

## evolutionary systems and biologically-inspired computing



### ISE-483/SSIE-583 - spring 2024





# office hours:

thursdays 9:00- 11:30am, EB S04 binghamton.zoom.us/my/luismrocha



rocha@binghamton.edu casci.binghamton.edu/academics/i-bic



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#### course outlook

#### key events coming up

- Labs: 35% (ISE-483)
  Complete 5 (best 4 graded) assignments based on algorithms presented in class
  - Lab 0 : January 29th
    - Introduction to Python (No Assignment)
      - Delivered by SSIE583 Group 2
        - see solved exercises!
  - Lab 1 : February 5<sup>th</sup>
    - Measuring Information (Assignment 1)
      - Delivered by SSIE583 Group 3
      - Due: February 12<sup>th</sup>
  - Lab 2 : February 19<sup>th</sup>
    - *L-Systems* (Assignment 2)
      - Delivered by SSIE583 Group 1
      - Due: February 26<sup>th</sup>
  - SSIE 583 -Presentation and Discussion: 25%
    - Present and lead the discussion of an article related to the class materials
      - Enginet students post/send video or join by Zoom
    - Dates TBA
      - Kauffman, S.A. [1969]. "Metabolic stability and epigenesis in randomly constructed genetic nets". Journal of Theoretical Biology 22(3):437-467.
        - Presented by Yoshiaki Fujita
      - Stanley, Kenneth O., Jeff Clune, Joel Lehman, and Risto Miikkulainen. "Designing Neural Networks through Neuroevolution." Nature Machine Intelligence 1, no. 1 (January 2019): 24–35.
        - Presented by Jessica Lasebikan
      - Discussion by all



#### Next lectures

#### readings

- Class Book
  - Floreano, D. and C. Mattiussi [2008]. *Bio-Inspired Artificial Intelligence: Theories, Methods, and Technologies*. MIT Press. **Preface**.
    - Nunes de Castro, Leandro [2006]. Fundamentals of Natural Computing: Basic Concepts, Algorithms, and Applications. Chapman & Hall. Chapter 1, pp. 1-23.
- Lecture notes
  - Chapter 1: "What is Life?"
  - Chapter 2: The logical Mechanisms of Life
    - posted online @ http://informatics.indiana.edu/rocha/i-bic
- Papers for Presentations
  - Logical mechanisms of life (optional for SSIE 483)

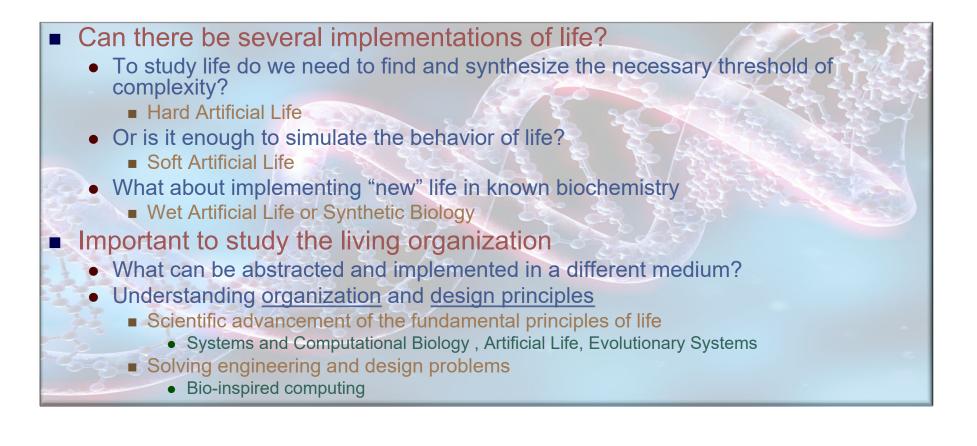


- Langton, C. [1989]. "Artificial Life" In Artificial Life. C. Langton (Ed.). Addison-Wesley. pp. 1-47.
  - Pattee, H. [1989], "Simulations, Realizations, and Theories of Life". In Artificial Life. C. Langton (Ed.). pp. 63-77
- Other Readings
  - Optional
    - Gleick, J. [2011]. The Information: A History, a Theory, a Flood. Random House. Chapter 8.
    - Cobb, Matthew. [2013]. "1953: When Genes Became 'Information'." Cell 153 (3): 503-506.
    - Aleksander, I. [2002]. "Understanding Information Bit by Bit". In: It must be beautiful : great equations of modern science. G. Farmelo (Ed.), Grant
    - James, R., and Crutchfield, J. (2017). Multivariate Dependence beyond Shannon Information. Entropy, 19(10), 531.
    - Prokopenko, Mikhail, Fabio Boschetti, and Alex J. Ryan. "An information-theoretic primer on complexity, self-organization, and emergence." Complexity 15.1 (2009): 11-28.



