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Confronting the Multiple Dimensions of Resilient and Sustainable Building Design



Aimee Buccellato

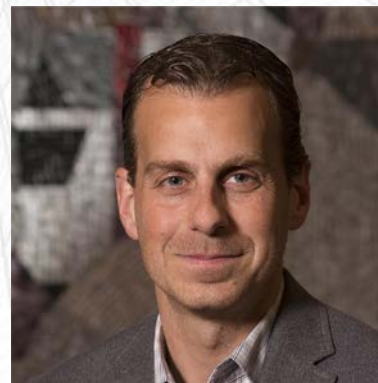
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School of Architecture



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Provider Number: G168

Confronting the Multiple Dimensions of Resilient and Sustainable Building Design

TU-3A

Aimee P. C. Buccellato
Tracy Kijewski-Correa
Alexandros Taflanidis
Charles Vardeman II

January 9, 2018





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Questions related to specific materials, methods, and services will be addressed at the conclusion of this presentation.





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Course Description

The building industry must respond to the growing national mandate to better steward our environment, while protecting lives and property in disasters. The joint consideration of a structure's unique vulnerabilities to natural or man-made hazards and its sustainability—over the course of its lifetime or in response to a disaster—is far from trivial. The models and data necessary for this kind of end-to-end evaluation, from hazard characterization to response and projected damage/deterioration and environmental impact, engage various disciplines involved in building project delivery. These disciplinary perspectives—from the fields of architecture, structural engineering and mechanical engineering, among others—affect the conceptualization of buildings in respective modeling environments and the data sources used in their evaluation; leading, ultimately, to the notorious challenges of BIM interoperability. However, **through this project, a fully integrated and automated workflow for life-cycle assessment of buildings has been developed that captures the dependencies between multi-hazard resilience and sustainability, across multiple dimensions of environmental impact and across the modeling environments common to building practice using new semantic data perspectives from computer science.** This presentation will introduce this end-to-end workflow, including modules dedicated to hazard characterization, response, damage/deterioration, repair and environmental impact (lifetime embodied and operating energy).





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Acknowledgements/ Credits

The University of Notre Dame
Center for Research Computing
Office of Research
Center for Sustainable Energy

National Science Foundation
CMMI 1537652: "A Green Resilience Framework to Support the
Design of Sustainable Buildings Under Multiple Hazards"





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Learning Objectives

At the end of the this course, participants will be able to:

1. Develop an awareness of the current challenges and evolving opportunities to advance resilient and sustainable building design
2. Develop an appreciation for the importance of systematically evaluating hazard resilience and multiple dimensions of environmental impact in building design process
3. Understand conceptually how such evaluations can be conducted and integrated with industry-standard modeling environments
4. Appreciate the benefit of structured data to enable data discovery and interoperability of industry-standard tools in the context of such evaluations





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MOTIVATION OF PROJECT:

- 1. ARCHITECTS AND ENGINEERS MAKE DECISIONS**
- 2. THOSE DECISIONS HAVE IMPACT**
- 3. HOW ARE WE MAKING IMPACTFUL DECISIONS TODAY?**



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MOTIVATION OF PROJECT:

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Gain a better understanding of the impact of the built environment on the natural environment: how our design decisions about buildings impact – and are *impacted by* – resource consumption.

2. **THOSE DECISIONS HAVE IMPACT**

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IMPACT: cities/ settlement patterns; density; coastal population migration, related civil infrastructure to support

2. THOSE DECISIONS HAVE IMPACT

IMPACTED BY: damage related to changing climate and increased intensity and frequency of natural hazard events

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IMPACT: cities/ settlement patterns; density; coastal population migration, related civil infrastructure to support

2. THOSE DECISIONS HAVE IMPACT

What is a resilient *and* sustainable building -- and how do we currently approach the design of RSB's today?

IMPACTED BY: damage related to changing climate and increased intensity and frequency of natural hazard events

3. HOW ARE WE MAKING IMPACTFUL DECISIONS TODAY?



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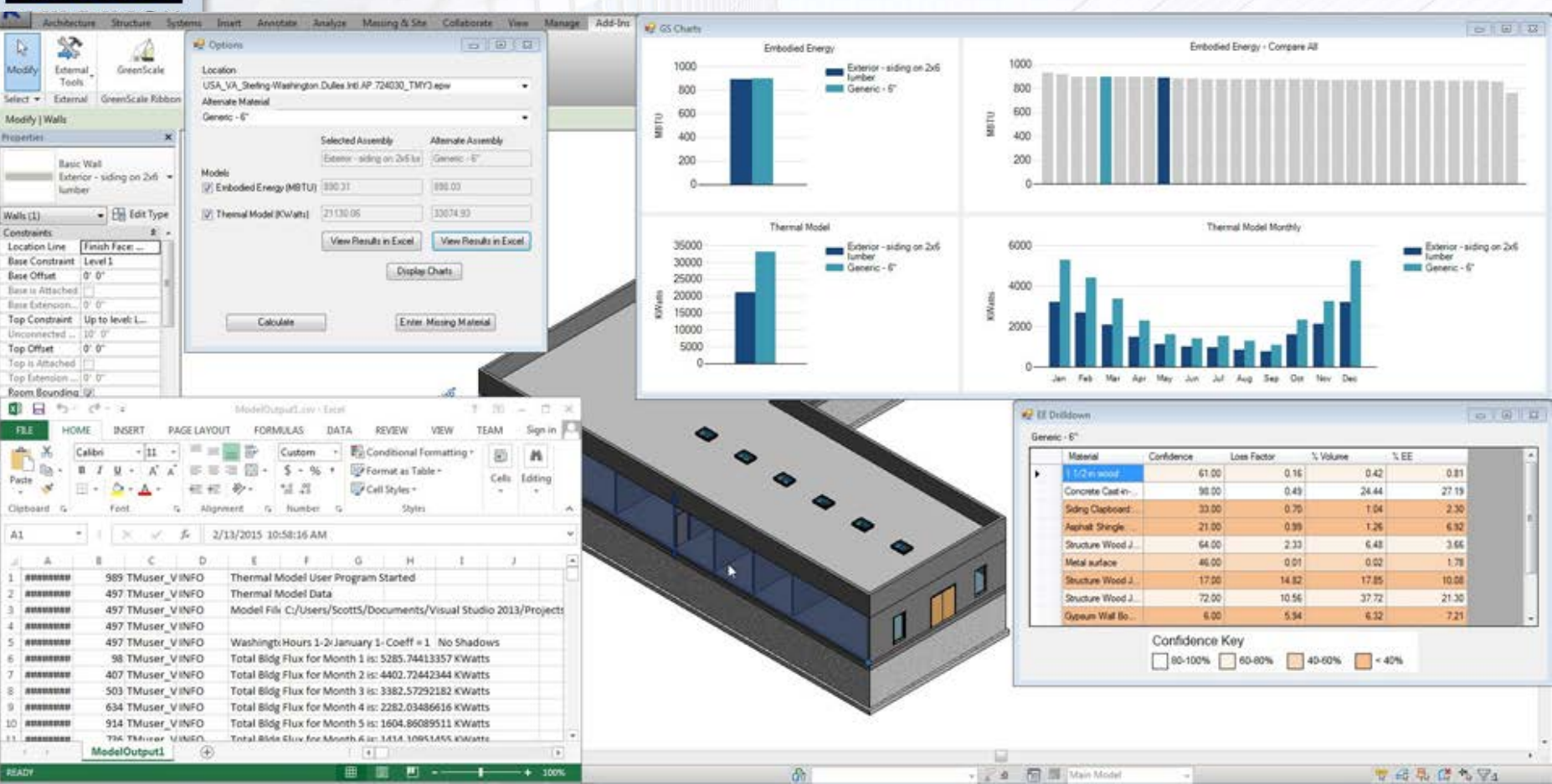
What is a resilient *and* sustainable building -- and **how do we currently approach the design of RSB's today?**

3. HOW ARE WE MAKING IMPACTFUL DECISIONS TODAY?

What are the barriers/ the opportunities to achieve a more resilient *and* sustainable built environment?



**GREEN RESILIENCE
PROJECT**





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EARLY STUDIES REVEALED:

1. Studies were hard to do



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EARLY STUDIES REVEALED:

1. Studies were hard to do
2. Because complete data is hard to find and interpret



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EARLY STUDIES REVEALED:

1. Studies were hard to do
2. Because complete data is hard to find and interpret
3. Usefulness of retrospective understanding of building “costs” is limited



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SuAT



STUDY OF EXISTING TOOLS & METHODS





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SuAT



STUDY OF EXISTING TOOLS & METHODS



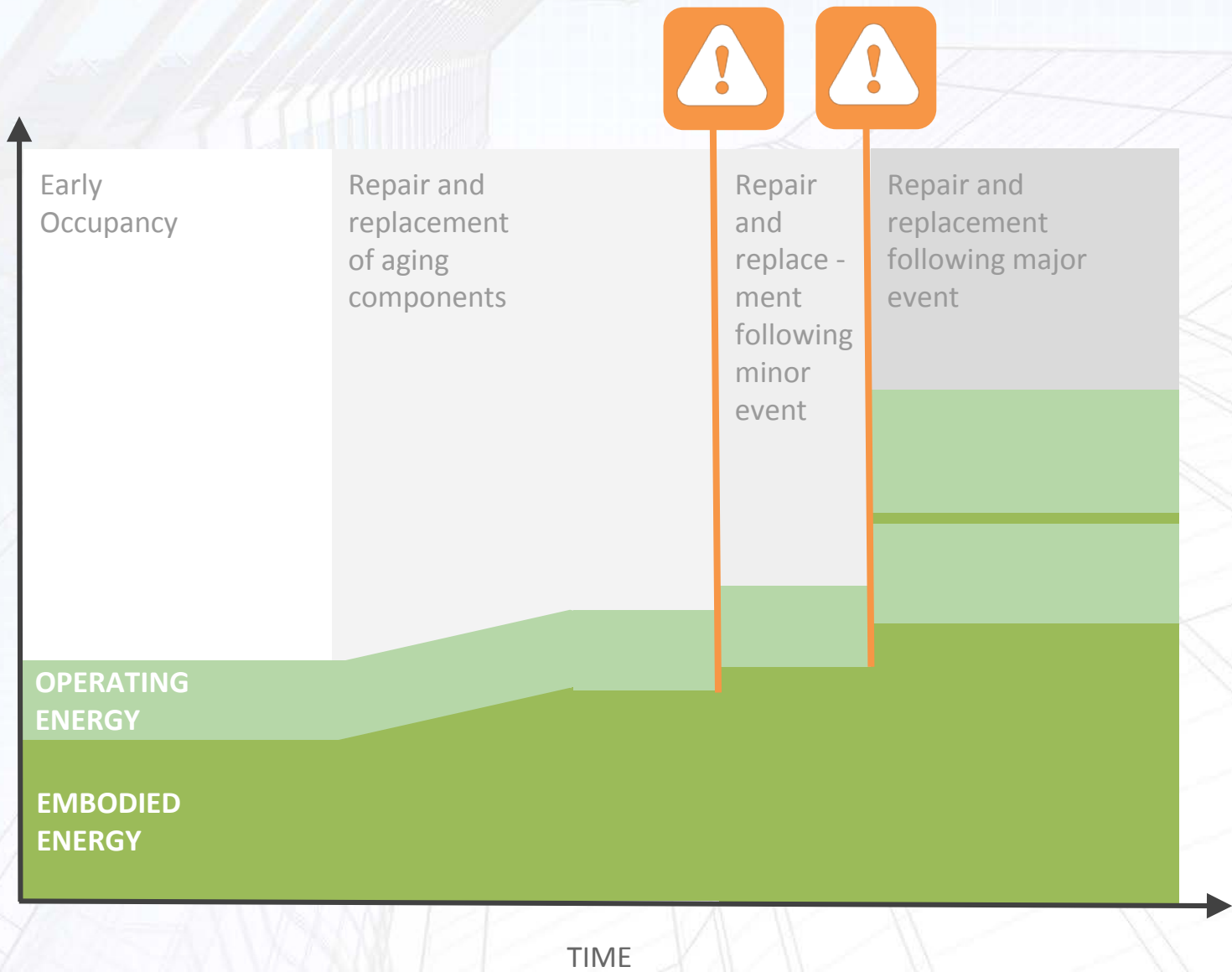


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CUMULATIVE ENVIRONMENTAL IMPACT





GREEN RESILIENCE FRAMEWORK

Integrated Life-cycle Assessment of Building Resiliency and Sustainability

FRAMEWORK PROGRESSION



PROBABILISTIC
LIFE CYCLE ASSESSMENTS



ENVIRONMENTAL IMPACT
MODULE



HAZARD DESCRIPTION; LOSS,
DAMAGE + RESPONSE MODULES



BUILDING MODEL



RSB CONCEPT: BUILDING +
SITE CHARACTERISTICS

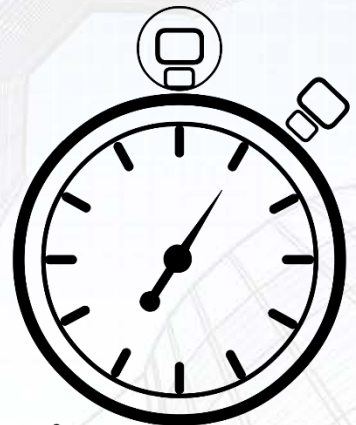


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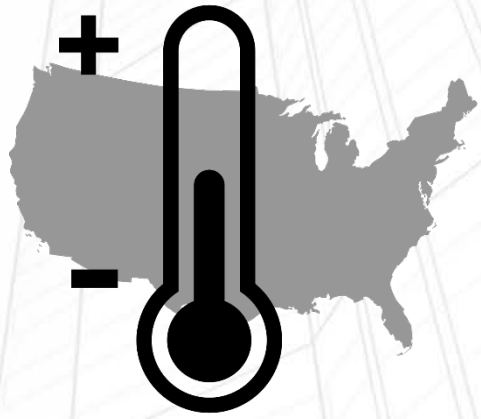
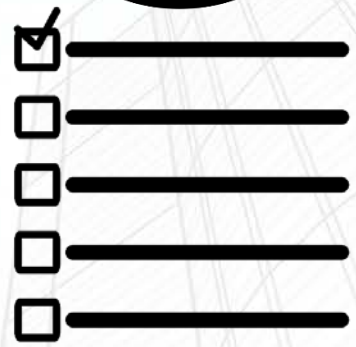
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**INCREASING DEMANDS ON
PROJECT DELIVERY TO
INCLUDE METRICS-BASED
ANALYSES**



**FASTER PROJECT
DELIVERY**



CHANGING CLIMATE

**COASTAL MIGRATION &
EXPOSURE TO HAZARDS
(INTENSITY AND
FREQUENCY)**



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OBSERVATIONS FROM PRACTICE

1. **Hub-and-spoke model of collaboration prevails**



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OBSERVATIONS FROM PRACTICE

1. **Hub-and-spoke model of collaboration prevails**
2. **Embodied energy/ carbon/ pre-construction and lifetime impacts not being routinely considered in design process.**



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1. **Hub-and-spoke model of collaboration prevails**
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4. **Owner occupancy influences commitments to life cycle costs**



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- 5. Construction Cost is the biggest driver**



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GREEN RESILIENCE FRAMEWORK

Integrated Life-cycle Assessment of Building Resiliency and Sustainability

Can we develop models within a comprehensive framework that USEFULLY CONSIDERS SUSTAINABILITY ALONGSIDE MULTI-HAZARD RESILIENCE within the normative workflow of firms already endeavoring to achieve RSBs while lowering the barriers for firms currently struggling (with data and tools) to achieve RSBs?

FRAMEWORK CAPABILITIES:

| | | |
|---|-------------------------|---|
|  | Revit Auditor | Extract properties of all components: soil, foundation, structure, envelope and finishes |
|  | Hazard Module | Quantify site-specific hazards (wind, earthquake) and resulting load effects |
|  | Response Module | Analyze structural response under static and dynamic load effects |
|  | Damage Module | Determine hazard-induced damage to components: soil, foundation, structure, envelope and finishes |
|  | Deterioration Module | Evaluate aging/deterioration of components: soil, foundation, structure, envelope and finishes |
|  | Loss Module | Calculate costs of resulting repair and replacement activities (dollars, downtime) |
|  | Embodied Energy Module | Inventory energy embodied in components: soil, foundation, structure, envelope and finishes |
|  | Operating Energy Module | Estimate operating energy based on climate, geometry and component properties |



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INDUSTRY PARTNER ENGAGEMENT



RAMSA

SOM

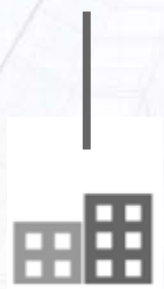


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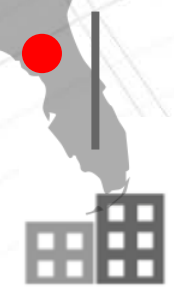
PROJECT CASE STUDIES



17 story Residential Tower,
Northwest U. S.

