



# Quantifying System Complexity in Design Phase Using Higraph-Based Models

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# Introduction: Historical Context

- **Ancient Times:**  
Design used to achieve desired results.  
Complex human-engineered systems were  
unique (no repeatability).



Complexity

- **Medieval Times:**  
A method is applied and a process is  
followed to produce a human made product.
- **Modern Times:**  
Produced systems are market-driven and  
follow a set of technical and non technical  
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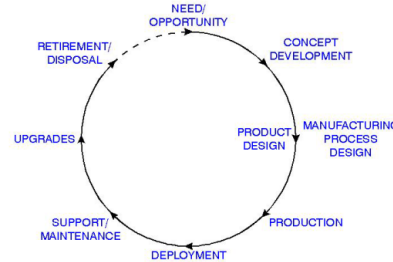
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Heterogeneity

# Introduction: Industrial Context

- **System Life Cycle:**  
Framework for meeting the stakeholders needs by defining lifecycle stages and using decision gates to determine readiness to move from one stage to the next.



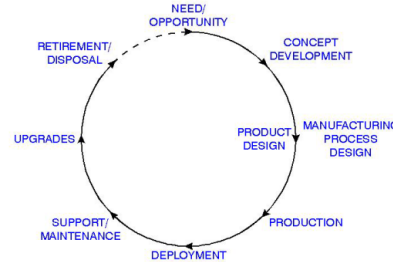
Life Cycle

- **Chaos Report:**  
Many errors are introduced early in design phase. System failures are due to errors in early phases.
- **System Costs:**  
80% of costs are committed early in design phase: when 20% of the actual cost has been accrued, 80% of the total LCC has already been determined.

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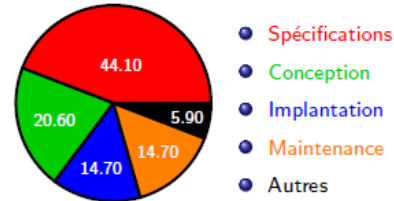
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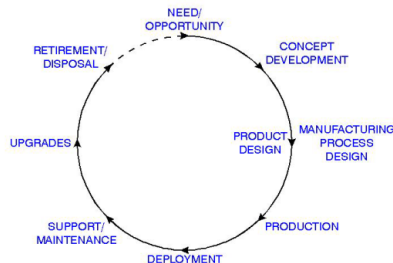
# Introduction: Industrial Context



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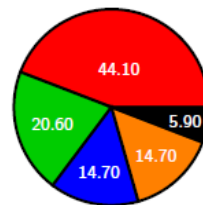
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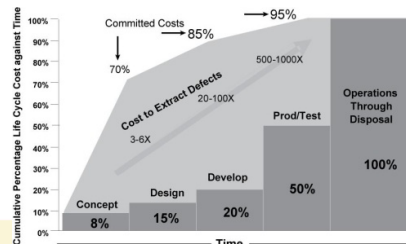


- Spécifications
- Conception
- Implantation
- Maintenance
- Autres

System Failure

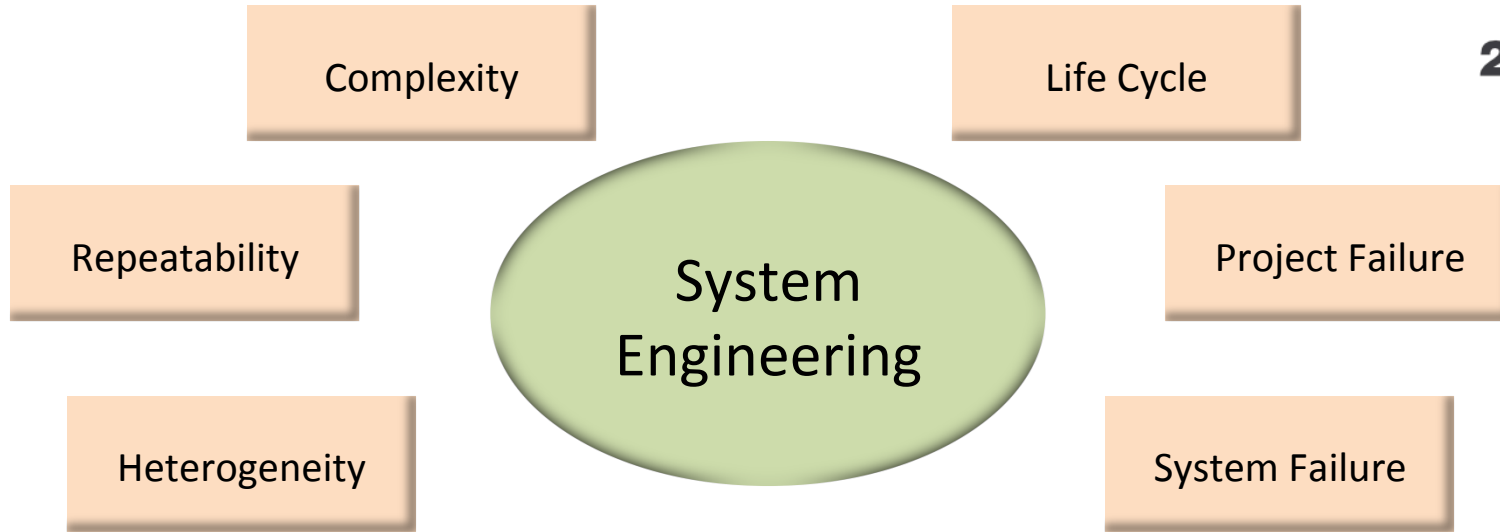
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Project Failure

# Introduction: Scope



***System Engineering*** aims to decrease the probability of **system failure** and **project failure** during **system life cycle** by handling system **complexity** and **heterogeneity** using **repeatable** framework and processes.

