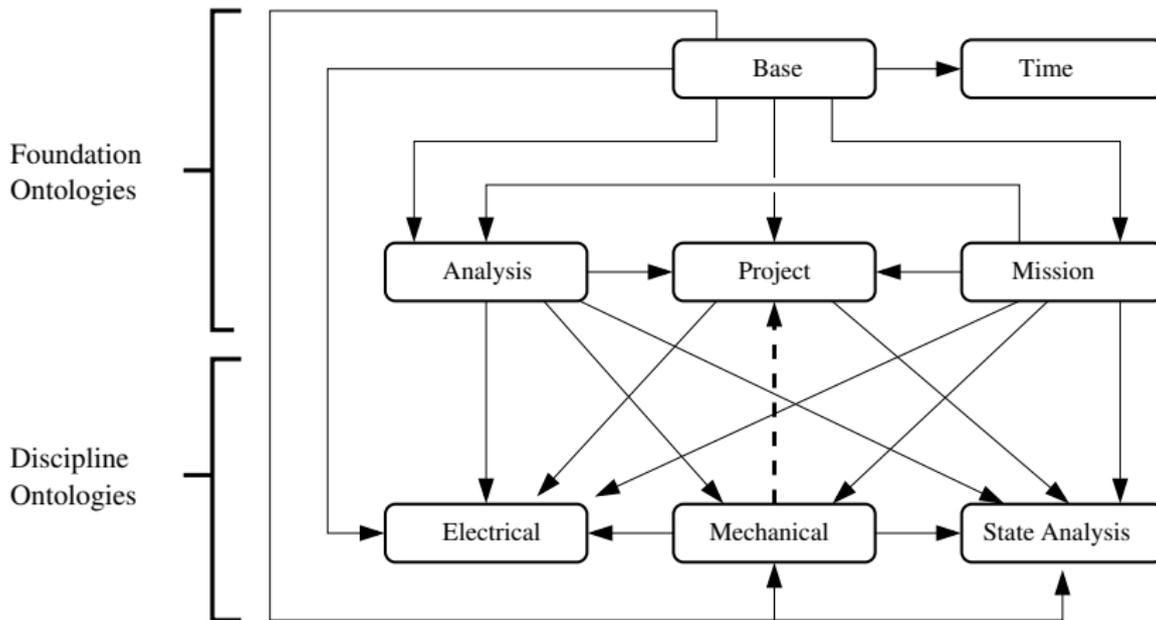
<b>Miscellaneous Ontologies</b>	<b>Number of Classes</b>	<b>Model Size</b>
SysML.owl	877	21,079

# Panoramic View of Mission Ontology



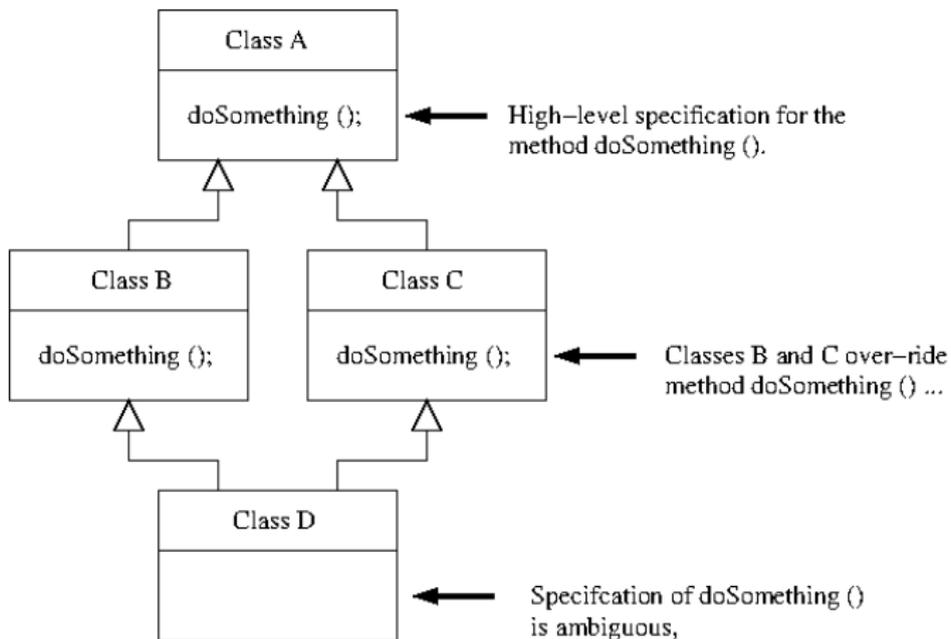
# Concern 1: Dependencies Among Ontologies

What happened to notions of modularity?