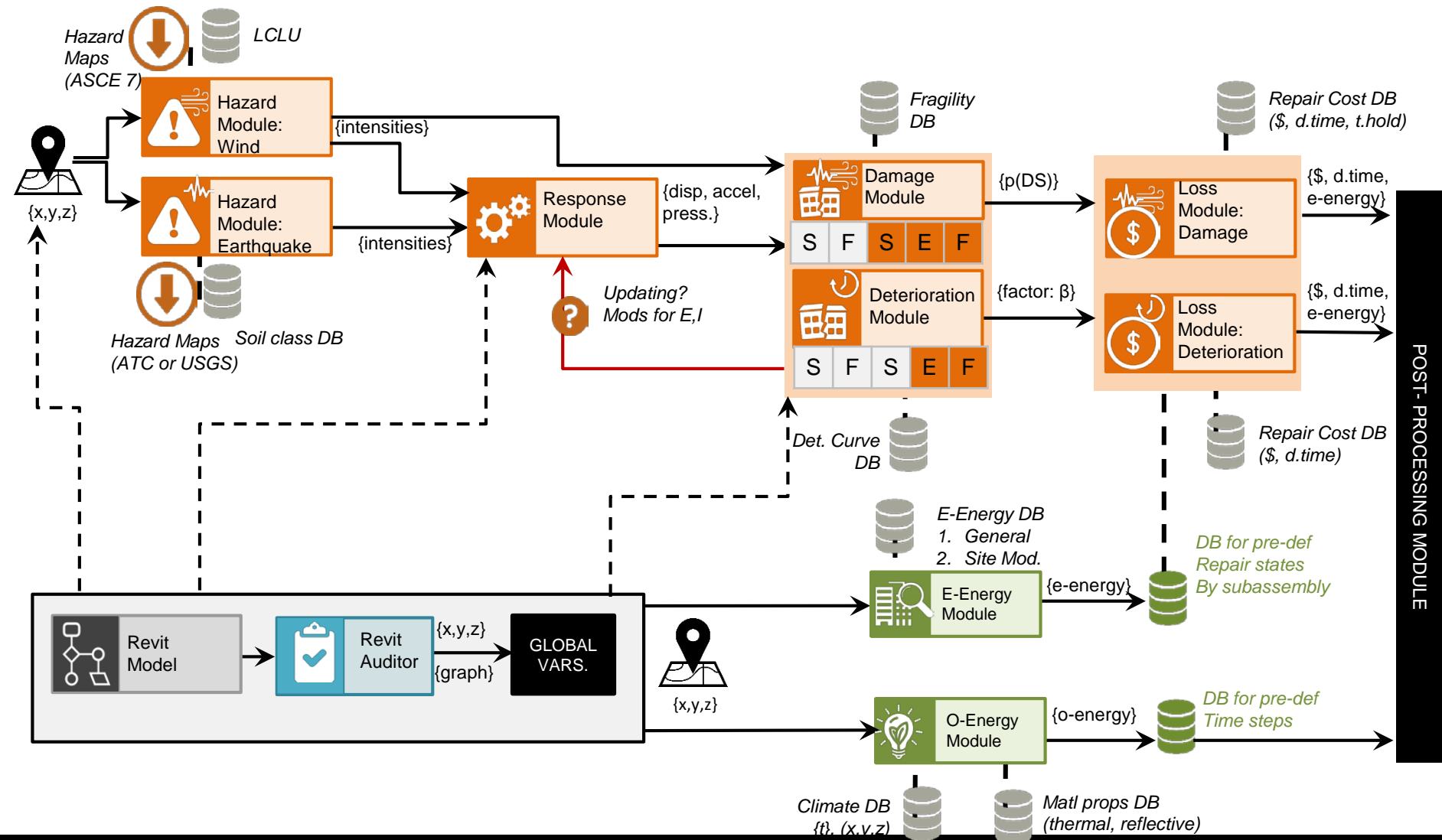


200 SF Commercial Building,
Northeast U. S.



5 story @ 150K SF/ story Medical
Building, Southeast U. S.

INTEGRATED LIFE-CYCLE ASSESSMENT FRAMEWORK





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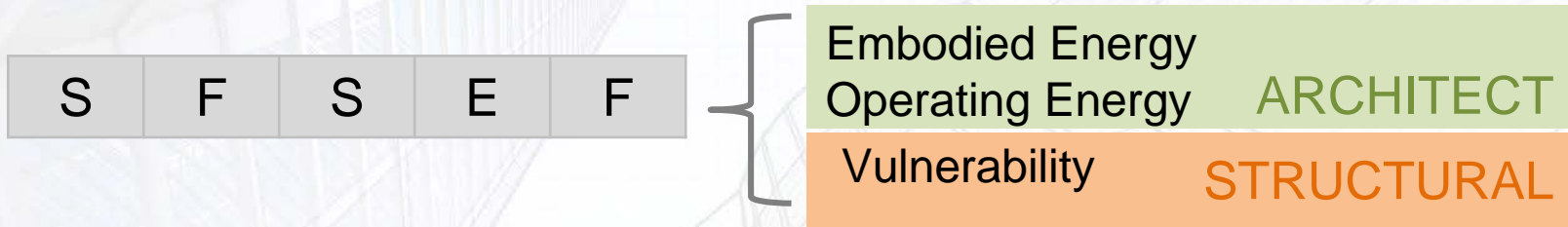
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Integrated Life-cycle Assessment of Building Resiliency and Sustainability: Framework Introduction

PRESENTERS: Tracy Kijewski-Correa, Alexandros
Taflanidis

LEAD DEVELOPERS: Karen Angeles,
Dimitrios Patsialis, Holly Ferguson

Motivation



| PRE-SERVICE | SERVICE | POST-SERVICE |
|--|--|---|
| Fabrication Manufacturing Construction | Occupancy Operations Maintenance | Adaptation Demolition Waste/Recycle |
| t=0 | t=i | t=N |



NEED: *Designer-facing* integrated life cycle assessments of multi-dimensional environmental impact, accounting for multi-hazard resilience

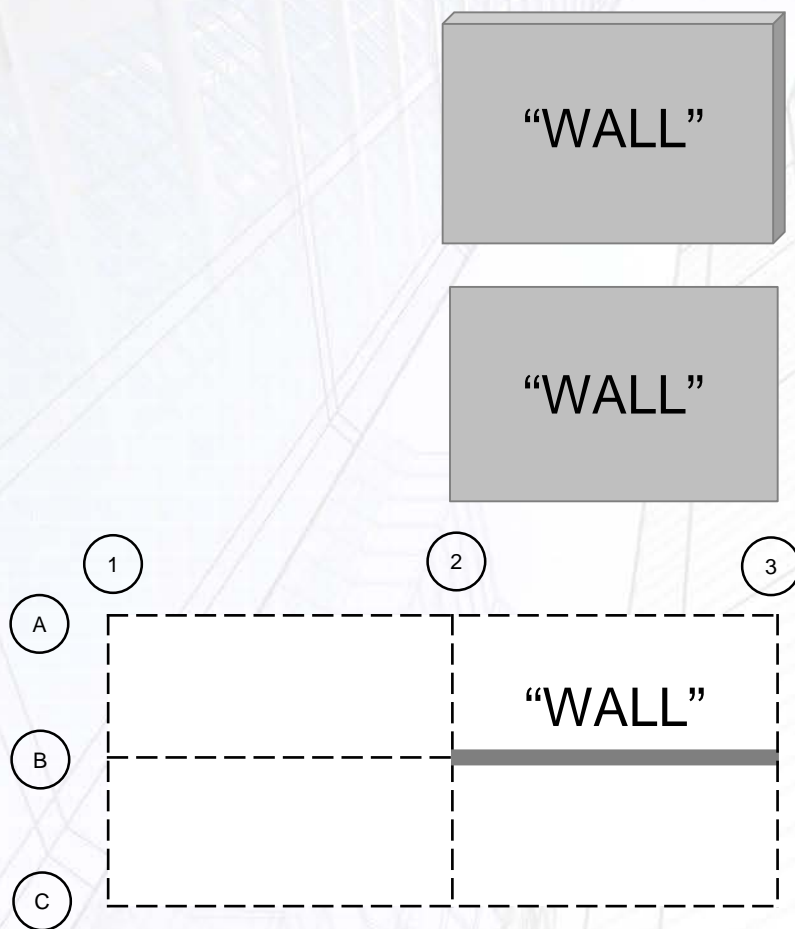


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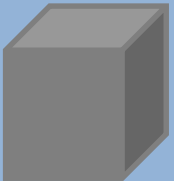
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Reductionism in Design



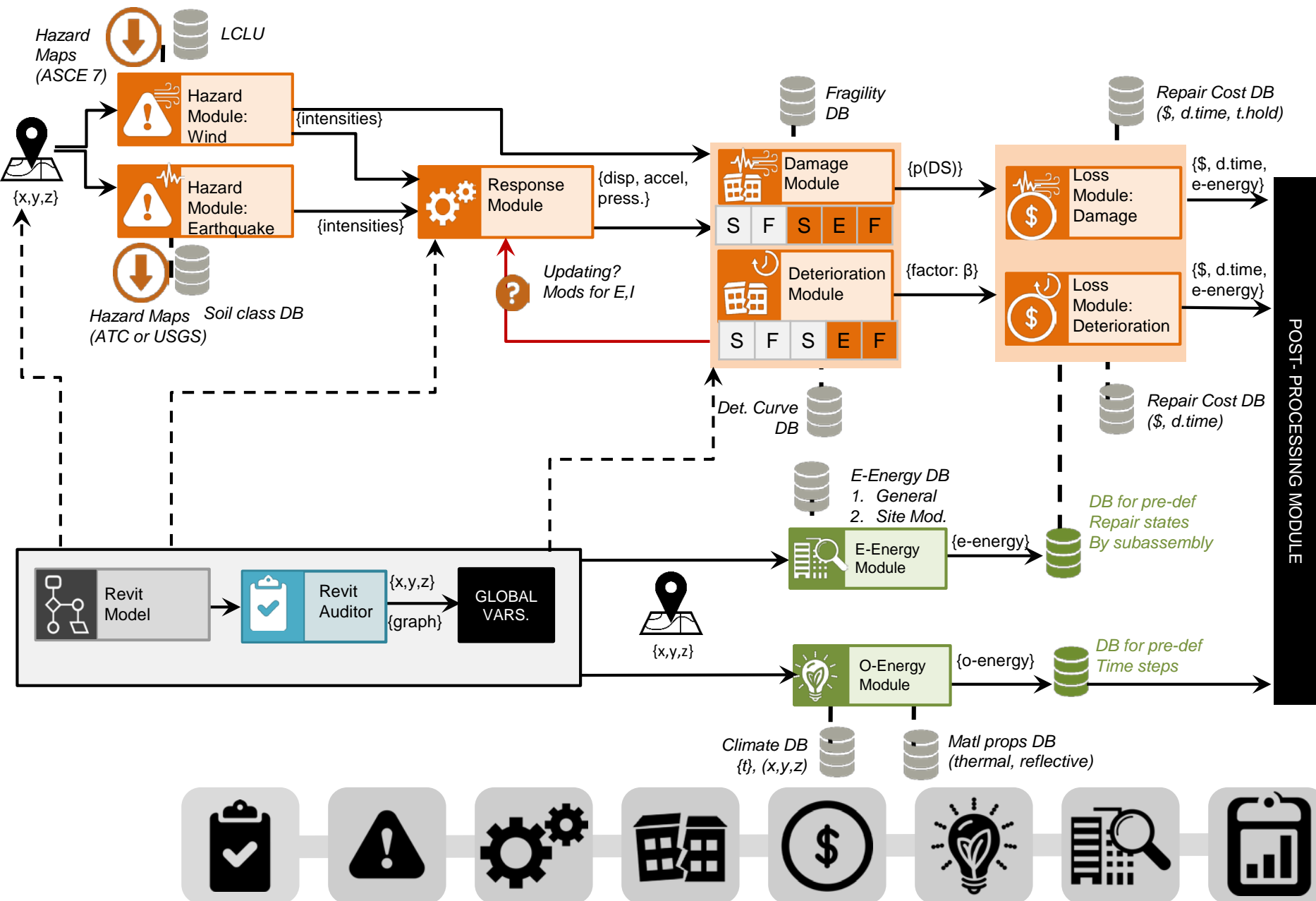
| APPLICATION | ABSTRACTION |
|--|-------------------|
| Massing Costing Etc. | "wall" = [Volume] |
| Finishes Load Projection Etc. | "wall" = [Area] |
| Relative Position Stiffness Etc. | "wall" = [Line] |

Abstractions in Modeling

| CUMULATIVE PROCESS | ABSTRACTION | GEOMETRY | LOCATION | FEATURES | BEHAVIOR | STRUCTURAL |
|--------------------|--|---|---|---|---|---------------|
| | Joint ● (Nodes, Points) | | (x,y,z) | ► Boundary Condition | ► Displacement ► Velocity ► Acceleration | |
| | Element  (Line) | Length [m] | Reference Point (x,y,z) + Transformation* | ► X-Sec Geometry ► Matl Properties: t ₀ : Structural, Thermal t _i :t _N : Fragility, Repair | ► σ, ε ► M, V, N ► Δ, θ | ARCHITECTURAL |
| | Surface  (Area, Polygons) | Height X Width Area [m ²] | Reference Point (x,y,z) + Transformation* | ► X-Sec depth ► Matl Properties: t ₀ : Structural, Thermal, Transmissibility t _i :t _N : Fragility, Repair | ► σ, ε field ► Interaction (shading) ► Embodied energy | |
| | Space  (Volume) | Height X Width X Depth Volume [m ³] | Reference Point (x,y,z) + Transformation* | ► Matl Properties: t ₀ : Structural, Thermal, Transmissibility | ► Embodied energy ► Thermal Heat Flux | |

*Transformation: Offset/translation, rotation, extrusion (may exploit symmetry for efficient data storage)

INTEGRATED LIFE CYCLE ASSESSMENT FRAMEWORK





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REVIT AUDITOR MODULE

FUNCTION:

Characterize geometries, inventory components in Revit model

APPROACH:

Ontology-based data patterns that connect domain vocabularies

INPUTS:

IFCXML file

OUTPUTS:

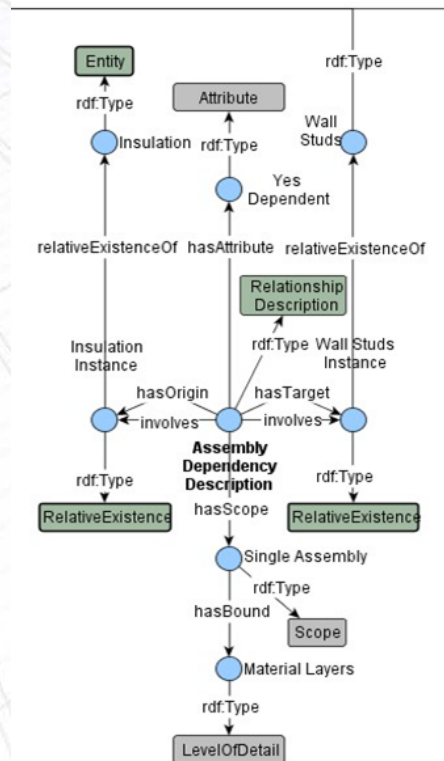
Semantic graph information

DATA SOURCES:

Linked data views

KEY FEATURE:

Queryable graph so modules can easily access building information





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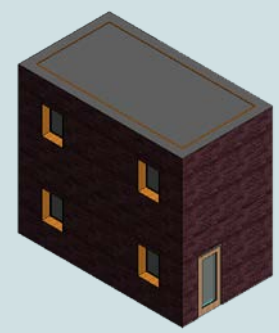
COMPONENT AUDIT: WORKING EXAMPLE

EXAMPLE BUILDING

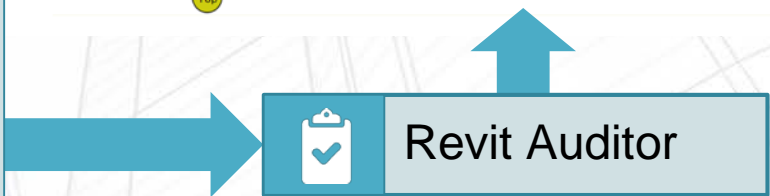
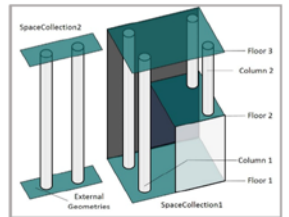
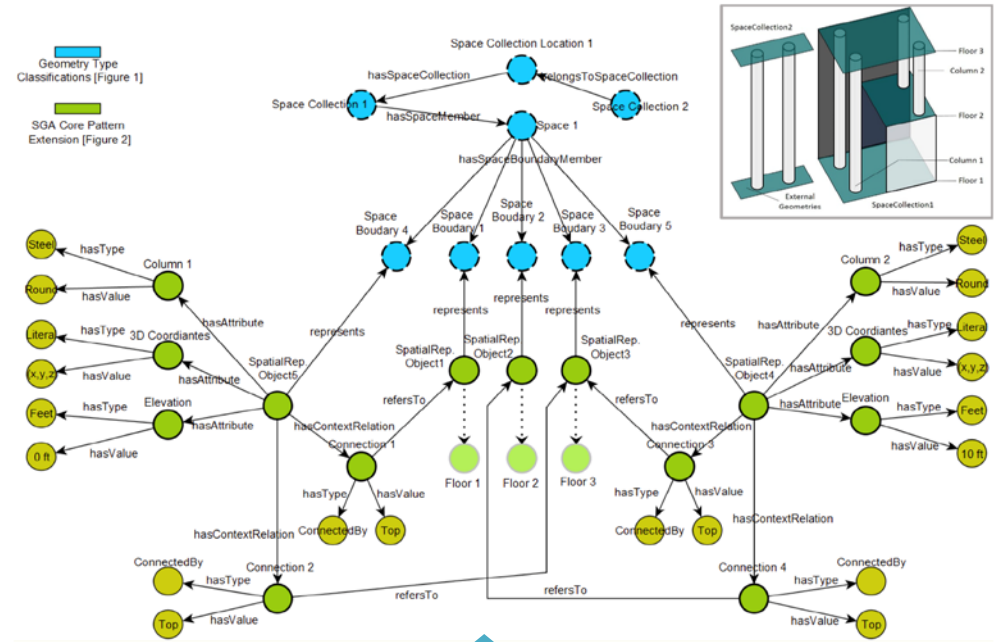


2-Story, 4-room RC
Frame in St. Louis, MO

REPRESENTATION



Revit 2016 Model





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HAZARD MODULE

FUNCTION:

Identify hazard exposure at specified location

APPROACH:

Site-specific hazard curves generated from governing building codes/standards

INPUTS:

Site Characteristics,
Dynamic Properties

OUTPUTS:

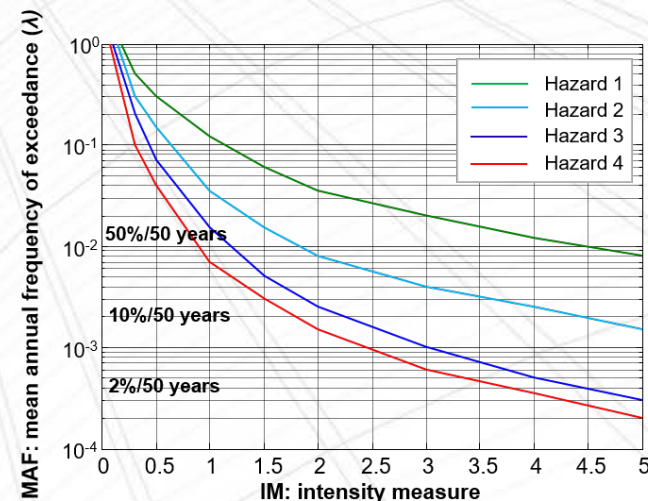
Return rates for different
intensity measures