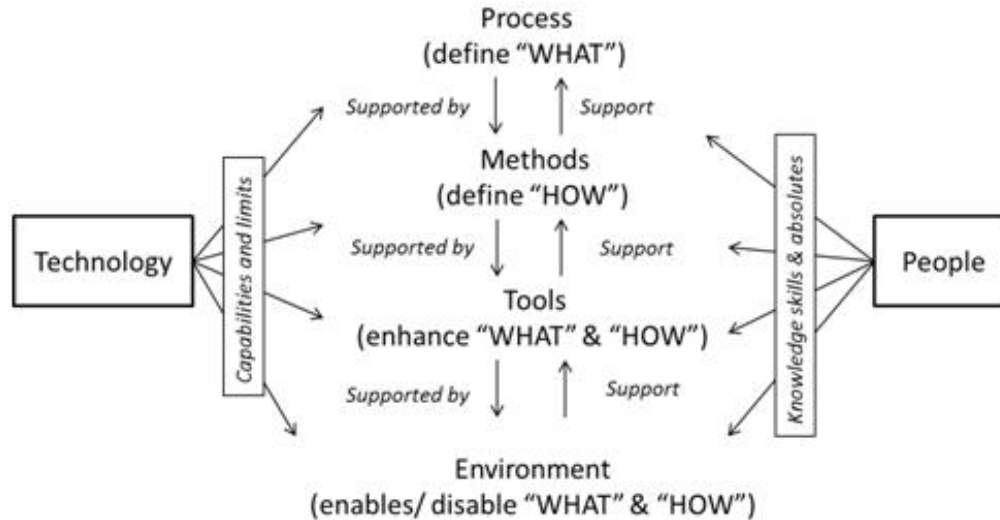


# System Engineering Framework



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Credits: Martin, James N., *Systems Engineering Guidebook: A Process for Developing Systems and Products*, CRC Press, Inc.: Boca Raton, FL, 1996.

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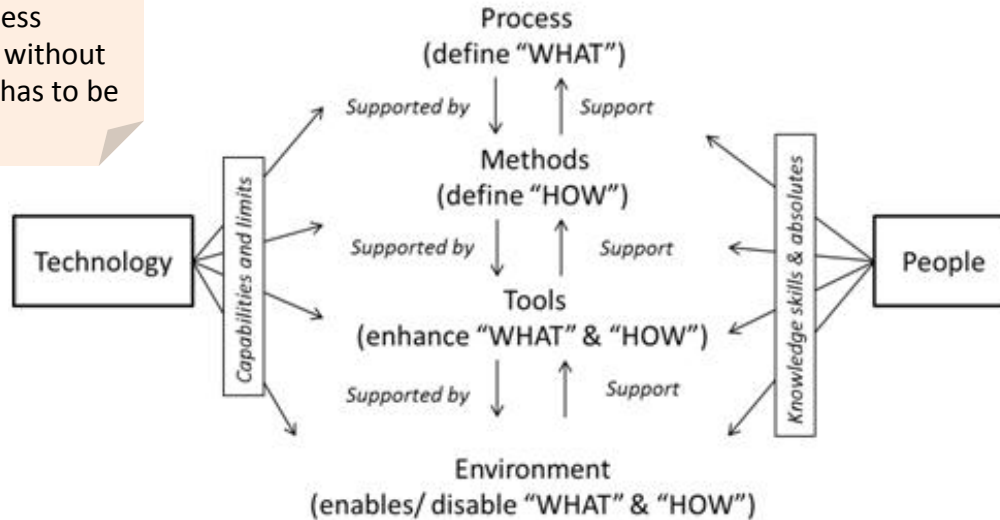


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## Process:

Sequence of tasks aiming to achieve a particular objective. Process defines what is to be done without defining how each activity has to be performed.



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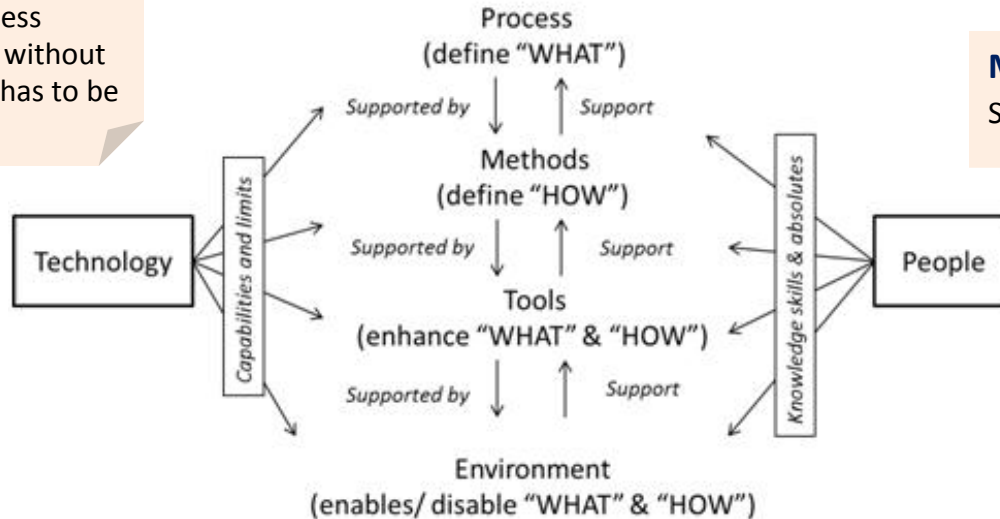
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Specifies *how* to perform each task