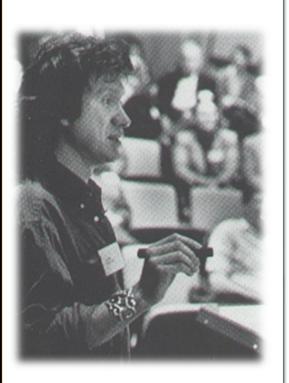
#### **Next lectures** readings BINGHAMTON UNIVERSITY Spring 2024 Evolutionary Sys & Bio-Ins... Þ Â Luis Rocha $\square$ LR ft **Class Book** Course Home Calendar Content Assignments Quizzes Discussions Evaluation - Classlist Course Tools - Help -Floreano, D. and 0 **Preface**. nologies. MIT Press. Nunes de Castr Readings ~ *ications*. Chapman & Hall. Settings Chapter 1, pp. Lecture notes E Syllabus / Overview Add dates and restrictions... Chapter 1: "Wh Bookmarks See all class readings at: https://casci.binghamton.edu/academics/i-bic/index.php#material Chapter 2: The Class Book ■ posted online 💾 Course Schedule Papers for Present • Floreano, D. and C. Mattiussi [2008]. Bio-Inspired Artificial Intelligence: Theories, Methods, Logical mechanisr Table of Contents and Technologies. MIT Press. Available in electronic format for SUNY students. • Nunes de Castro, Leandro [2006]. Fundamentals of Natural Computing: Basic Langton, C. Concepts, Algorithms, and Applications. Chapman & Hall. Chapter 1, pp. 1-23. Syllabus Pattee, H 63-77 Lecture notes Other Readings Office Hours • 1. What is Life? Optional • Gleick, J. [20] Class Recordings Articles Cobb, Matthe • Dennet, D.C. [2005]. "Show me the Science". New York Times. August 28, 2005 Lecture Slides and . Aleksander. tions of modern science. G. • Polt, R. [2012]. "Anything but Human". New York Times, August 5, 2012 Other Materia Farmelo (Ed. **Optional Readings** James, R., ar # Readings ntropy, 19(10), 531. Gleick, J. [2011]. The Information: A History, a Theory, a Flood. Random House. Chapter 8. nplexity, self-organization, Prokopenko. and emergen Cobb, Matthew. [2013]. "1953: When Genes Became 'Information'." Cell 153 (3): 503-506. Papers for . Aleksander, I. [2002]. "Understanding Information Bit by Bit". In: It must be beautiful : great Presentations equations of modern science. G. Farmelo (Ed.), Grant - James, R., and Crutchfield, J. (2017). Multivariate Dependence beyond Shannon Information. Add a module ... Entropy, 19(10), 531. · Prokopenko, Mikhail, Fabio Boschetti, and Alex J. Ryan. "An information-theoretic primer on complexity, self-organization, and emergence." Complexity 15.1 (2009): 11-28. ha@indiana.edu casci.binghamton.edu/academics/i-bic UNIVERSIT

how much is specific bio-chemistry and history?



## the logical mechanisms of life

#### life-as-it-could-be



# Chris Langton

- Artificial Life can contribute to theoretical biology by locating *life-as-we-know-it* within the larger picture of *life-as-it-could-be*
- life as a property of the organization of matter, rather than a property of the matter which is so organized
  - The way information is processed
- Whereas biology has largely concerned itself with the material basis of life, Artificial Life is concerned with the formal basis of life.
  - views an organism as a large population of *simple* machines
  - Synthetic approach or emergent behavior



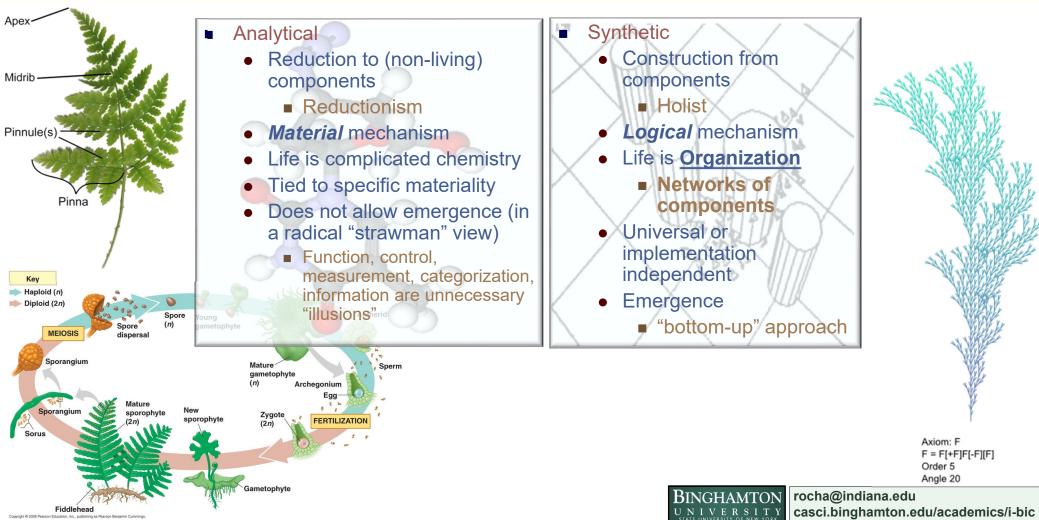
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#### scientific approaches of life