DATA SOURCES:

Hazard maps (USGS, ATC)

KEY FEATURE:

Automated extraction of
hazard characteristics





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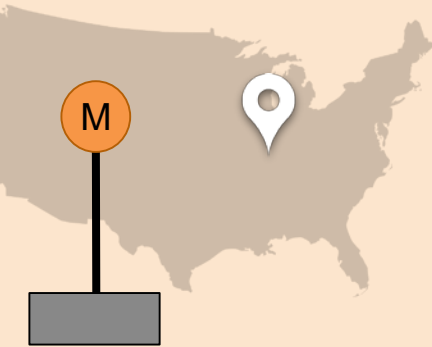
HAZARD DEMANDS: WORKING EXAMPLE

EXAMPLE BUILDING

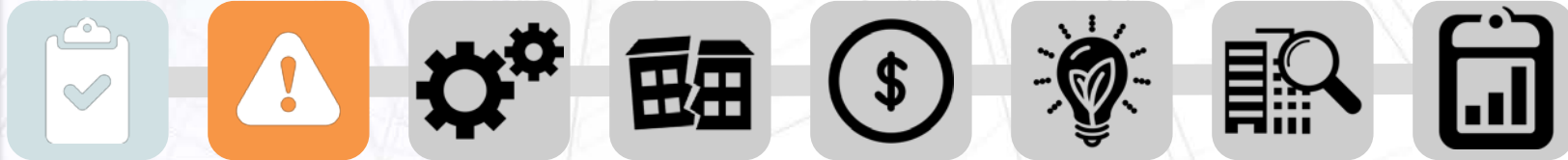
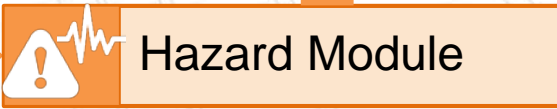
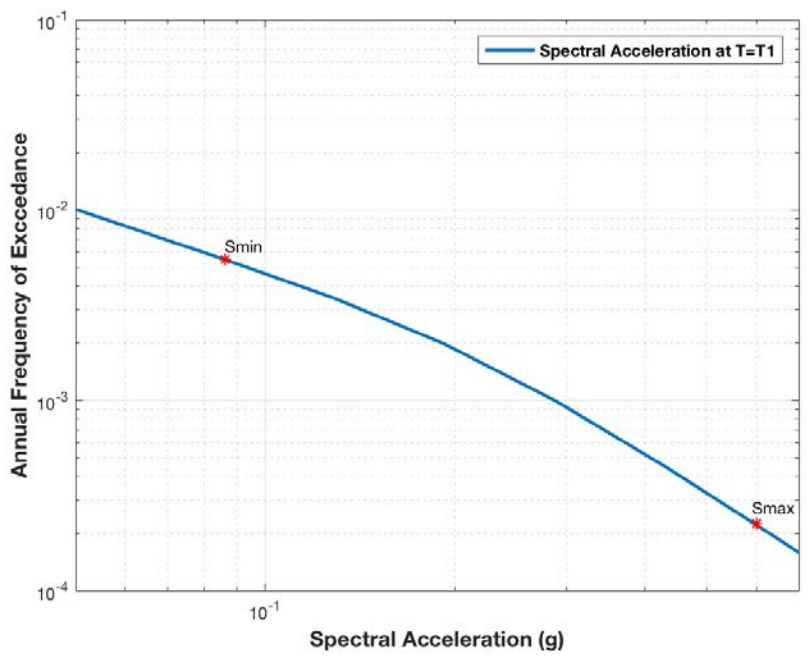


2-Story, 4-room RC Frame in St. Louis, MO

REPRESENTATION



SDOF @ Specific Locale





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RESPONSE MODULE

FUNCTION:

Calculate engineering demand parameters for specific intensity measures

APPROACH:

Response approximated from linear-elastic FEM

INPUTS:

Intensity measures,
building properties

OUTPUTS:

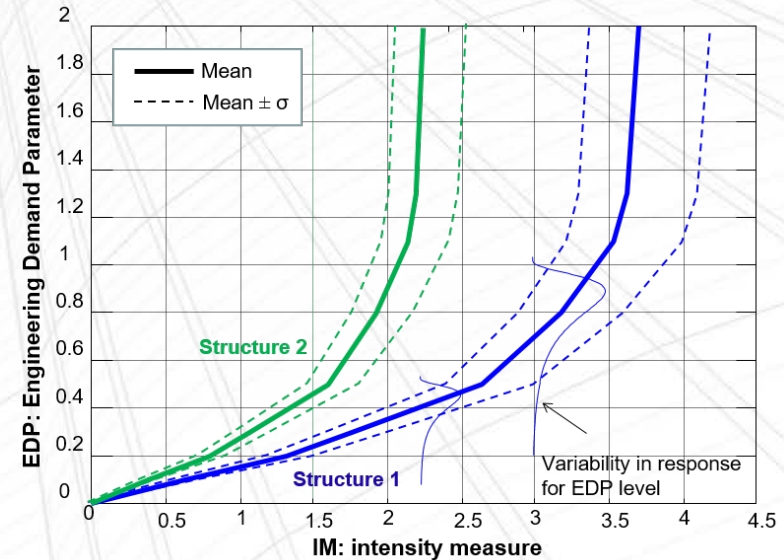
Drift ratios, velocities
and accelerations;
wind pressures

DATA SOURCES:

Nonlinear response
approximations

KEY FEATURE:

Direct interfacing with
FEM packages





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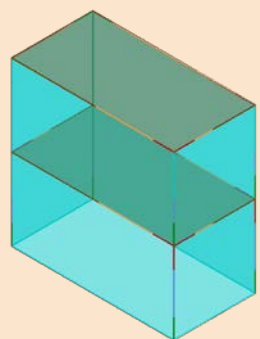
RESPONSE: WORKING EXAMPLE

EXAMPLE BUILDING



2-Story, 4-room RC
Frame in St. Louis, MO

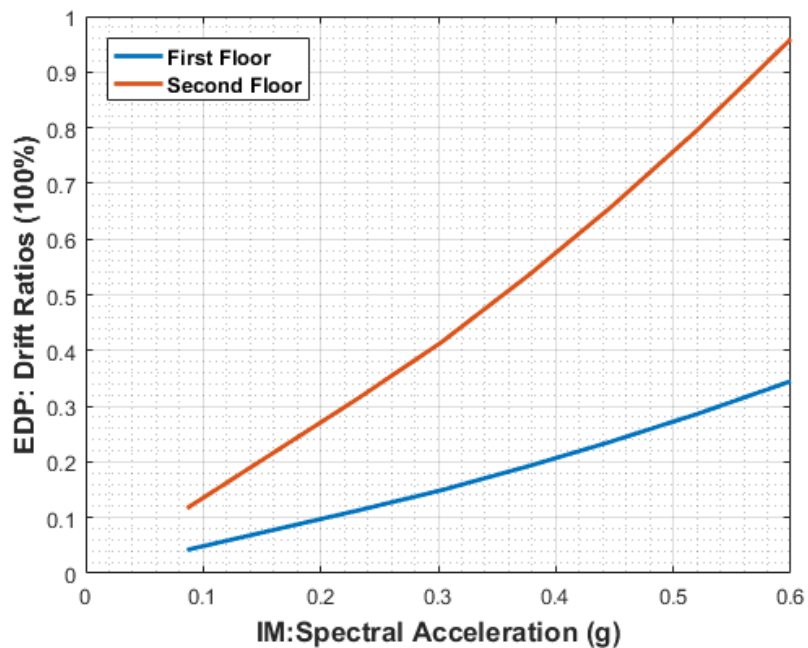
REPRESENTATION



SAP2000 (v. 17) Model



Response Module





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DAMAGE-DETERIORATION MODULE

FUNCTION:

Calculate the probability of occurrence of the different damage states

APPROACH:

Assembly-based vulnerability methodology

INPUTS:

Engineering demand parameters, component assemblies

OUTPUTS:

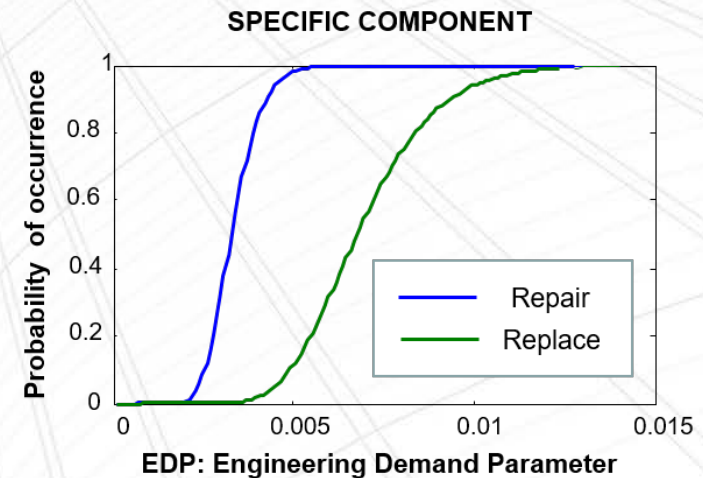
Probabilities of occurrence

DATA SOURCES:

Fragility curves (FEMA)

KEY FEATURE:

Detailed loss assessment at component level





DAMAGE LEVELS: WORKING EXAMPLE

EXAMPLE BUILDING



2-Story, 4-room RC Frame in St. Louis, MO

REPRESENTATION

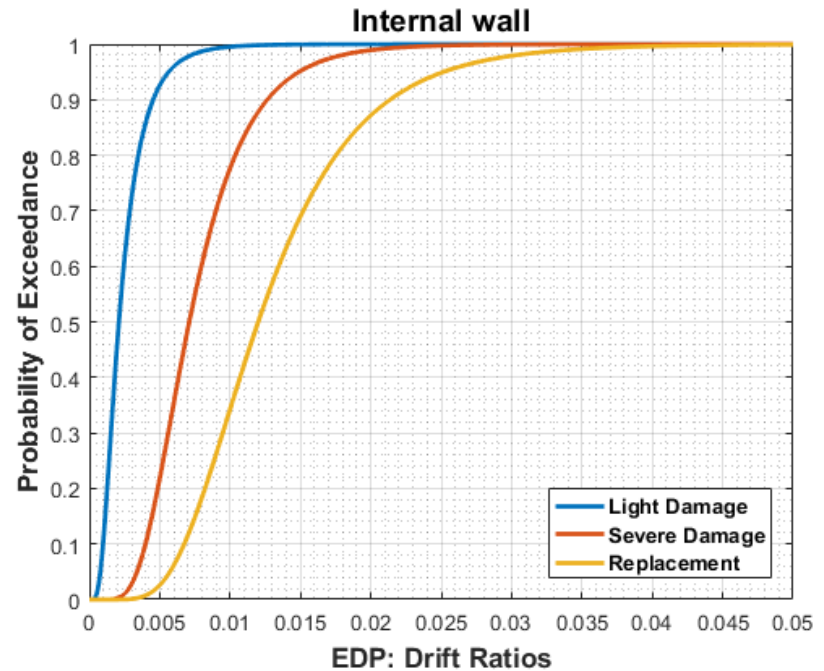
| Description | Location |
|--------------------------|------------------|
| Interior Wall Assembly 1 | Floor 2, Bay 1-2 |
| Interior Wall Assembly 2 | Floor 1, Bay 1-2 |

Assembly Inventory

m



Damage Module





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LOSS MODULE

FUNCTION:

Assess maintenance/repair/replacement and downtime costs

APPROACH:

Assembly-based vulnerability methodology

INPUTS:

Probabilities of occurrence of damage states

OUTPUTS:

Repair cost, material, downtime

DATA SOURCES:

FEMA cost, repair, downtime functions

KEY FEATURE:

Supports regional cost functions

| DAMAGE LEVEL | COST |
|----------------|----------------|
| Repair Level 1 | \$25/sq. foot |
| Repair Level 2 | \$50/sq. foot |
| Repair Level 3 | \$100/sq. foot |
| Replacement | \$200/sq. foot |





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LOSSES: WORKING EXAMPLE

EXAMPLE BUILDING



2-Story, 4-room RC
Frame in St. Louis, MO

REPRESENTATION

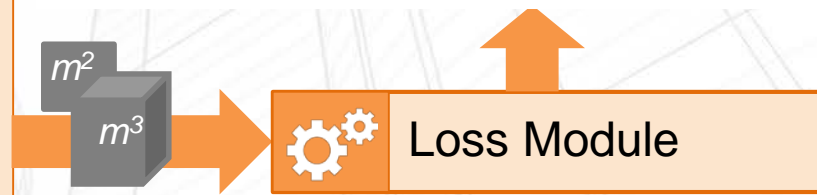
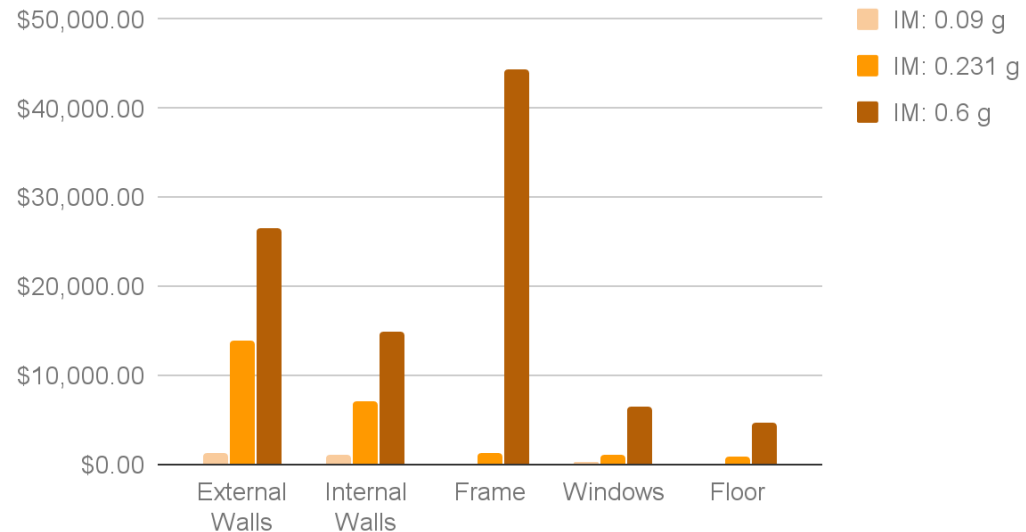
Description

Interior Wall
Assembly 1

Interior Wall
Assembly 2

Components @ Specific
Locale

Total Repair Cost [USD]





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OPERATING ENERGY MODULE

FUNCTION:

Asses operating energy of building within a given climate

APPROACH:

Calculation of heat flux based on material and spatial properties (lumped capacitance model)

INPUTS:

GBXML File

OUTPUTS:

Monthly energy consumption

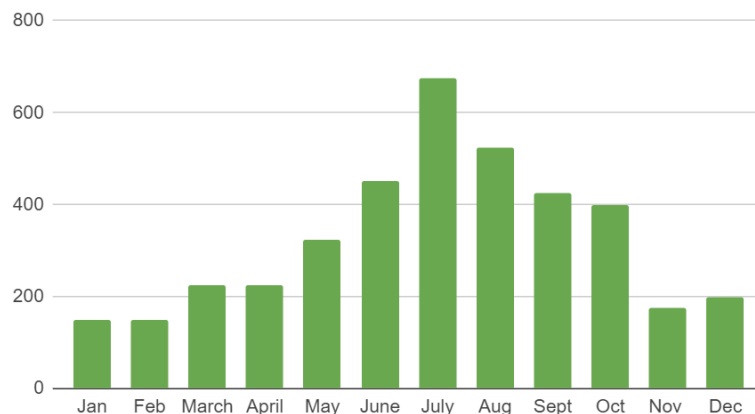
DATA SOURCES:

Energy Plus climatology data

KEY FEATURE:

Customizable thermal properties

Monthly Operating Energy [MBTU]





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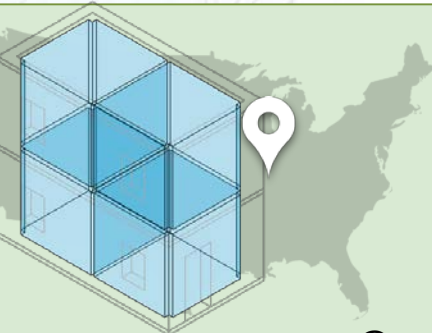
OPERATING ENERGY: WORKING EXAMPLE

EXAMPLE BUILDING



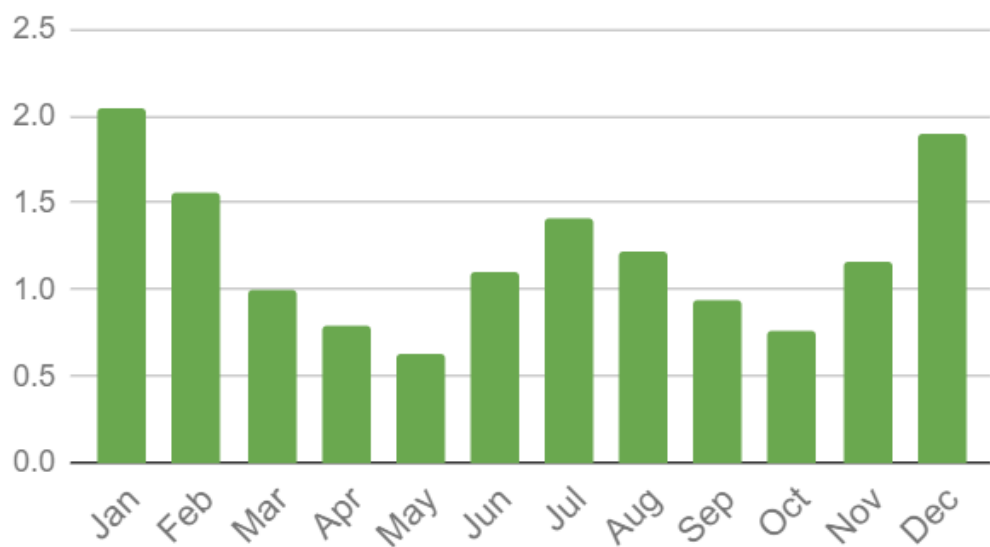
2-Story, 4-room RC
Frame in St. Louis, MO

REPRESENTATION



Enclosed Volumes @
Specific Locale

Monthly Operating Energy [MBTU]





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EMBODIED ENERGY MODULE

FUNCTION:

Calculates building component embodied energy

APPROACH:

Linked data relates model's component assemblies to energy embodied in component production, transport, etc.