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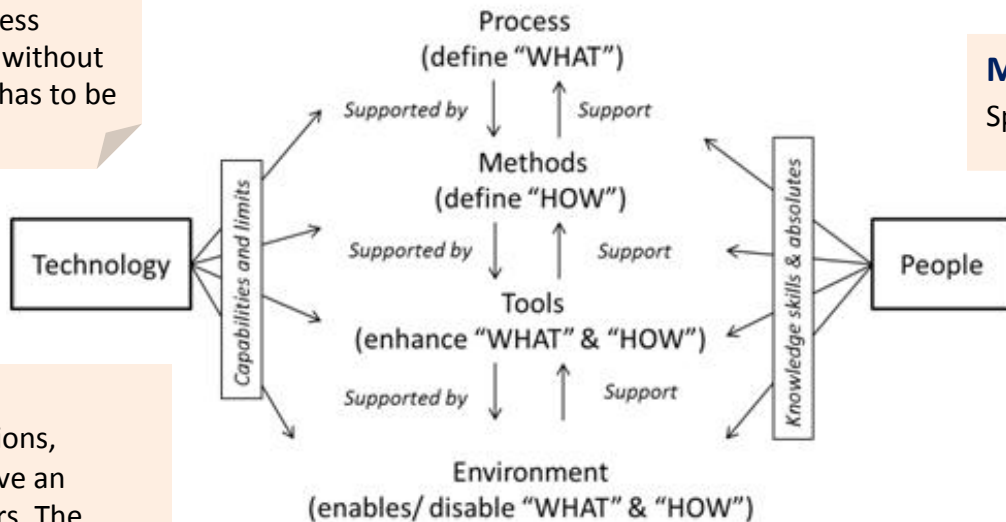
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## Environment:

Consists of external conditions, systems, or factors that have an influence on systems, actors. The purpose of environment is to put in practice the use of tools and methods of a project.

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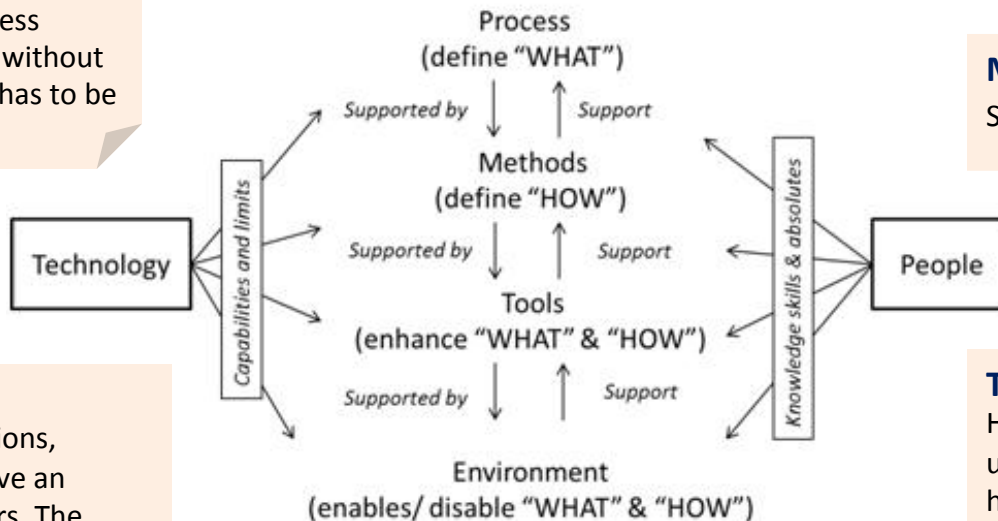
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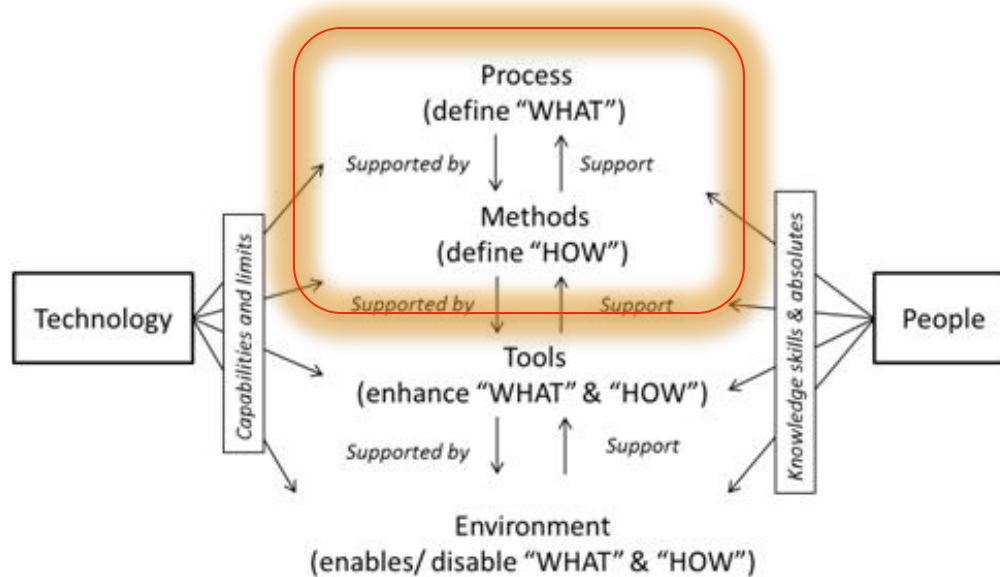
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## Tool:

Helps to accomplish of *how*. It usually supports a language that helps applying the method.

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# Modelling and Representation



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# Modelling Needs

- Why Modelling?
  - to help designing the system of interest
  - to address all the aspects of the system of interest
  - to share the knowledge between people involved in the process
- Modelling Needs:
  - **Trustworthiness**: how close the model is to the reality?
  - **Understandability**: is the model perceived and understood the same way by people?
  - **Usefulness**: does the model help to get the desired results?