#### alternative concepts of mechanism

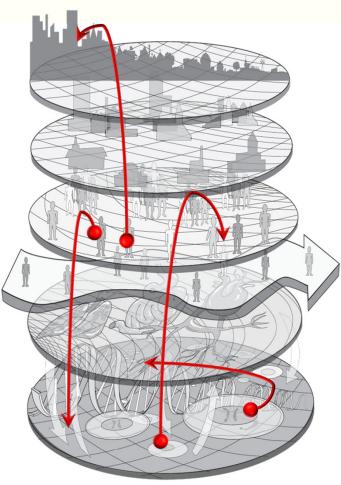
## life as organization

## complexity threshold

- Science often sees life as the complicated physics of a collection of moving bodies
  - Reductionist search for answers in the nitty-gritty of biochemistry
    - Separable variables or near-decomposable modules (Simon)
  - When do we reach a threshold of complexity after which matter is said to be living?
    - Which variables, networks, components, relations must be included?
- Life as (emergent) organization
  - Systems Thinking
    - Ludwig von Bertallanfy (1980)
    - What is important are not the actual physical components but the relations amongst them
    - But what about evolution and history?
      - Conflict between (general) organization and specific components with their history
      - What organization explains evolution?



"Seeking a connecting link, they had condescended to the preposterous assumption of structureless living matter, unorganized organisms, which darted together of themselves in the albumen solution, like crystals in their mother-liquor; yet organic differentiation still remained at once condition and expression of all life. **One could point to no form of life that did not owe its existence to procreation by parents**". Thomas Mann [1924].



Pescosolido, BA. 2006. Journal of Health and Social Behavior 47:189-208.

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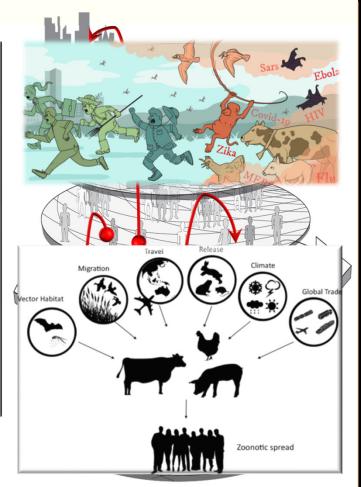
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# the living organization?

## how to identify it?

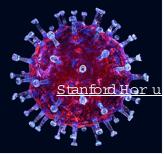
- List of properties
  - Growth
  - Metabolism
  - Reproduction
  - Adaptability
  - Self-maintenance (autonomy)
  - Self-repair
  - Self-assembly
  - Reaction
  - Evolution
  - Choice
- Threshold of complexity
  - Closure (metabolic, functional)
    - Categorization and Control
    - Function (self-reference)
  - Open-ended evolution
  - (genomic) Information

Is there a synthetic criteria? How general can it be?

Is life

Fuzzy?





viruses candle flames the Earth hurricanes robots self-assembling wires?







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# the living organization?

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#### emergence and explanation

interplay between micro- and macro-level behavior

- Life as emergent organization

   impossibility of epistemological reduction of the properties of a system to its components
  - Whole is more than sum of parts
    - "Clockness": many possible material implementations
    - Several biological designs for similar function (e.g. flying)
    - The function of DNA does not lie in its dynamic (bio-chemical) characteristics
  - Crux of complexity
    - Micro- vs. macro-level descriptions
  - Caveat
    - Information and function are contextual and historical
  - How to understand/design matter and organization?
    - Is systems thinking dualistic? Neo-vitalism?
    - Complementarity: wave-particle duality



Luis M. Rocha. SSIE 483X/583X - Lecture Notes - Chapter 1:What is Life? and Chapter 2: The logical mechanisms of life.