INPUTS:

GBXML file

OUTPUTS:

Component-level embodied energy

DATA SOURCES:

Linked open databases, product declarations

KEY FEATURE:

Full accounting of energy embodied in component life cycle

Embodied Energy [MBTU]





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EMBODIED ENERGY: WORKING EXAMPLE

EXAMPLE BUILDING



2-Story, 4-room RC Frame in St. Louis, MO

REPRESENTATION

Description

Interior Wall Assembly 1

Interior Wall Assembly 2

Assembly Inventory @ Specific Locale



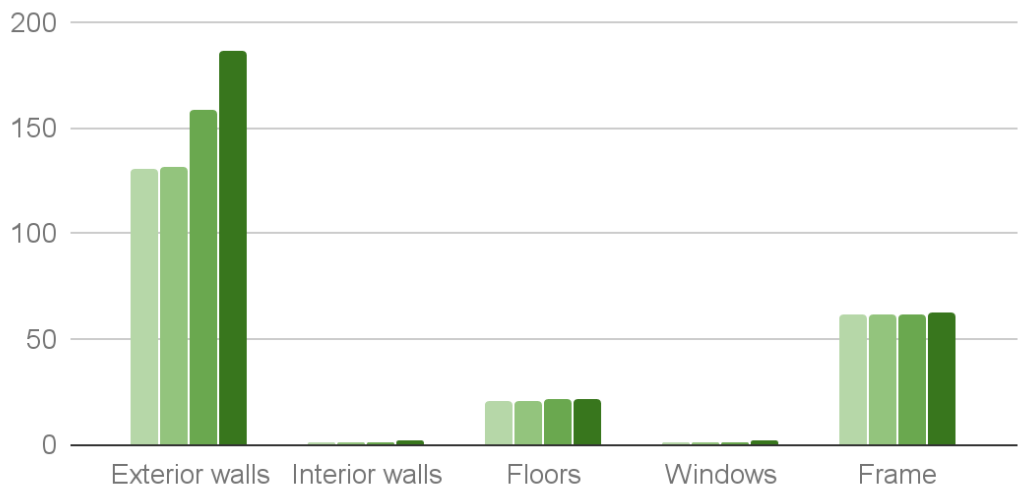
m³



Embodied Energy Module

Embodied Energy [MBTU]

Initial 10 Years 30 Years 50 Years





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POST PROCESSING MODULE

FUNCTION:

Comparative evaluation of component contributions to project's resilience and sustainability goals

APPROACH:

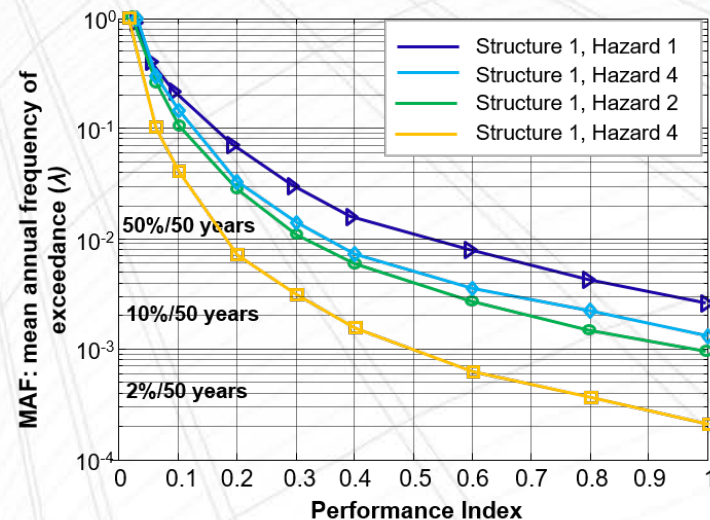
Present results over varying service lives to support decision making, evaluation of design alternatives

OUTPUTS:

Total Embodied Energy, Operational Energy, Losses (dollars, downtime)

KEY FEATURE:

Identifies components that drive hazard resilience and sustainability metrics





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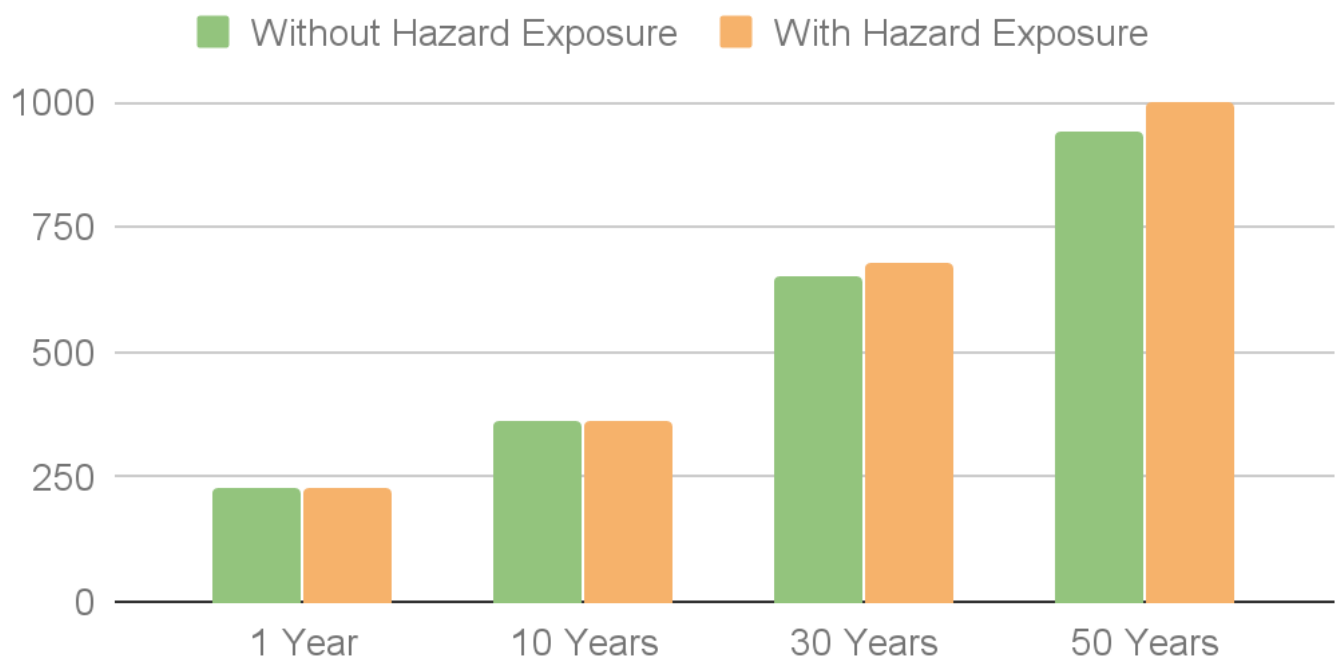
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COMPARATIVE ANALYSIS: INFLUENCE OF HAZARD EXPOSURE

Total Energy [MBTU]





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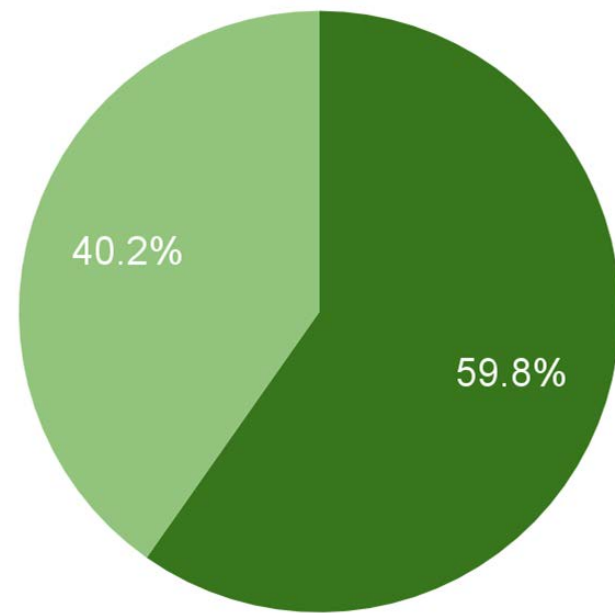
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COMPARATIVE ANALYSIS: INFLUENCE OF HAZARD EXPOSURE

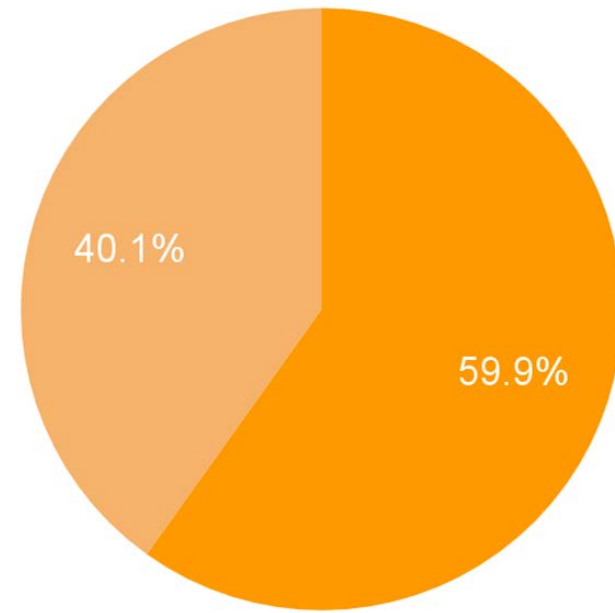
WITHOUT HAZARD EXPOSURE (10 YEARS)

● Embodied Energy ● Operating Energy



WITH HAZARD EXPOSURE (10 YEARS)

● Embodied Energy ● Operating Energy





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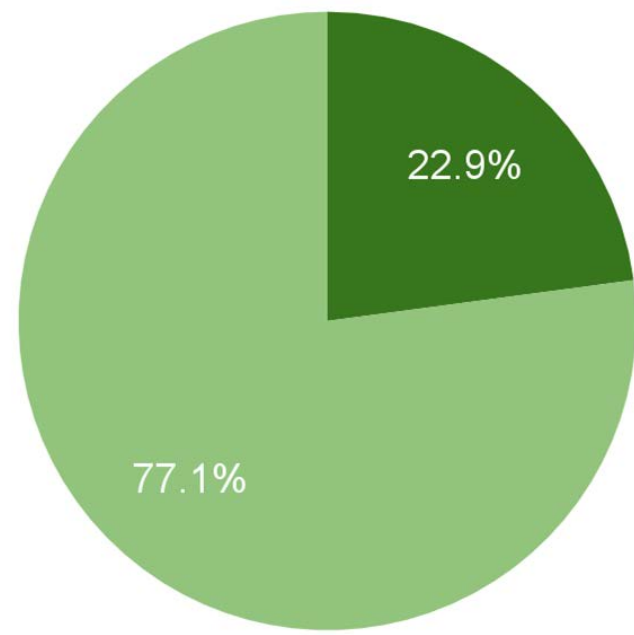
CONFERENCE & EXPO



COMPARATIVE ANALYSIS: INFLUENCE OF HAZARD EXPOSURE

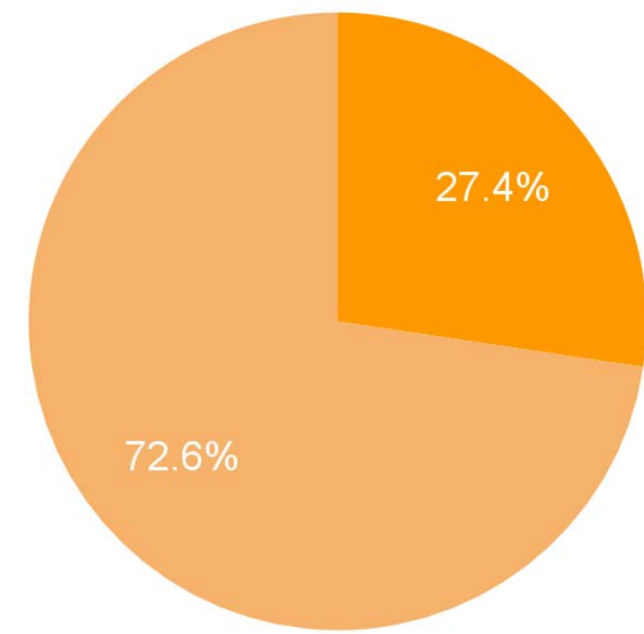
WITHOUT HAZARD EXPOSURE (50 YEARS)

● Embodied Energy ● Operating Energy



WITH HAZARD EXPOSURE (50 YEARS)

● Embodied Energy ● Operating Energy





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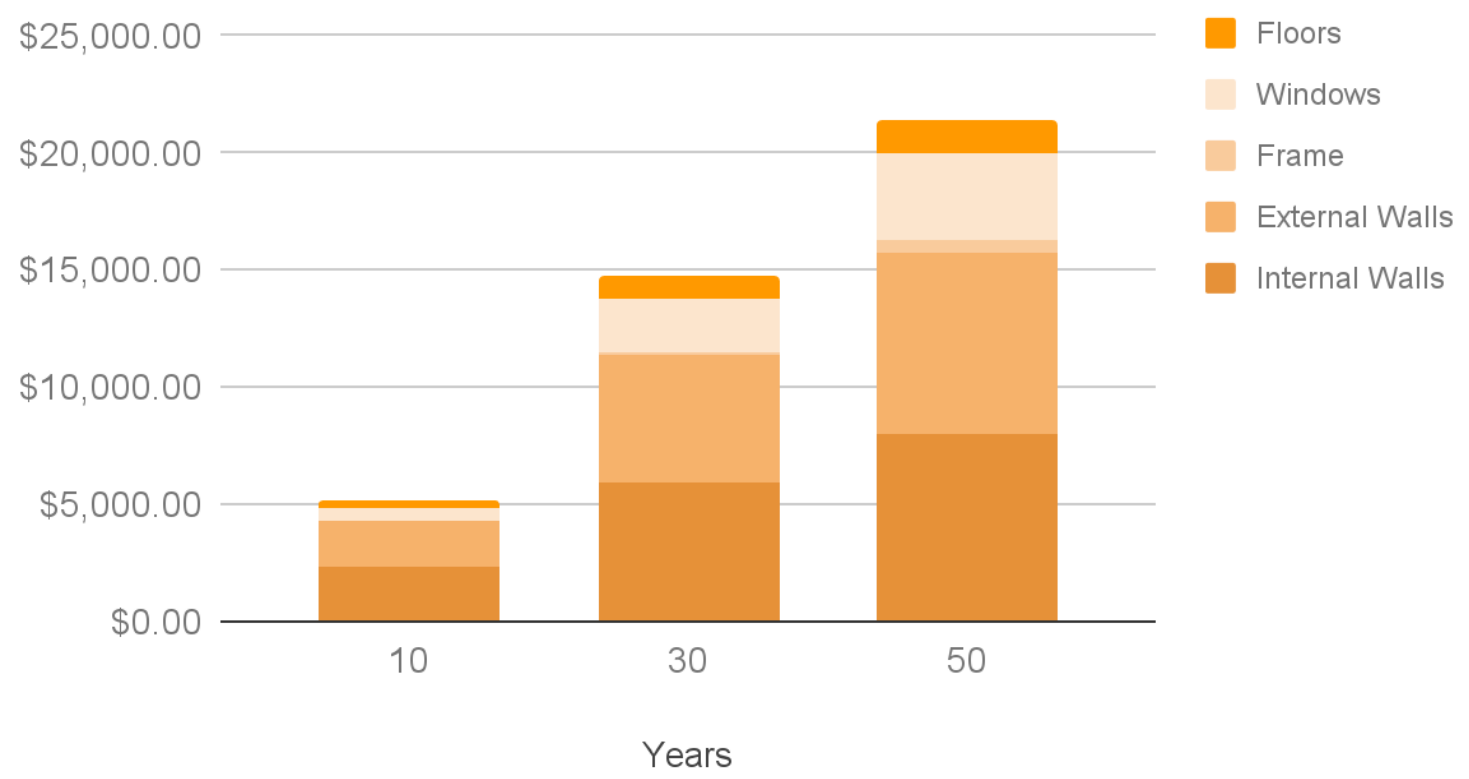
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COMPARATIVE ANALYSIS: RESILIENCE METRICS

Average Total Repair Cost [USD]