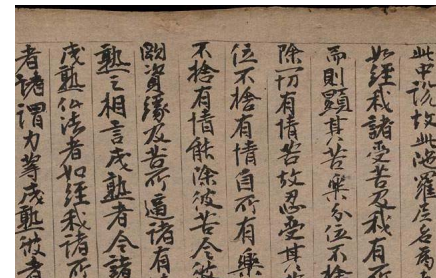
# Natural Language



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- Natural language is used everyday.
- Limitations:
  - not an effective way to describe a system behavior or structure
  - time consuming and needs huge efforts to keep track of the versions
  - might be ambiguous





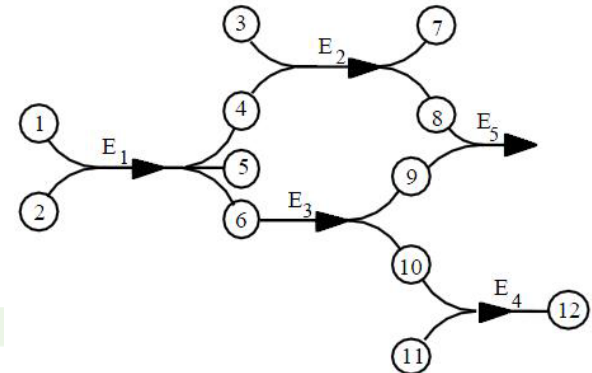
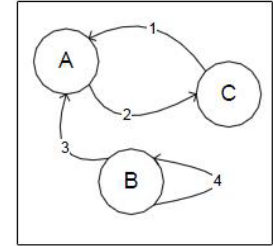
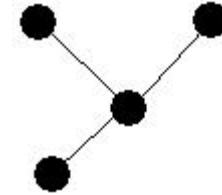
# Graphical representations

- Convey multiple features of a system simultaneously.
- Expressions correspond to the components of a model describing the system.
- Preserve explicitly the information about the topological and geometric relations among the elements of the system.



# Graph-Based Models

- Graphs have been naturally used to represent and model problems since the emergence of computer science.
- Graph-based models give a visual and intuitive representation, as well as with required accuracy.
- They are a well-suited means to describe in a natural way all kinds of systems, where nodes describe system entities and edges describe relations between them.



# System Model Hierarchy

Two ways how to organize hierarchically a set:

-**Grouping** : group items based on similar properties or characteristics.

-**Encapsulation**: encapsulate many elements within a single element of a higher level.

A model should be the result of a simplification strategy consisting in:

-**Conceptual chunking**: captures the essence of the problem-at-hand and reduces the complexity

-**Segmentation**: decomposition of a complex system into smaller parts that can be studied in isolation

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Orthogonality

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Orthogonality

Depth

# Higraph-Based Models

- Graphs have been naturally used to represent and model systems.
- A higraph is a graph extended to include notions of depth and orthogonality:

$$\text{Higraph} = \text{Graph} + \text{Depth} + \text{Orthogonality}$$

- **Definition** (Higraph).

A higraph is a quadruple  $H = (B, E, \rho, \Pi)$  where:

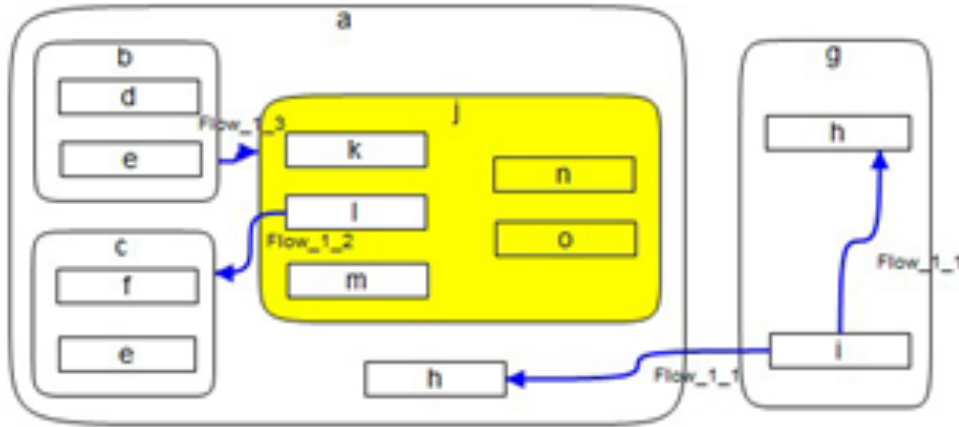
- $B$  is the set of blobs (or nodes);
- $E$  is the set of edges;
- $\rho$  is the hierarchy function. It assigns to each blob  $b$  its set of sub-blobs  $\rho(b)$ ;
- $\Pi$  is the orthogonality (or partitioning function) defined as , associating with each blob some equivalence relation  $\Pi(b)$  on the set of sub-blobs,  $\rho(b)$ .

# Higraph Formalism



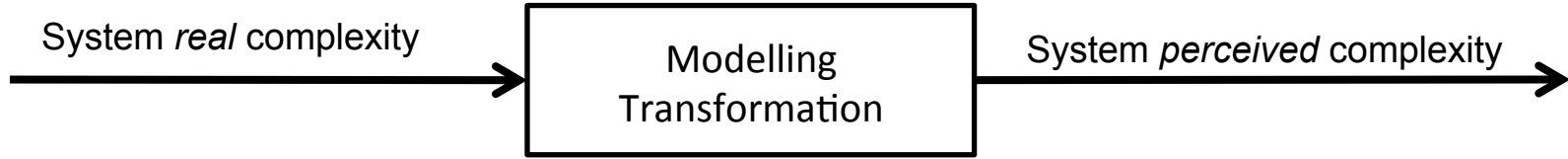
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- $\rho(a) = \{b, c, h, j\}$
- $\rho(g) = \{h, i\}$
- $\rho(b) = \{d, e\}$
- $\rho^2(a) = \{d, e, f, e, k, l, m, n, n, o\}$
- $\rho^{-1}(b) = \{a\}$
- $\rho^{-1}(h) = \{a, g\}$
- $\Pi_w(a) = \{b, c, h\}$
- $\Pi_w(g) = \{h, i\}$
- $\Pi_y(a) = \{j\}$
- $\Pi_w(j) = \{k, l, m\}$
- $\Pi_y(j) = \{n, o\}$