## Concern 2: Multiple Inheritance Relationships

Use of multiple inheritance relationships in software:



## Concern 2: Multiple Inheritance Relationships

Excessive use of multiple inheritance:

---

Named Class(79): Item

--- Full Name: <http://imce.jpl.nasa.gov/foundation/mission/mission#Item>

--- Superclass: <http://imce.jpl.nasa.gov/backbone/imce.jpl.nasa.gov/foundation/mission/mission#Entity> ...

--- Superclass: <http://imce.jpl.nasa.gov/foundation/base/base#ContainedElement> ...

--- Superclass: <http://imce.jpl.nasa.gov/foundation/base/base#Container> ...

--- Superclass: <http://imce.jpl.nasa.gov/foundation/base/base#IdentifiedElement> ...

--- Superclass: <http://imce.jpl.nasa.gov/foundation/mission/mission#TraversingElement> ...

--- Subclass: <http://imce.jpl.nasa.gov/foundation/mission/mission#MaterialItem> ...

--- Subclass: <http://imce.jpl.nasa.gov/foundation/mission/mission#Message> ...

--- Data Property Name: <http://imce.jpl.nasa.gov/foundation/base/base#hasShortName> ...

--- Domain: <http://imce.jpl.nasa.gov/foundation/base/base#IdentifiedElement> ...

--- Data Property Name: <http://imce.jpl.nasa.gov/foundation/base/base#hasDescription> ...

... etc ...

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## The Data-Ontology-Rule Footing

Building Block for Semantic Modeling and  
Event-driven Execution of Multi-Domain Systems

MSSE/Ph.D. (Civil Systems) Students

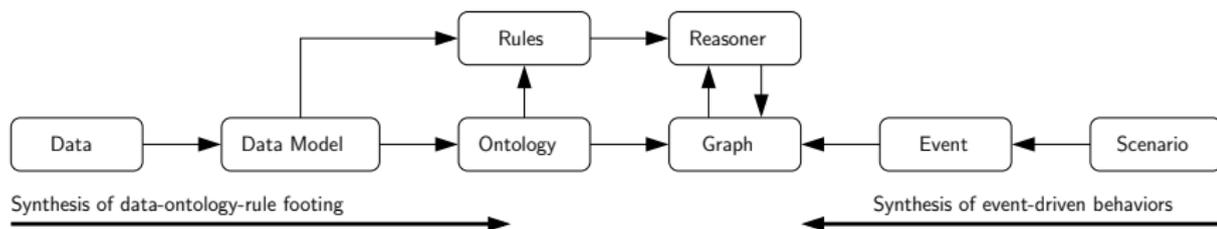
- 1 Parastoo Delgoshaei (2013-2017);
- 2 Maria Coelho (2015-present).