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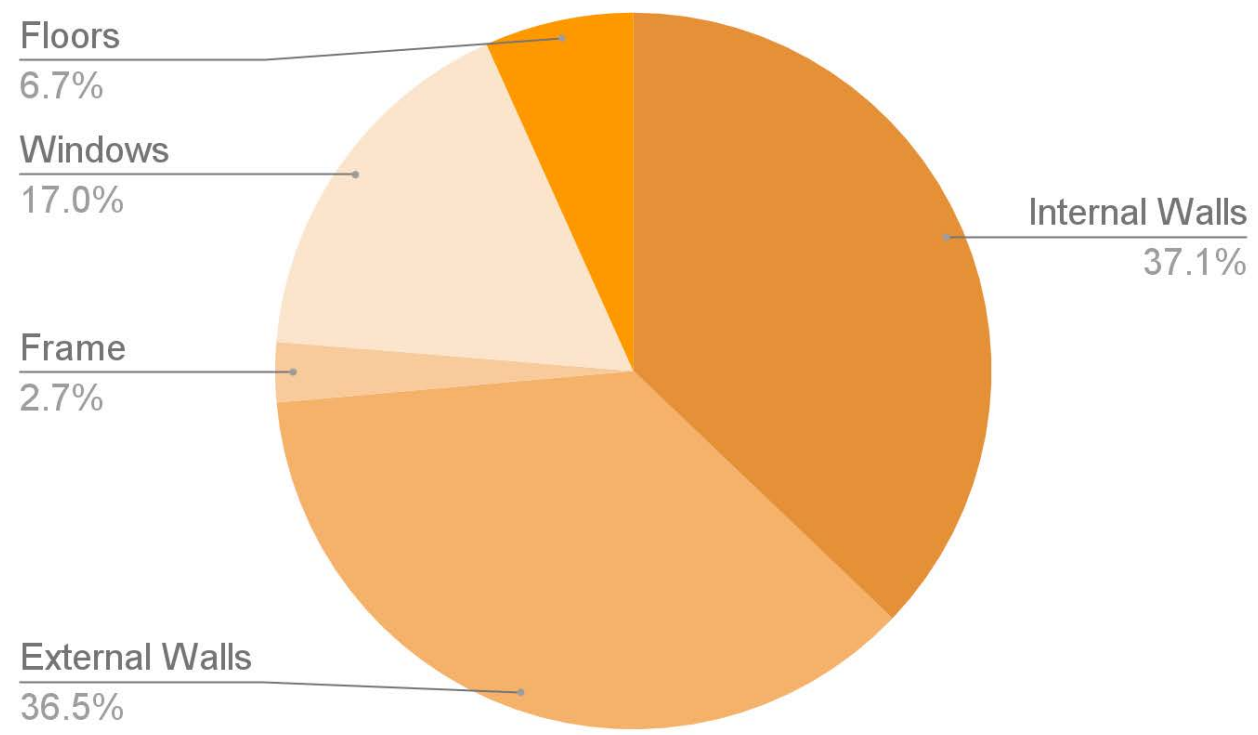
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COMPARATIVE ANALYSIS: RESILIENCE METRICS

Assembly Repair Costs (50 years)





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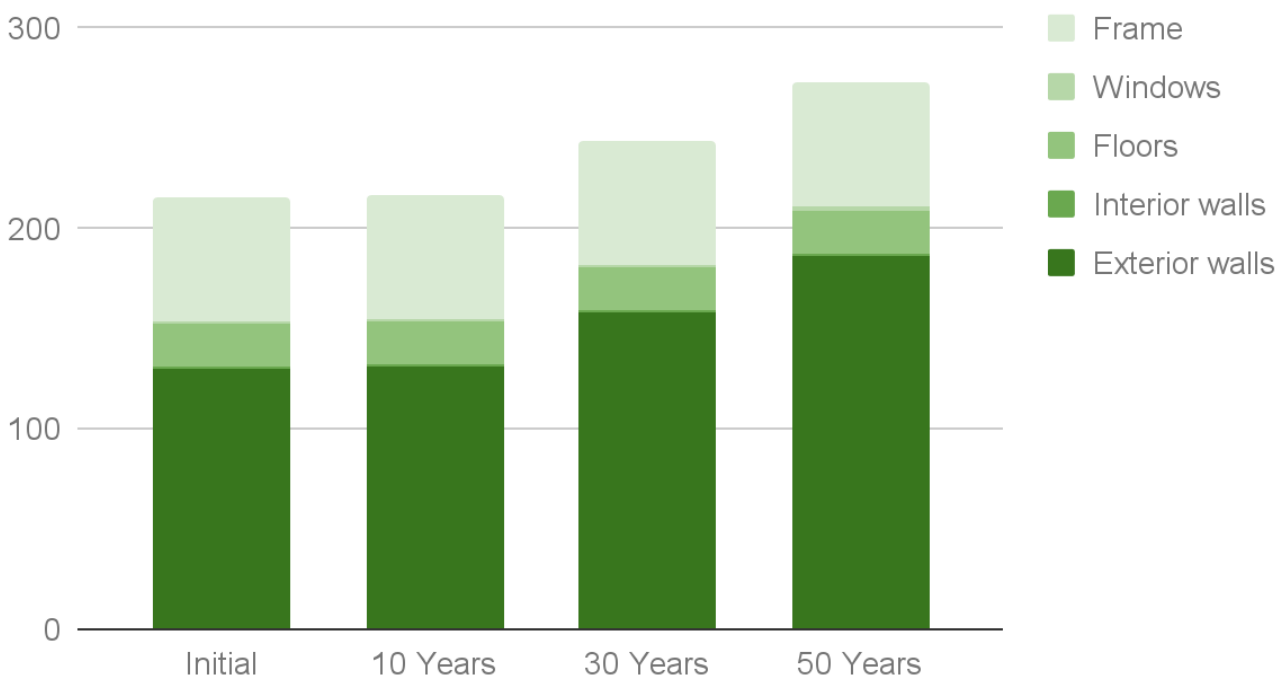
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COMPARATIVE ANALYSIS: SUSTAINABILITY METRICS

Embodied Energy [MBTU]





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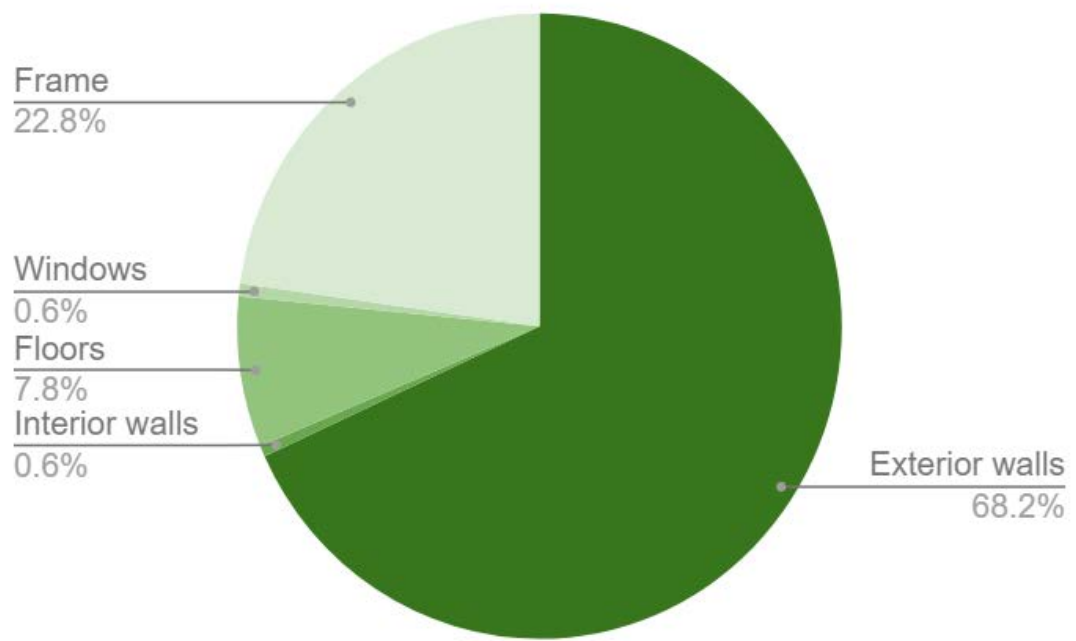
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COMPARATIVE ANALYSIS: SUSTAINABILITY METRICS

Embodied Energy (50 Years)





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Summary

- Integrated Life Cycle Analysis interfaced to Revit modeling environment
- Modular: build and expand over time
- Enables evaluation of damage due to site-specific hazards, deterioration
 - Repair and replacement costs, downtime
 - Embodied and operational energy
- Identifies component-level impacts
- Accommodates user-supplied and regional data, full component life cycle



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Green-Scale Resilience: Technology Can Build and Connect Community

PRESENTER: Charles Vardeman

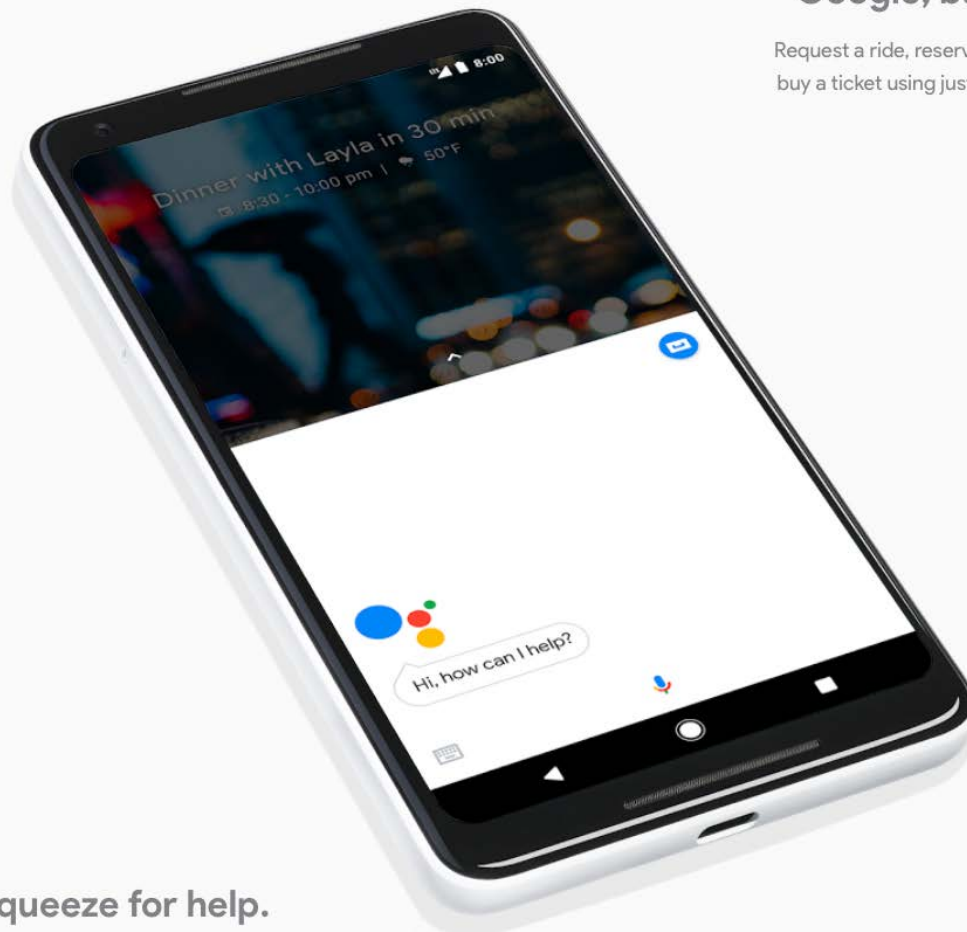


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Slight digression in our story...



Google, built in.

Request a ride, reserve a table and
buy a ticket using just your voice.⁵

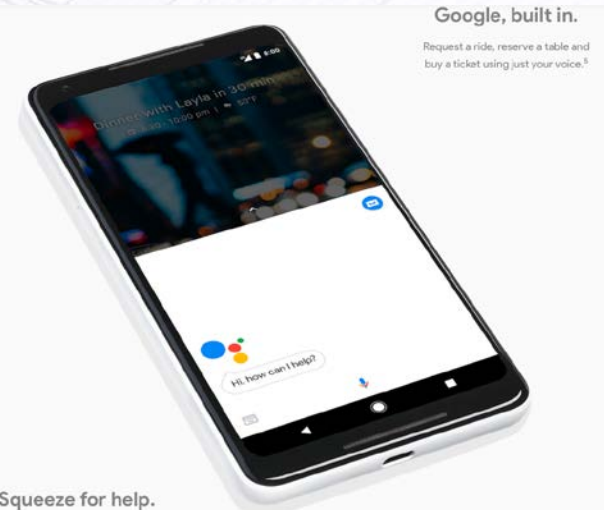
Squeeze for help.

https://store.google.com/us/product/pixel_2?hl=en-US

Actually, more of a story about these...



<https://www.apple.com/ios/siri/>



https://assistant.google.com/intl/en_us/



Save time and effort with Cortana,
your intelligent assistant.

<https://www.microsoft.com/en-us/cortana/?>

Which would not have possible without what happened here...



Source: Charles F. Vardeman II, License: (CC BY-SA 2.0)



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Source: W3C20 Anniversary Symposium,
<https://www.w3.org/20>



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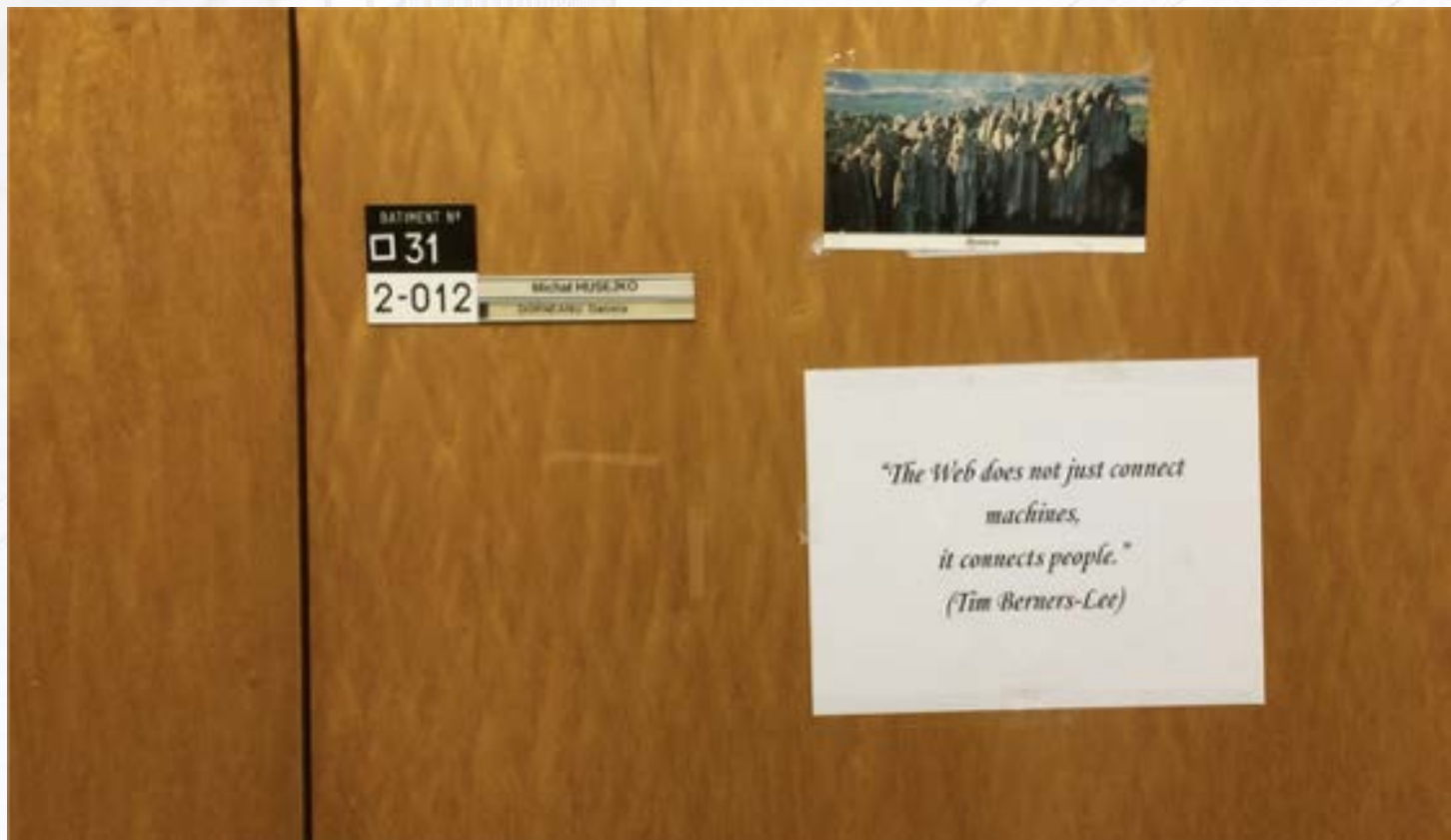
Source: W3C20 Anniversary Symposium,
<https://www.w3.org/20>



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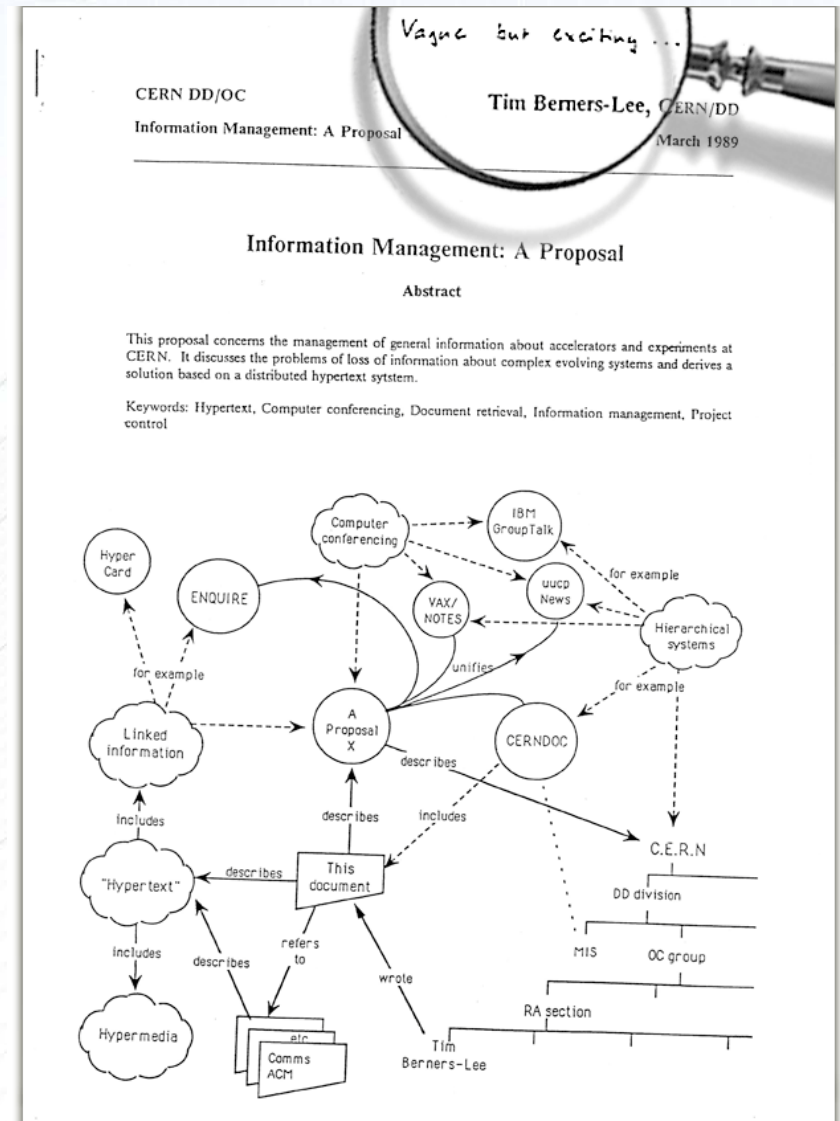
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Source: Charles F. Vardeman II, License
(CC BY-SA 2.0)

Tim Berners-Lee March 1989 Notice: Subject-Predicate-Object Graph (SPO)

Source:
<http://info.cern.ch/Proposal.html>





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“ The real power of the Semantic Web will be realized when people create many programs that collect Web content from diverse sources, process the information and exchange the results with other programs. ”

Image Source: <http://hi-project.org/blog/>

Tim Berners-Lee, James Hendler, Ora Lassila. “The Semantic Web.” *Scientific American* 284, no. 5 (2001): 28-37.