# System Complexity



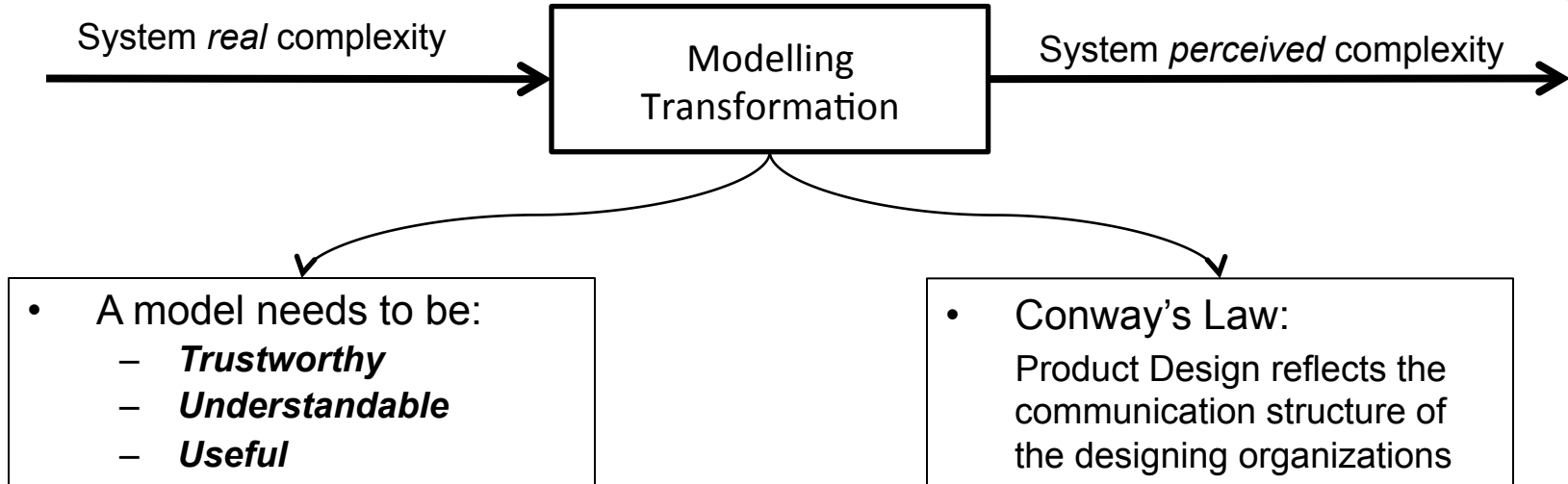


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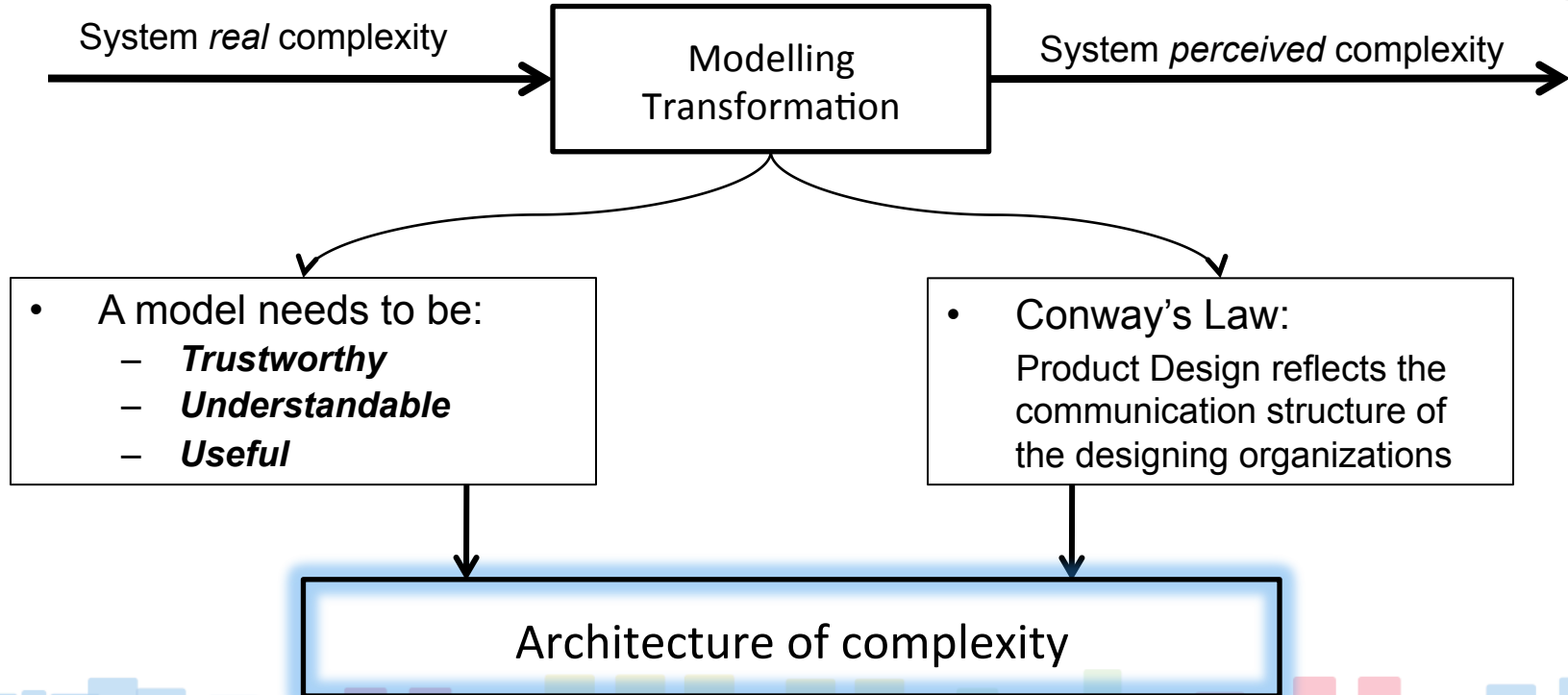


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# System Complexity Measurement

- State of the art:
  - Large complex systems development projects are not repeatable, making comparative studies hard to perform.
  - There is no widely used system model complexity measure.
- Intuitive reasons that make complexity measuring relevant and worthy:
  - Cost
  - System Development Management
  - Quality Assessment