# Data-Driven Approach

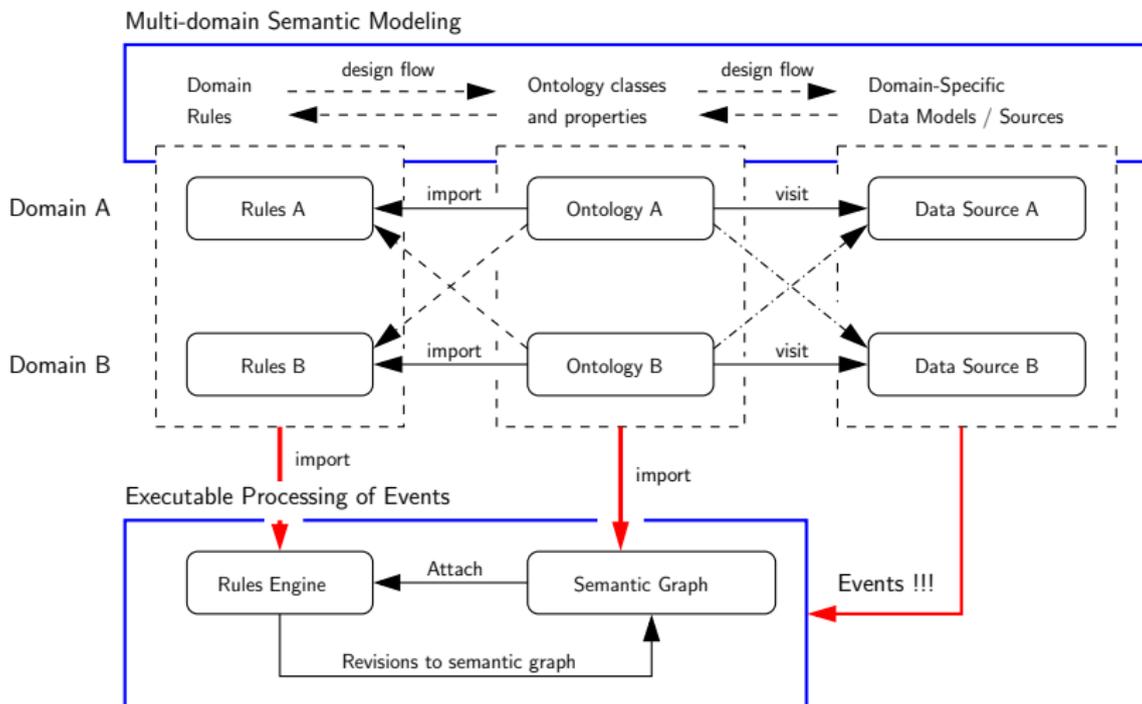
## Guiding Principles:

- 1 One footing for ontologies, rules and data ...
- 2 Use (but do not extend) foundational level ontologies ...
- 3 Ontologies visit data models to get individuals ...
- 4 Semantic graph dynamically responds to incoming events ...
- 5 Enhance power of rules with backend functions ...

## Preliminary Schematic:

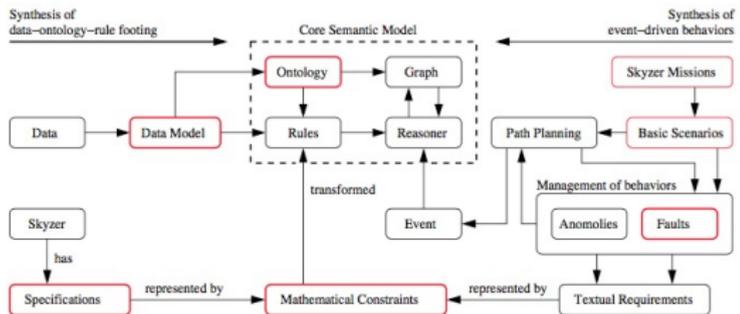


# Template for Semantic Modeling + Processing of Events

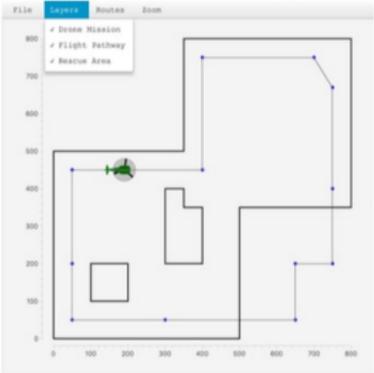


# Data-Driven Approach (Synthesis of UAV Operations)

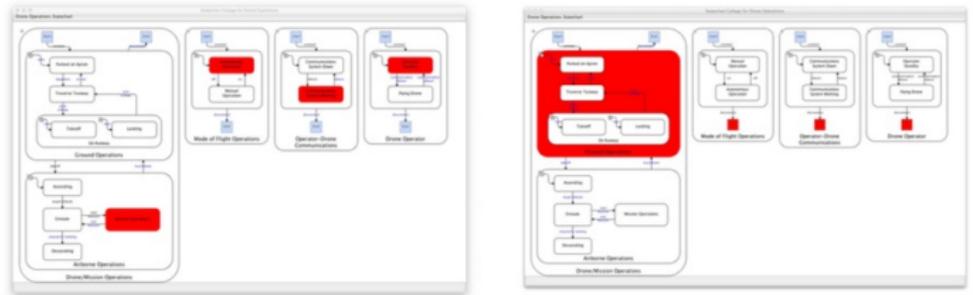
## Synthesis of data-ontology-rule footing + event-driven behaviors.



## Simulation in Whistle ...



## Visualization of subsystem behaviors ...



# Data-Driven Approach (Populating Models with Data)