<https://www.scientificamerican.com/article/the-semantic-web/>



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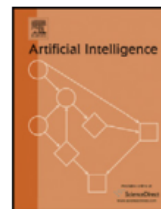


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Artificial Intelligence

www.elsevier.com/locate/artint



From the Semantic Web to social machines: A research challenge for AI on the World Wide Web

Jim Hendler^{a,*}, Tim Berners-Lee^b

^a Tetherless World Constellation, RPI, United States

^b Computer Science and AI Laboratory, MIT, United States

ARTICLE INFO

Article history:

Received 24 September 2009

Received in revised form 1 October 2009

Accepted 1 October 2009

Available online 17 November 2009

ABSTRACT

The advent of social computing on the Web has led to a new class of applications that are powerful and world-changing. However, we are at the beginning of this age of “social machines” and that their continued growth requires the cooperation of Web and AI researchers. In this paper, the growing Semantic Web provides necessary support for these technologies. We see the challenges we see in bringing the technology to the next level, and propose places for the research.

© 2009 Elsevier B.V.



Social Machines

The Coming Collision of
Artificial Intelligence,
Social Networking, and Humanity

James Hendler
Alice M. Mulvehill

apress®



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That's great!
So, why haven't I heard of this
semantic web thingy?



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the answer company

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Home > Press Releases > Thomson Reuters Launches first of its kind Knowledge Graph Feed

OCT 23, 2017

Thomson Reuters Launches first of its kind Knowledge Graph Feed allowing Financial Services customers to accelerate their AI and Digital Strategies

Graph network of 2 billion relationships brings to life a comprehensive view of the financial ecosystem so that users can uncover new, unexpected or difficult to find insights from connected data.

Source:

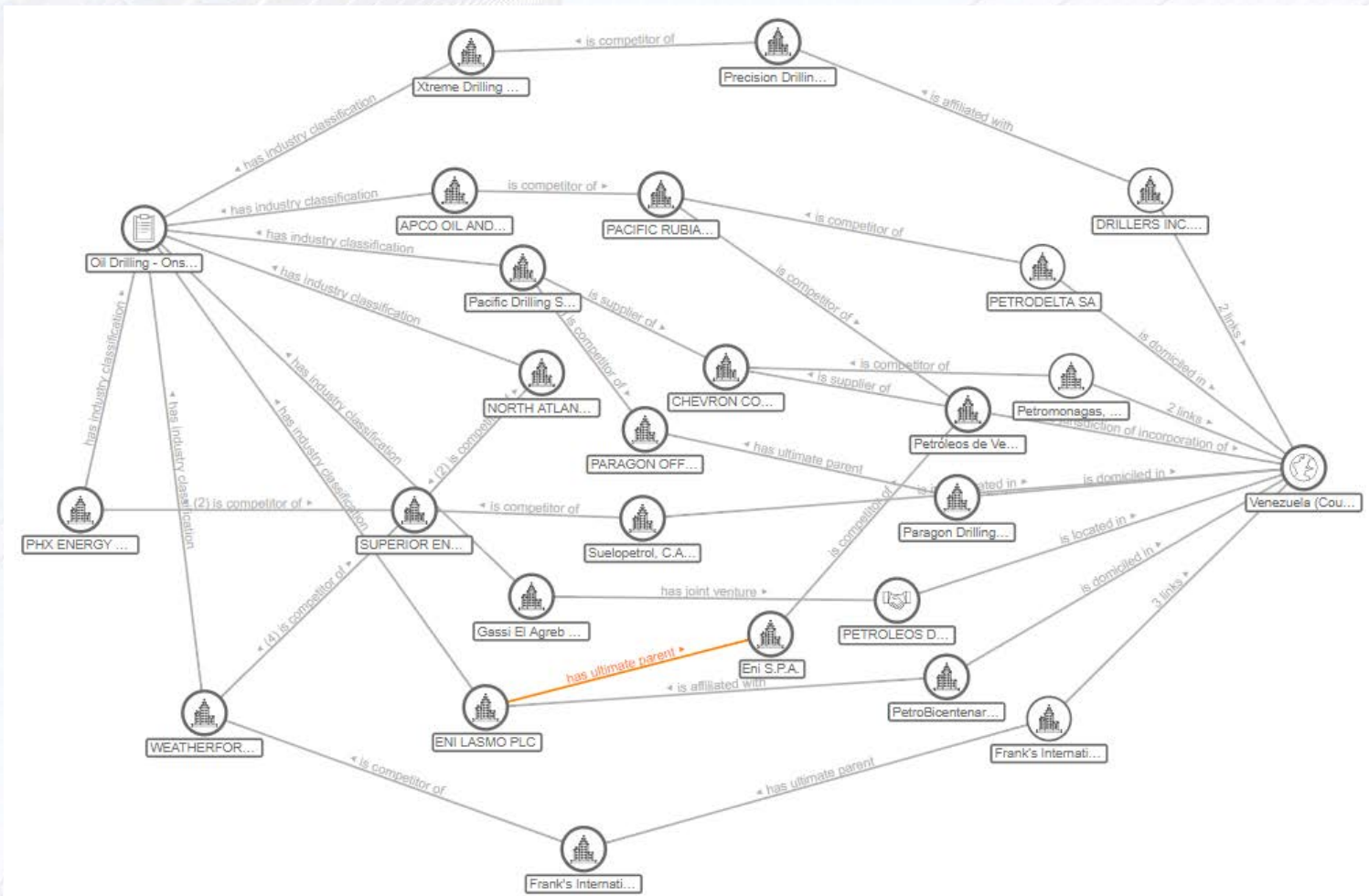
<https://www.thomsonreuters.com/en/press-releases/2017/october/thomson-reuters-launches-first-of-its-kind-knowledge-graph-feed.html>



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Source:

<http://financial-risk-solutions.thomsonreuters.info/KnowledgeGraphFeed>



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Amazon Neptune

Fast, reliable graph database built for the cloud

Sign up for Preview

Source:

<https://aws.amazon.com/neptune/>



Google Inside Search

Home How Search Works Tips & Tricks Features Search Stories Playground Blog Help



The Knowledge Graph

Learn more about one of the key breakthroughs behind the future of search.



Tim Berners-Lee

Computer scientist

Sir Timothy John Berners-Lee OM KBE FRS FREng FRSA FBCS, also known as TimBL, is an English engineer and computer scientist, best known as the inventor of the World Wide Web. [Wikipedia](#)

Born: June 8, 1955 (age 62), London, United Kingdom

Awards: Order of the British Empire, Royal Medal, Turing Award, MORE

Education: The Queen's College, Oxford (1973–1976), Emanuel School (1969–1973), Sheen Mount Primary School

Spouse: Rosemary Leith (m. 2014), Nancy Carlson (m. 1990–2011)

Books

- | | | | | |
|---|---|---|---|---|
|  |  |  |  |  |
| Weaving the Web: The Ori... 1999 | Weaving the Web: The Past... 1999 | A Framework for Web S... 2006 | Leaders in Computing: Changing... 2006 | Foundations and Trends: a... 2006 |

Profiles



See it in action

Discover answers to questions you never thought to ask, and explore collections and lists.



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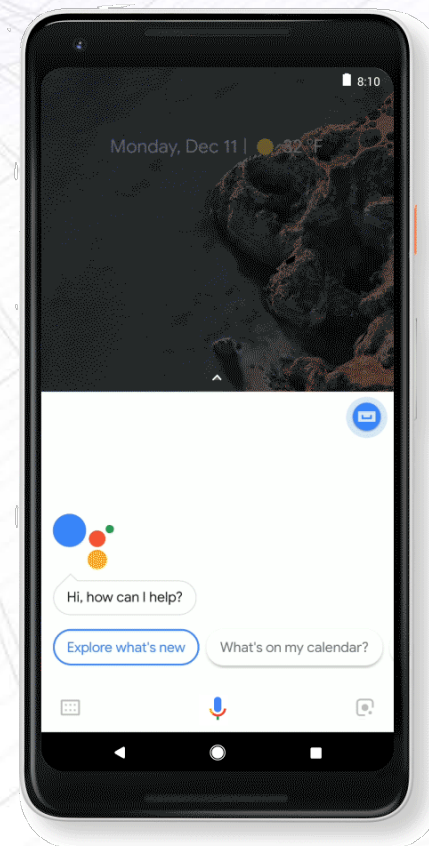
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Search what you see

Pixel 2 owners will also get an exclusive preview of Google Lens—a new set of visual smarts that help you learn more about the world around you and get things done. Lens builds on Google’s advancements in computer vision and ML, combined with our Knowledge Graph which underpins Google Search. From day one, on your Pixel 2, you’ll be able to look up landmarks, books, music albums, movies and artwork by clicking on the Lens icon in Google Photos. You can also use Google Lens to copy URLs and contact info from a picture of a poster or business card. We’ll add capabilities on an ongoing basis, including the use of Lens in the Google Assistant.

<https://blog.google/products/pixel/new-pixel-2/>



<https://blog.google/products/assistant/learn-more-about-world-around-you-google-lens-and-assistant/>

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Watson

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Use Cases ▾

Get Started Free

With Watson you can enrich your interactions.

Use AI to deliver an
exceptional customer
experience and transform
your call center.

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[From the blog](#) [Summit session previews](#) [Read more →](#)

[Service changes and upgrades to Watson Tone Analyzer](#)



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Watson



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Watson

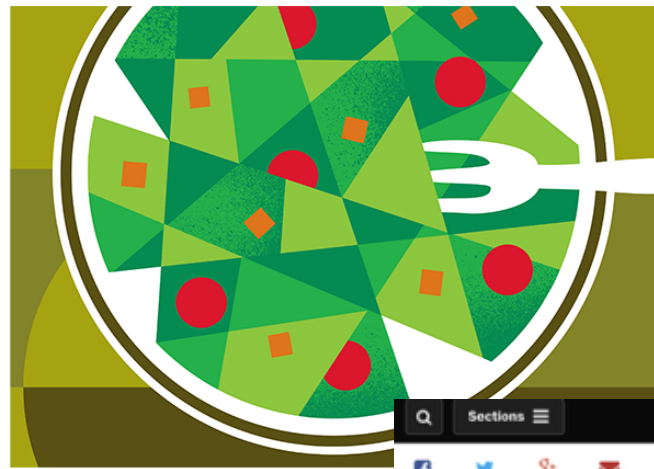
Source:

<https://www.ibm.com/watson/>

PUBLISHED BY **IBM**

Better than Cookbooks: Computers Could Make Healthy Eating More Palatable

By *Florian Pinel*



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The Washington Post





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What if the food of the future was made with technology; with the tools and supplies

Innovations

How IBM Watson helped me to create a tastier burrito than Chipotle

   2  Save for Later  Reading List

Source:

http://www.slate.com/articles/technology/ibm/2014/11/better_than_cookbooks_computers_could_make_healthy_eating_more_palatable.html

IBM Chef Watson with bon appétit



Ready to do some cognitive cooking?



Discover and create unique dishes with Chef Watson and share with your friends!

LET'S GET COOKING

#chefwatson #cognitivecooking



#chefwatson #cognitivecool

Search



Bjorn Watsjold
@docbjorn



@DrMcInnisDIT You can always try #chefwatson and trust our future AI overlords

4 days ago



1



Shira.net Bellydance
@shiradotnet



I'm thinking about trying this Chef Watson recipe for Thanksgiving dinner. It has butternut squash, onion, bell pep... <https://t.co/Ckzf38f9La>

5 days ago



2

IBM

PRIVACY TERMS



Source: <https://www.ibmchefwatson.com/community>



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“Chef Watson” is helping to explore possibilities that would not have otherwise been considered

“Let’s take a look at how this works.

Over the past couple of years, we created a food knowledge database that contains recipes, **ingredient ontology**, and nutritional facts and characteristics of the flavor compounds contained in different ingredients. We then developed a system that asks for a few inputs about a dish you want to make, such as the key ingredients, cuisine, and dish type. The system then produces hundreds of never-before-seen recipe ideas accordingly, complete with proportions and instructions.”

Source:

http://www.slate.com/articles/technology/ibm/2014/11/better_than_cookbooks_computers_could_make_healthy_eating_more_palatable.html



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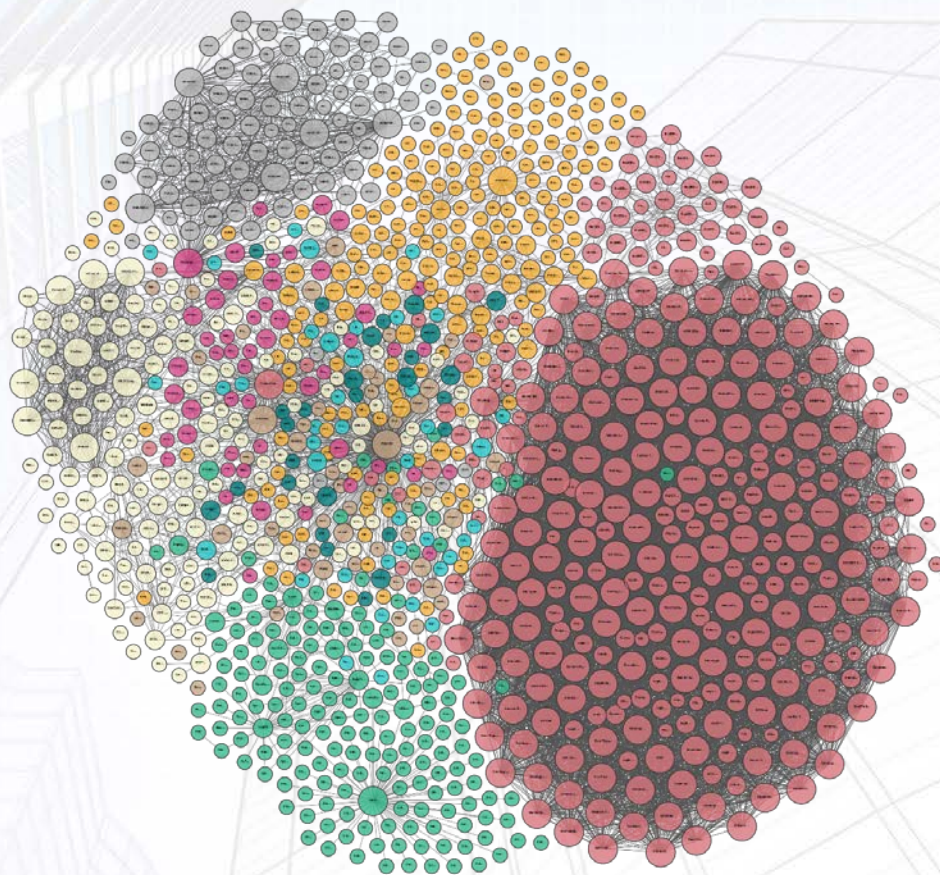
Problem, these are largely
proprietary Knowledge Bases BUT
they are built on PUBLIC DATA



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"Linking Open Data cloud diagram 2017, by Andrejs Abele, John P. McCrae, Paul Buitelaar, Anja Jentzsch and Richard Cyganiak. <http://lod-cloud.net/>" License: CC-BY-SA



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Source: Picture, Mike Gogulski (CC BY 2.5).

Krzysztof Janowicz, Frank van Harmelen, James A. Hendler, and Pascal Hitzler. "Why the Data Train Needs Semantic Rails." *AI Magazine*, 2014.

<http://corescholar.libraries.wright.edu/cse/169/>.



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KEY IDEA: Use *Structured Data*
(Ontologies) based *Knowledge*
Graphs as basis for information flow
in computational models

A definition from Siri's Dad!

An **Ontology** is an *explicit specification of a conceptualization*¹

Human $\leftarrow \rightarrow$ Computer

¹Tom Gruber, "What is an Ontology?", <http://www-ksl.stanford.edu/kst/what-is-an-ontology.html>



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How can we use Community to
capture SHARED Conceptualization?

Effort between domain experts, facilitators who understand some of the domain and some modeling and formal logics experts to encapsulate concepts

Ontology modeling with domain experts: The GeoVoCamp experience

Pascal Hitzler¹, Krzysztof Janowicz², and Adila A. Krisnadhi^{1,3}

¹ Wright State University, OH, USA

² University of California, Santa Barbara, USA

³ Faculty of Computer Science, Universitas Indonesia

Abstract. A series of GeoVoCamps, run at least twice a year in locations in the U.S., have focused on ontology design patterns as an approach to inform metadata and data models, and on applications in the GeoSciences. In this note, we will redraw the brief history of the series as well as rationales for the particular approach which was chosen, and report on the ongoing uptake of the approach.

1 Introduction: GeoVoCamps

Since Spring 2012, a series of GeoVocamps has been held in the U.S. which used a modeling approach driven by ontology design patterns (ODPs). In terms of topics they have mostly (but not exclusively) stayed close to the GeoSciences and related disciplines. Events have been held annually in Spring in Santa Barbara, CA, and in Fall in the eastern U.S., mostly in the Washington D.C. area, with additional occasional events in locations such as Notre Dame, IN, or Dayton, OH. Each event usually drew between 20 and 30 participants, including 8-10 “regulars” which come very frequently to the events.