# Measurement Requirements

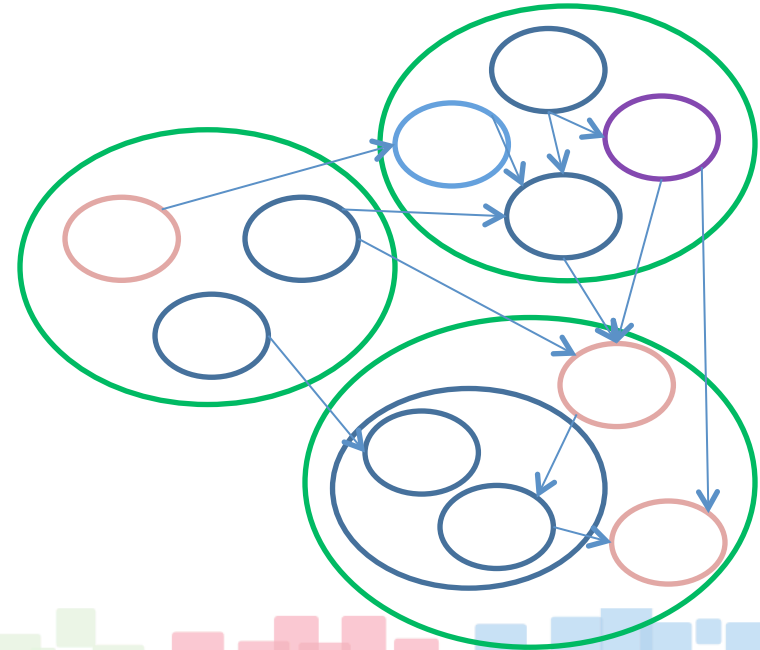
Requirement	Description
<b>Order</b>	If the measurement value of an element <i>A</i> greater than the measurement value of an element <i>B</i> , then the measurement value of the element <i>B</i> is less than the measurement value of an element <i>A</i> .
<b>Uniqueness</b>	Measuring the same property twice in same conditions shall give the same value: the measurement value of an element <i>A</i> cannot be greater (or less) than itself.
<b>Numerical Value</b>	The measurement value shall be a mapping from an observed relation system or element to a numerical relation system.
<b>Meaningfulness</b>	The measurement value shall be understandable and its truth shall not depend on transformations on allowable scales, i.e. if the scale is changed the meaning shall be the same.

# Complexity Metrics

- Direct Metrics:
  - Size
  - Depth
  - Width
- Indirect Metrics:
  - Density
  - Type Variety
  - Interface Load
- Structural Complexity

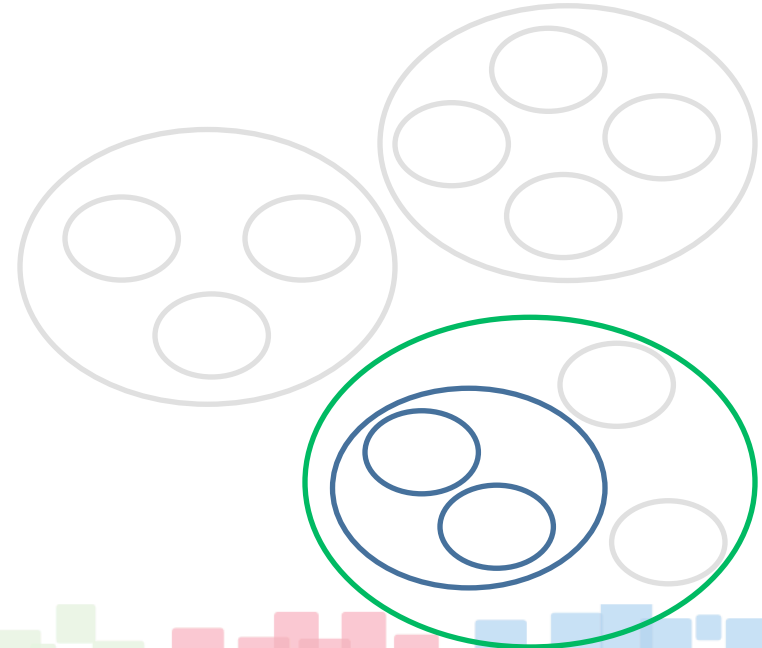
# Direct Metrics

- **Size:**  
The most obvious and useful attributes of a model is its size. The most intuitive way is to take into account the number of nodes and the number of edges.
- **Depth:**  
The depth of a higraph-based model is the highest number of levels between the top node and the lowest level node.
- **Width:**  
The width of a higraph-based model is the highest number of nodes at any one level.



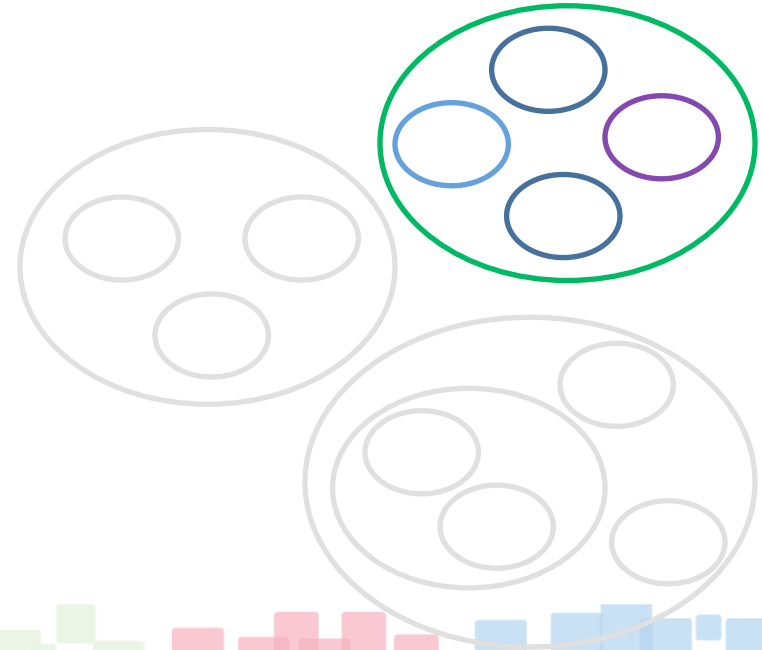
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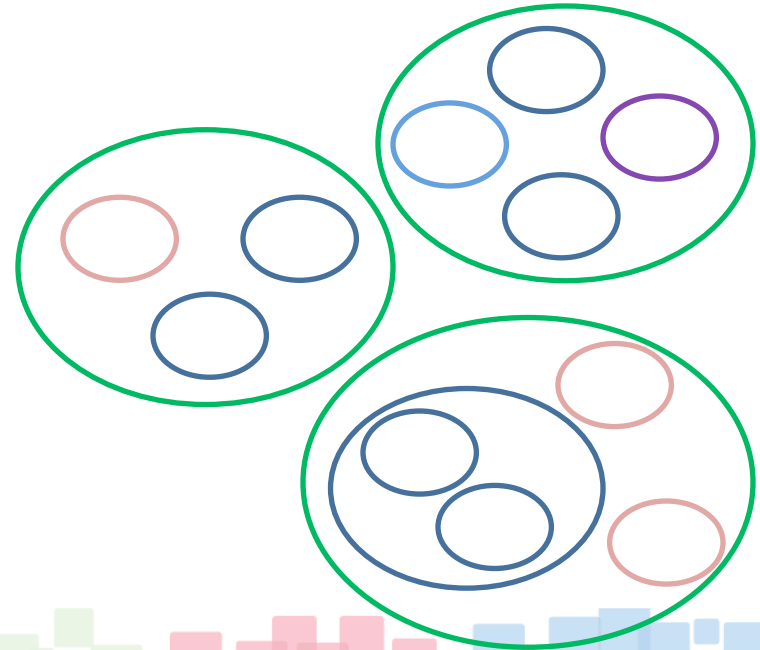
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# Indirect Metrics

- **Density:**  
It measures the node constituents to the number of nested components. This metric is used to identify the density of nested elements.
- **Type Variety:**  
The number of types in a set of elements is a good indicator of variety if all the types are of equal importance, which is usually not the case.
- **Interface Load:**  
This index measures the average number of interface inputs into an element and the average number of interface outputs of an element.



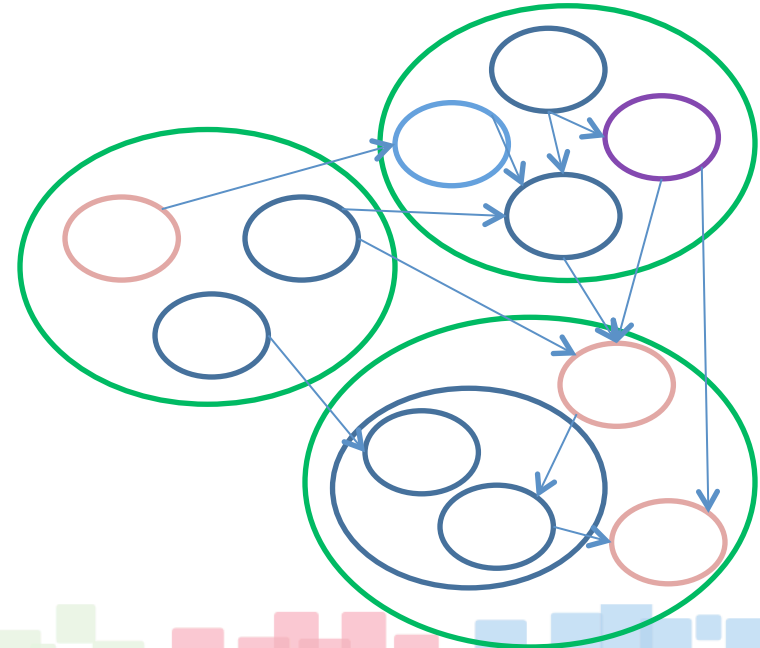
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# Structural Complexity

- A higraph model  $M$  entropy intuitively depends on the number of blobs, the number of edges, the hierarchy and the orthogonality.

$$M = (B, E, \rho, \Pi)$$

- We get the total entropy of the model higraph  $M$  as follows:

$$H = H_B + H_E + H_\rho + H_\Pi$$

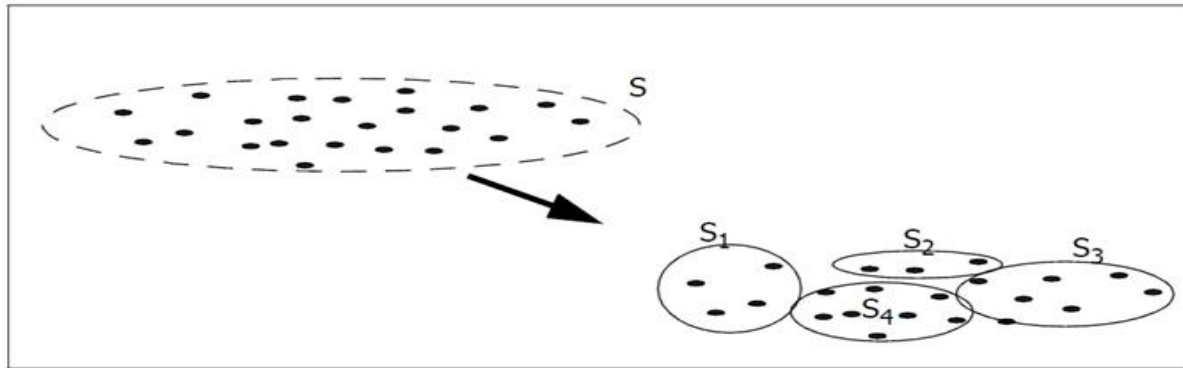
- Indicator of the complexity: Shannon's entropy

# Shannon's Entropy

- Shannon's Entropy:  
For a set  $S$  with  $N_S$  states

$$H(S) = - \sum p_i \log p_i$$

- Design principle:  
A complex problem is decomposed into a set of smaller problems with smaller complexity.  
Besides, the global complexity is the same.