GeoVoCamps are *unconferences*, and as such are loosely structured, with the actual program decided upon by the participants on the spot. Starting with the Santa Barbara event 2012, the organizers suggested to use ontology design patterns as modeling approach, and indeed most of the work at these GeoVocamps has adopted this since.



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A Modification to the Hazardous Situation ODP to Support Risk Assessment and Mitigation

Michelle Cheatham¹, Holly Ferguson², Charles Vardeman II², and Cogan Shimizu¹

¹ Wright State University

{michelle.cheatham,cogan.shimizu}@wright.edu

² University of Notre Dame

{hfergus2,cvardema}@nd.edu

Abstract. The Hazardous Situation ontology design pattern models the consequences of exposure of an object to a hazard. In its current form, the ODP is well suited for representing the consequences of exposure after the fact, which is very useful for applications such as damage assessment and recovery planning. In this work, we present a modification to this pattern that enables it to additionally support proactive questions central to risk assessment and mitigation planning.

Keywords: hazard, ontology design pattern, risk assessment, risk mitigation

Cheatham, M., Ferguson, H., Vardeman II, C., and Shimizu, C., **A Modification to the Hazardous Situation ODP to Support Risk Assessment and Mitigation**, In Workshop on Ontology Design Patterns (WOP), 2016.

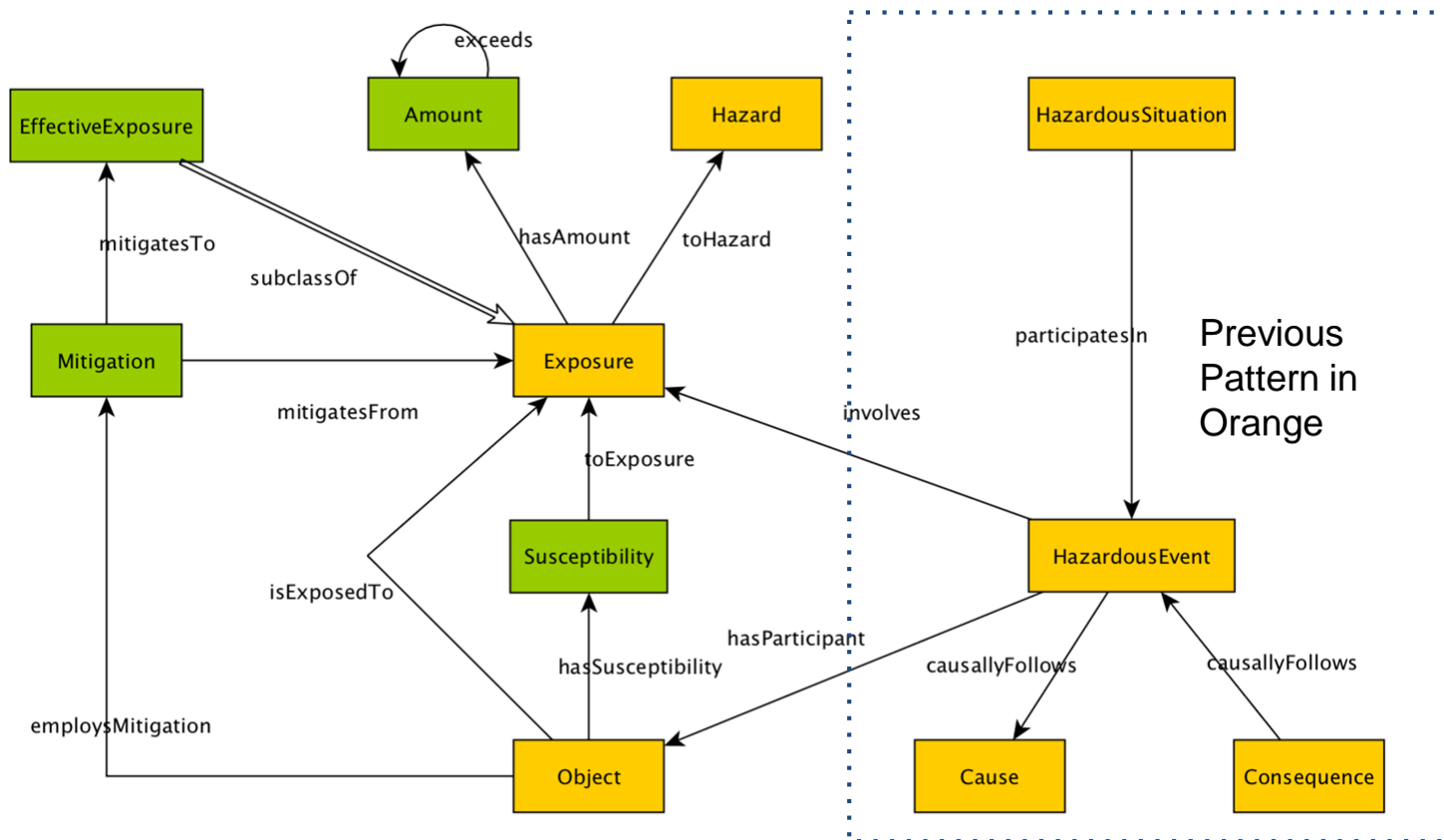


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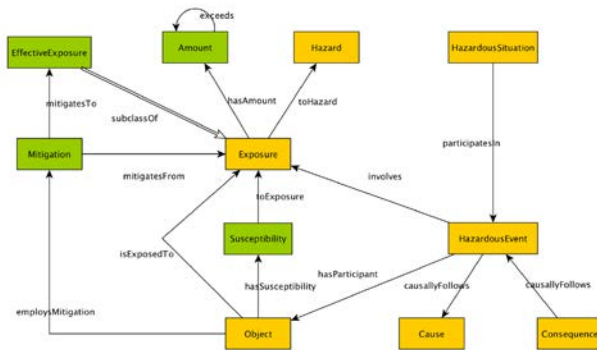
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“Modified” Hazardous Situation builds on other Patterns!



Conceptualization



Formalization (Math)

$\text{HazardousSituation} \sqsubseteq \exists \text{participantIn.HazardousEvent}$
 $\text{HazardousEvent} \equiv \exists \text{hasParticipant.}(\text{Object} \sqcap \exists \text{exposedTo.Hazard})$
 $\text{HazardousEvent} \sqsubseteq \exists \text{hasQuality.Exposure}$
 $\text{HazardousEvent} \sqsubseteq \exists \text{hasDuration.TimeInterval}$
 $\text{HazardousEvent} \sqsubseteq \exists \text{causallyFollows.Cause}$
 $\text{Consequence} \sqsubseteq \exists \text{causallyFollows.HazardousEvent}$
 $\text{Cause} \sqsubseteq \text{Event}$
 $\text{HazardousEvent} \sqsubseteq \text{Event}$
 $\text{Consequence} \sqsubseteq \text{Event}$

Specification in the
Web Ontology
Language OWL
(Share your KG)

```

1 @prefix : <http://daselab.cs.wright.edu/ontologies/ModifiedHazardousSituationInstance#> .
2 @prefix owl: <http://www.w3.org/2002/07/owl#> .
3 @prefix rdf: <http://www.w3.org/1999/02/22-rdf-syntax-ns#> .
4 @prefix xml: <http://www.w3.org/XML/1998/namespace> .
5 @prefix xsd: <http://www.w3.org/2001/XMLSchema#> .
6 @prefix rdfs: <http://www.w3.org/2000/01/rdf-schema#> .
7 @base <http://daselab.cs.wright.edu/ontologies/ModifiedHazardousSituationInstance#> .
8
9
10 ## http://daselab.cs.wright.edu/ontologies/ModifiedHazardousSituation#Amount
11 <http://daselab.cs.wright.edu/ontologies/ModifiedHazardousSituation#Amount> rdf:type owl:Class .
12
13 ## http://daselab.cs.wright.edu/ontologies/ModifiedHazardousSituation#Consequence
14 <http://daselab.cs.wright.edu/ontologies/ModifiedHazardousSituation#Consequence> rdf:type owl:Class .
15
16 ## http://daselab.cs.wright.edu/ontologies/ModifiedHazardousSituation#EffectiveExposure
17 <http://daselab.cs.wright.edu/ontologies/ModifiedHazardousSituation#EffectiveExposure> rdf:type owl:Class .
18
19 ## http://daselab.cs.wright.edu/ontologies/ModifiedHazardousSituation#Exposure
20 <http://daselab.cs.wright.edu/ontologies/ModifiedHazardousSituation#Exposure> rdf:type owl:Class .
21
22 ## http://daselab.cs.wright.edu/ontologies/ModifiedHazardousSituation#Hazard
23 <http://daselab.cs.wright.edu/ontologies/ModifiedHazardousSituation#Hazard> rdf:type owl:Class .
24
25 ## http://daselab.cs.wright.edu/ontologies/ModifiedHazardousSituation#Mitigation
26 <http://daselab.cs.wright.edu/ontologies/ModifiedHazardousSituation#Mitigation> rdf:type owl:Class .
27
28 ## http://daselab.cs.wright.edu/ontologies/ModifiedHazardousSituation#Object
29 <http://daselab.cs.wright.edu/ontologies/ModifiedHazardousSituation#Object> rdf:type owl:Class .
30

```

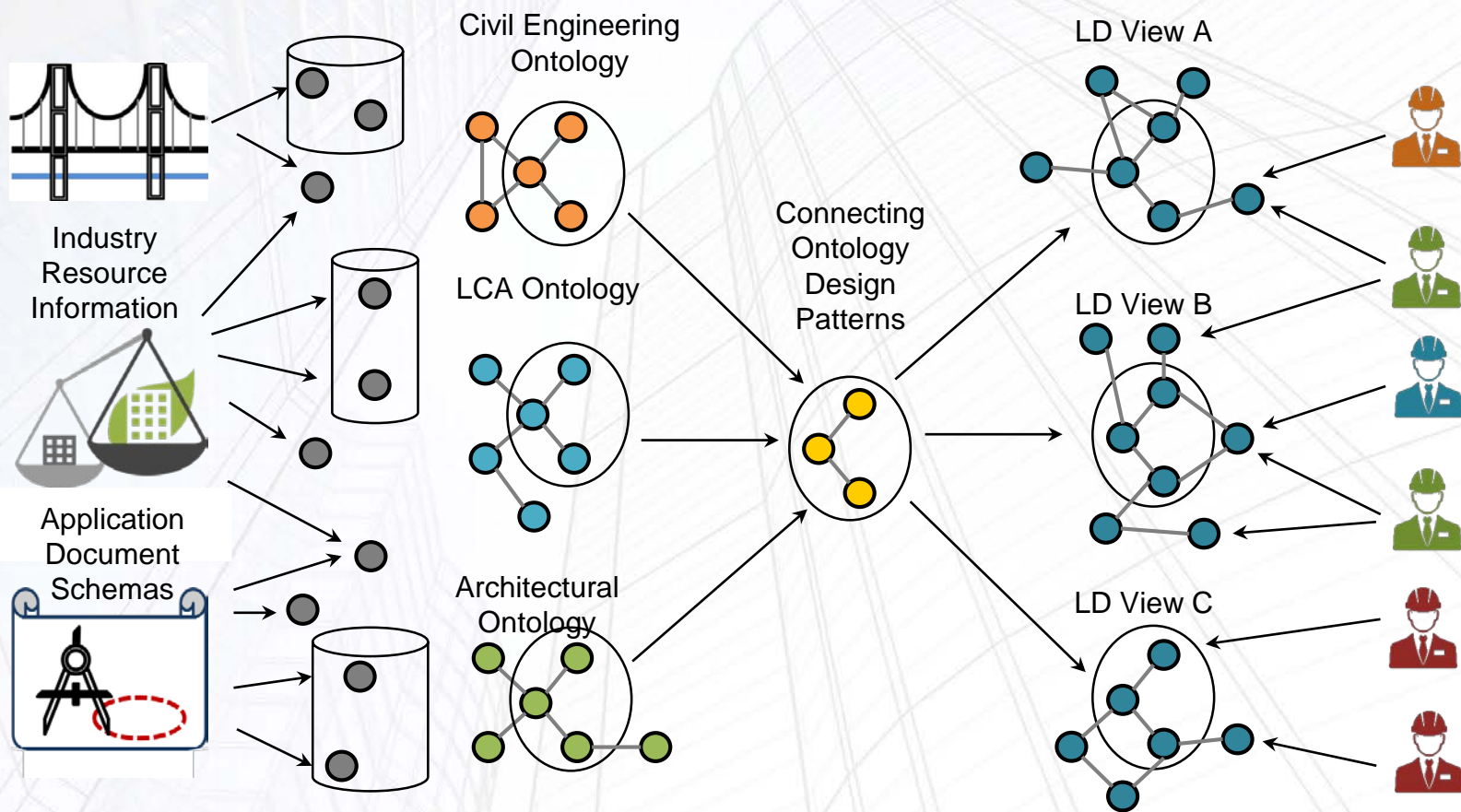



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Linked Data Views & Ontology Design Patterns



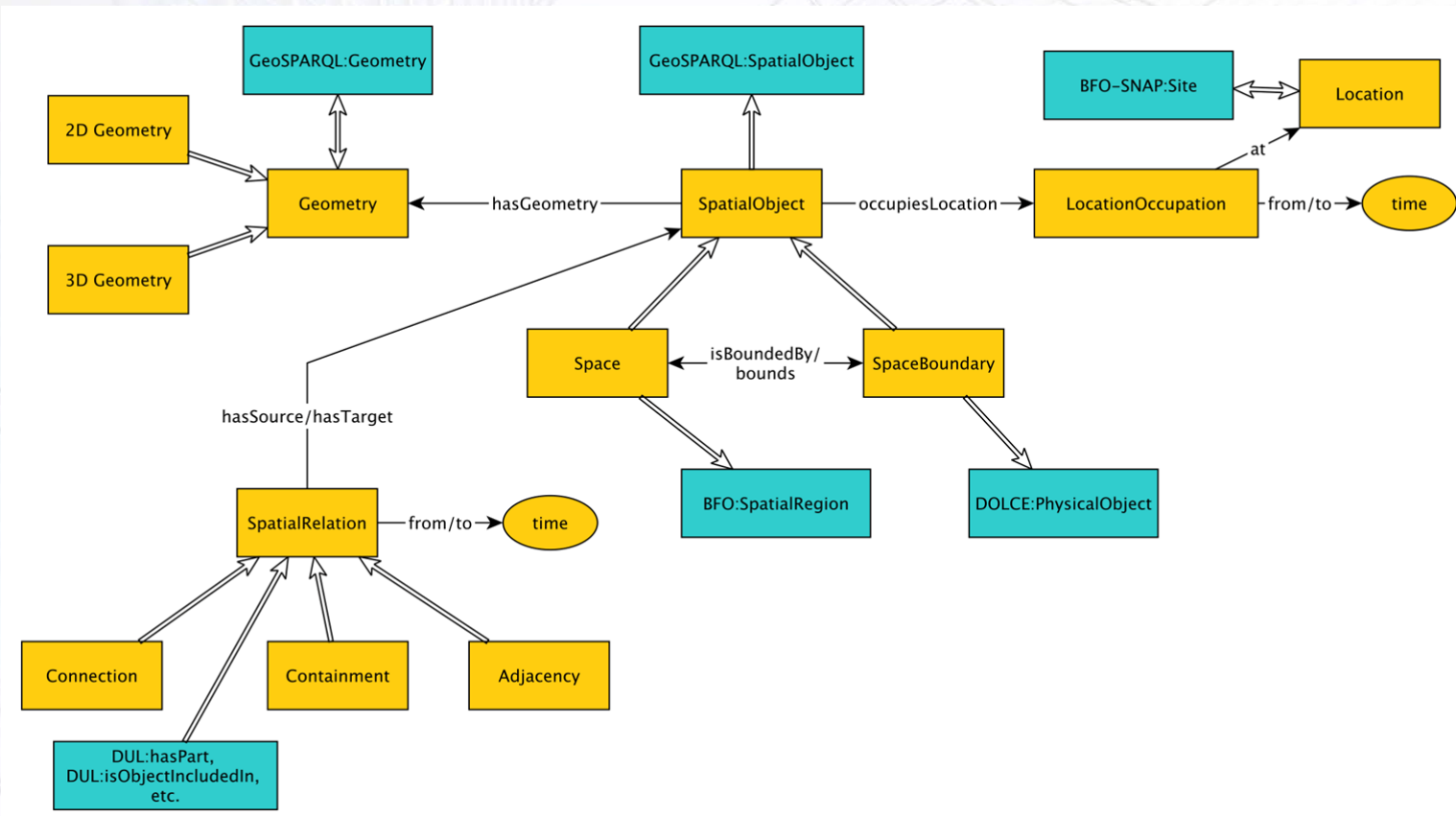


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Spatial Collections and Geometry





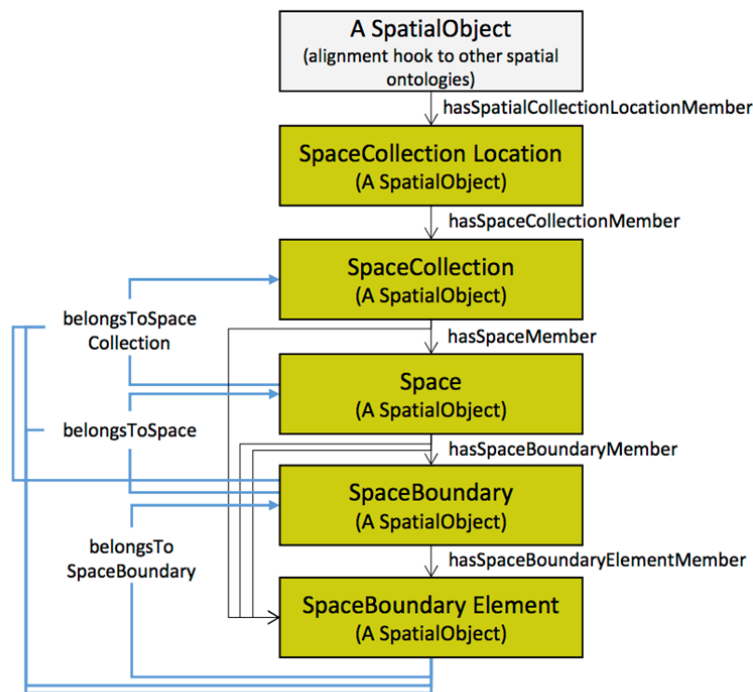
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Geometries to Collections