# Structural Complexity (1)

- We get the total entropy of the model higraph  $M$  as follows:

$$H = H_B + H_E + H_\rho + H_\Pi$$

- The first term relates to the complexity due to the number of nodes.
- $H_B = H(B) = -\log(1/|B|) = \log(|B|)$

# Structural Complexity (2)

- We get the total entropy of the model higraph  $M$  as follows:

$$H = H_B + H_E + H_\rho + H_\Pi$$

- The second term relates to the complexity due to the number of edges. It takes into account the head and the tail of the edge.
- $H_E = H(E) = -2\log(1/|E|) = 2\log(|E|)$

# Structural Complexity (3)

- We get the total entropy of the model higraph  $M$  as follows:

$$H = H_B + H_E + H_\rho + H_\Pi$$

- The third term relates to the number of hierarchical relationships between the elements of the model. It takes into account parent and child relationship.
- $H_\rho = -2\log(1/N) = 2\log(\sum \rho(x)), \text{ for } x \in M$



# Structural Complexity (4)

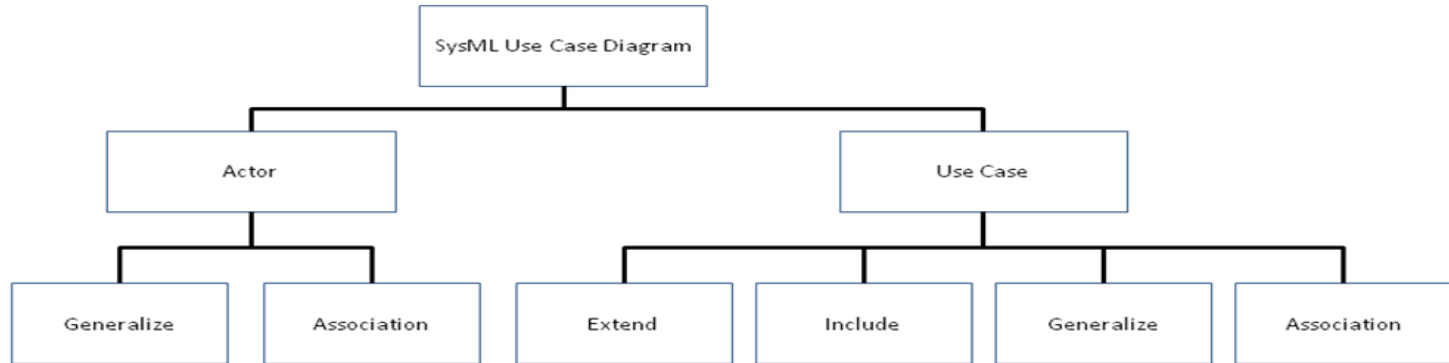
- We get the total entropy of the model higraph  $M$  as follows:

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- The fourth term relates to the complexity due to the orthogonality.
- Let  $g$  a morphism that associates to each element  $x$  of the Model Higraph  $M$  to its type, with  $M_\Pi$ , the Model Type Higraph.  $B_\Pi$  is the corresponding set of blobs. There is no edge and no type in the Type Higraph.
- $H_\Pi = \log(|B_\Pi|) + 2\log(\sum \rho(x))$ , for  $x \in M_\Pi$

# Example: Use Case Diagram

- SysML Use Case Diagram is a higraph  $H_{UC} = (B; E; \rho; \Pi)$ .
- Each node  $n$  belongs to one and only one of the following types: *Actor*, *Use Case*
- Each edge  $e$  belongs to one and only one of the following types: (*Associate*, *Generalize*, *Extend*, *Include*).



# Example: Use Case Diagram

- 3 elements of type *Actor* and 3 elements of type *Use Case*:

$$H_B = \log_2 6$$

- 3 relations of type *Association*:

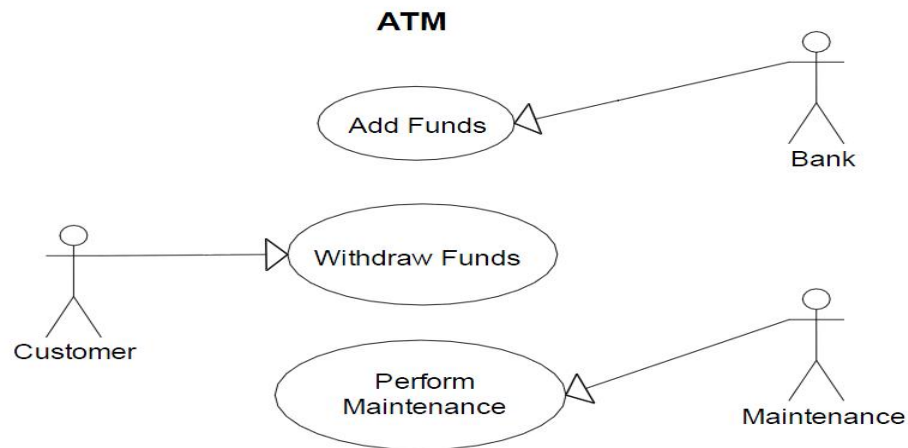
$$H_E = 2\log_2 3 = \log_2 9$$

- We have no hierarchy:

$$H_\rho = 0$$

- Type Higraph:

$$H_\Pi = H(M_\Pi) = \log_2 216$$



# Conclusion

- To handle the complexity, it is necessary to architect the model.
- Hierarchy is the most intuitive way to address this issue. Two main types of hierarchy have been defined in that purpose.
- Its value depends on the amount of details, elements and relationships between them, as well as the number of hierarchy levels.
- Smaller sets mean less complexity.
- The choice of aggregation allows dealing with subsets separately to handle this complexity.
- The complexity measurement is a relevant metric to compare different architectures for the same system.

# Questions?

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