Top Level Spatial Hierarchy for the Organization of BIM Related Geometric Elements



| Spatial Object Types | Definition in Context | Example Use Scenario |
|---------------------------|---|--|
| Space Collection Location | Location of the geometries described in the graph instance. | Commonly the Latitude, Longitude, and Elevation. |
| Space Collection | Identifier of relevant geometry groupings (3D, 2D, points). | For example, a Building in its entirety. |
| Space | 3D geometry elements in the SpaceCollection. | 3D Enclosure in a Building (Room, Elevator etc.). |
| Space Boundary | 2D or 3D geometries 1) creating the Space or 2) part of the SpaceCollection, depending on the schema. | In BIM, typically the Walls, Ceilings, and Floors, or even Shading or Retaining Walls. |
| Space Boundary Element | 2D or 3D geometries 1) creating the SpaceBoundary or 2) part of the SpaceCollectionLocation, SpaceCollection, or Space. | In our research, these are Material Layers within Walls or Landscaping. |



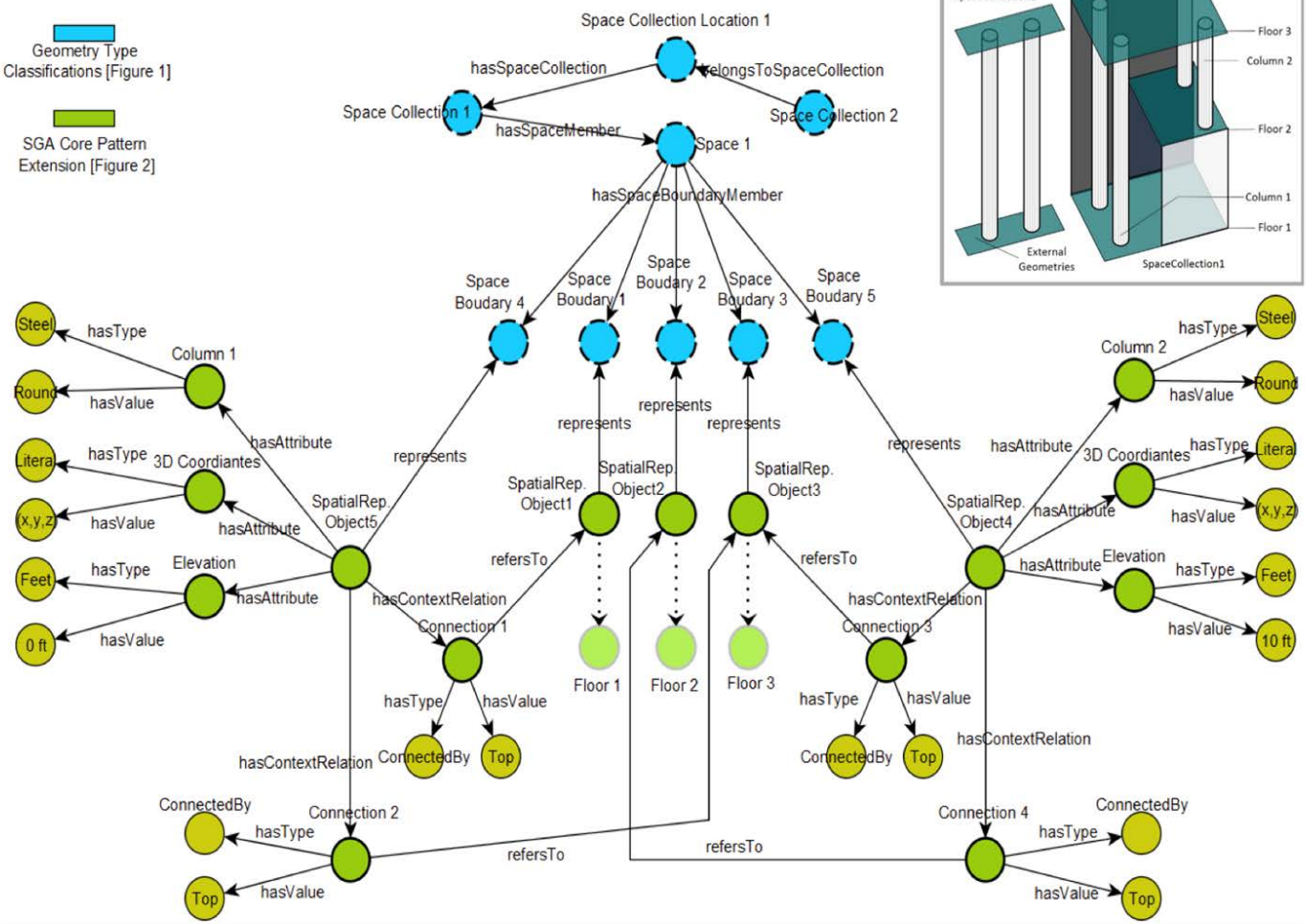
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Geometry Type
Classifications [Figure 1]

SGA Core Pattern
Extension [Figure 2]





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Technology

Google's 'superhuman' DeepMind AI claims chess crown

🕒 6 December 2017

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GAMING & CULTURE —

DeepMind AI needs mere 4 hours of self-training to become a chess overlord

AlphaGo Zero needed three days to train up in Go; AlphaZero needed just eight hours.

NATHAN MATTISE - 12/7/2017, 11:56 AM

<https://arstechnica.com/gaming/2017/12/deepmind-ai-needs-mere-4-hours-of-self-training-to-become-a-chess-overlord/>



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Active research on how to
integrate **Neural Networks** and
Deep Reinforcement Learning
methodology with **Knowledge
Graphs** and Reasoning

arXiv:1711.03902v1 [cs.AI] 10 Nov 2017

NEURAL-SYMBOLIC LEARNING AND REASONING

Neural-Symbolic Learning and Reasoning: A Survey and Interpretation

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Abstract

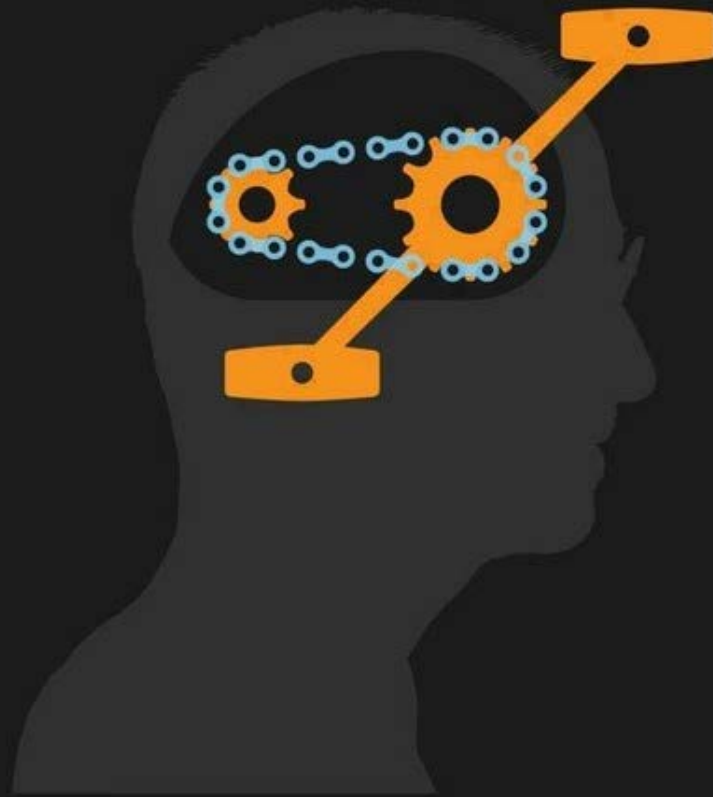
The study and understanding of human behaviour is relevant to computer science, artificial intelligence, neural computation, cognitive science, philosophy, psychology, and several other areas. Presupposing cognition as basis of behaviour, among the most prominent tools in the modelling of behaviour are computational-logic systems, connectionist models of cognition, and models of uncertainty. Recent studies in cognitive science, artificial intelligence, and psychology have produced a number of cognitive models of reasoning, learning, and language that are underpinned by computation. In addition, efforts in computer science research have led to the development of cognitive computational systems



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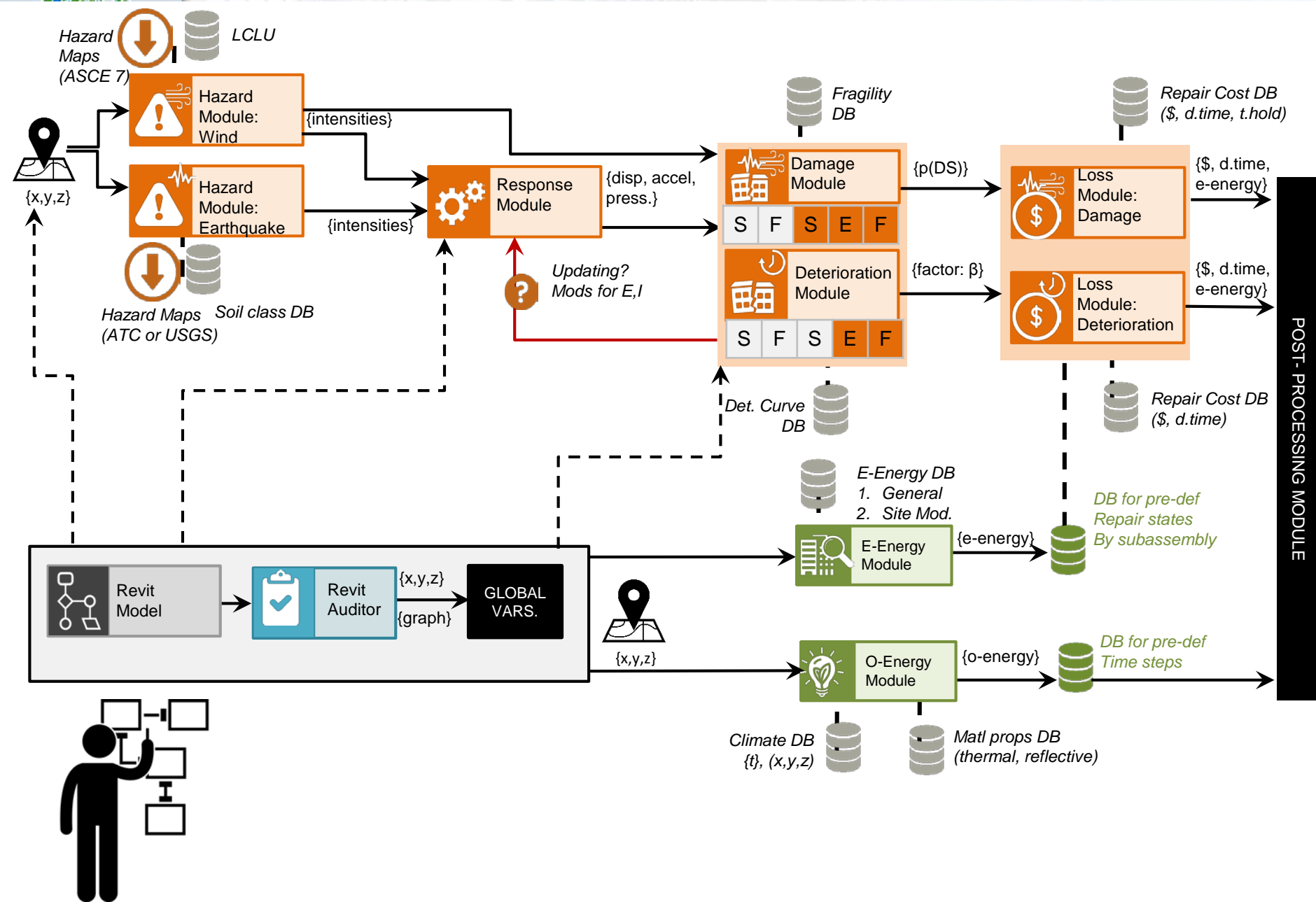
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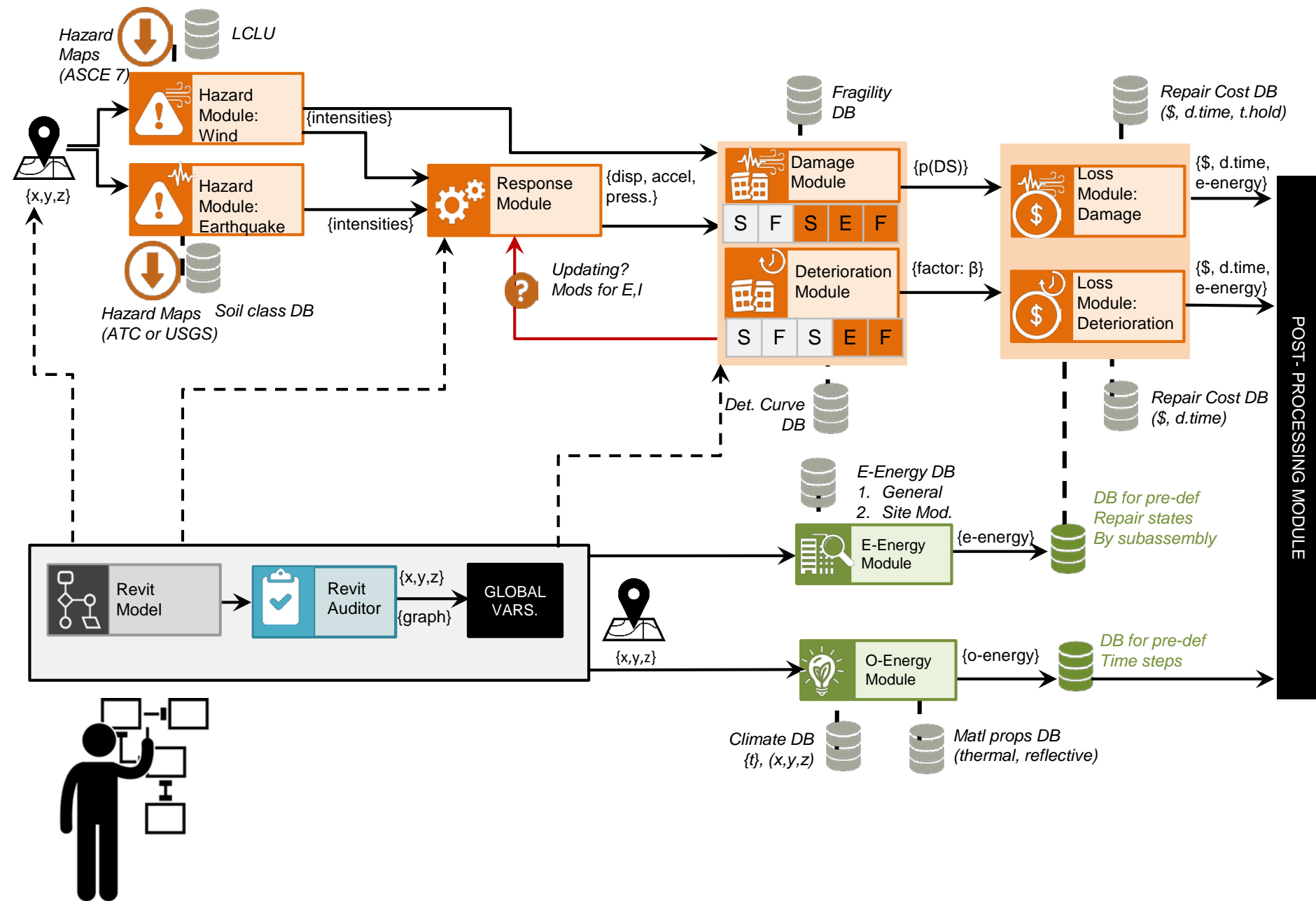
The computer is like a bicycle for our minds.

—Steve Jobs

INTEGRATED LIFE CYCLE ASSESSMENT FRAMEWORK



INTEGRATED LIFE CYCLE ASSESSMENT FRAMEWORK

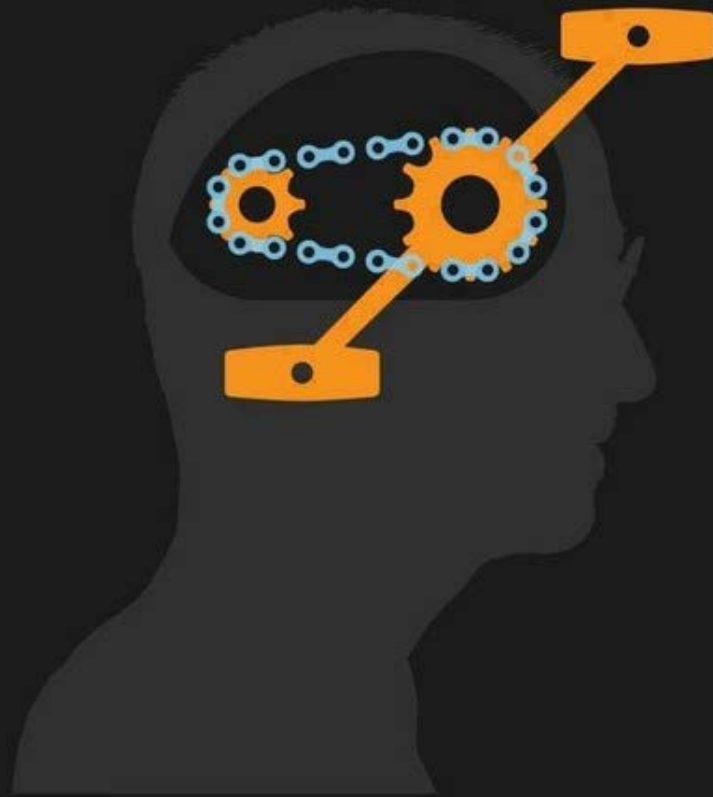




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—Steve Jobs



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This concludes The American Institute of Architects Continuing Education Systems Course

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