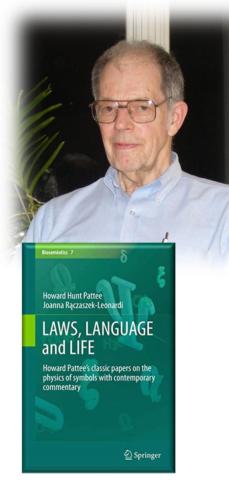


"First, nothing in biology contradicts the laws of physics and chemistry; any adequate biology must be consonant with the 'basic' sciences. Second, the principles of physics and chemistry are not sufficient to explain complex biological objects because new properties emerge as a result of organization and interaction. These properties can only be understood by the direct study of the whole, living systems in their normal state. Third, the insufficiency of physics and chemistry to encompass life records no mystical addition, no contradiction to the basic sciences, but only reflects the hierarchy of natural objects and the principle of emergent properties at higher levels of organization". Stephen Jay Gould

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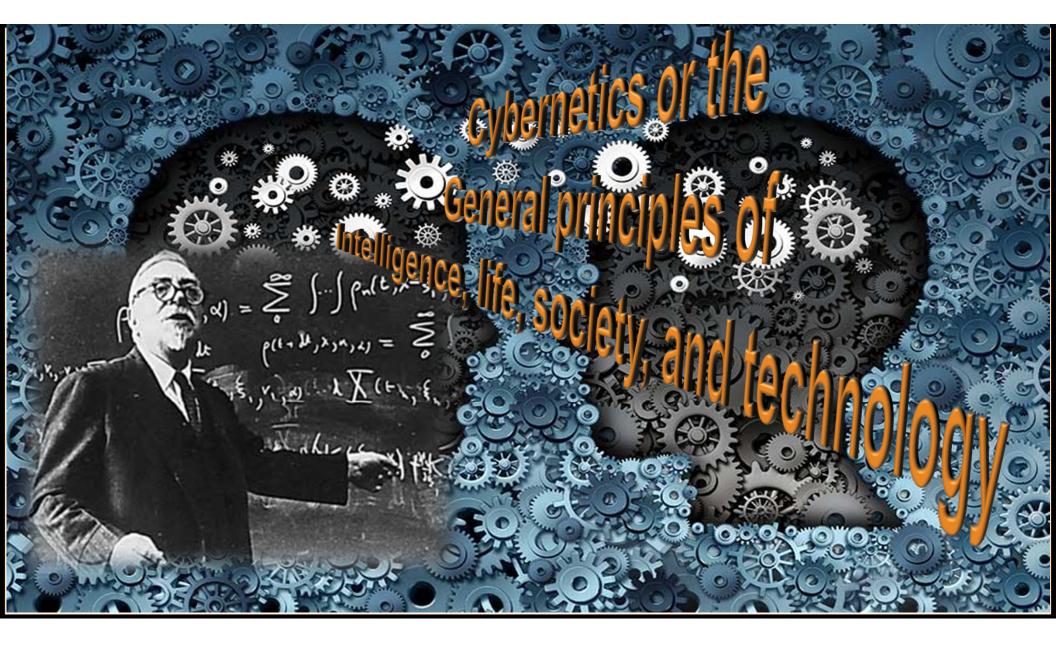
what is non-life-as-it-could be?

criteria for deciding good simulations or realizations?



	Alife	must	be	compared	to	something
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- What is the formal/logical threshold of complexity?
  - Hard Alife must provide a set of rules to distinguish Alife from artificial matter
  - Weak Alife needs to be able to test design principles of life with simulations
    - **Bio-inspired computing** needs only to produce good results in engineering problems
- Comparison to "life-like" behavior is too subjective
- theories of life
  - Alife methodology requires existing theories of life to be compared against
    - <u>constrained</u> by (rather than freed from) our theories or "fiction"
  - contributes to the meta-methodology of Biology
    - test and improve beyond material constraints, such as the incomplete fossil record or measurement of cellular activity



# cybernetics

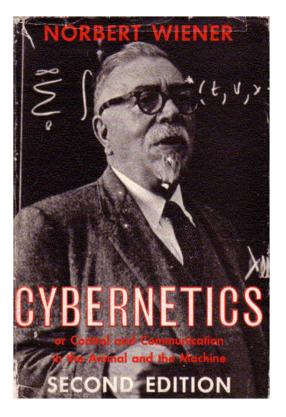
#### post-war science

- Synthetic approach
  - Engineering-inspired
  - Supremacy of mechanism
- Postwar culture of problem solving
  - Interdisciplinary teams
  - Cross-disciplinary methodology
- All can be axiomatized and computed
  - Mculloch&Pitts' work was major influence
    - "A logical calculus of the ideas immanent in nervous activity". Bulletin of Mathematical Biophysics 5:115-133 (1943).
    - A Turing machine (any function) could be implemented with a network of simple binary switches (if circularity/feedback is present)

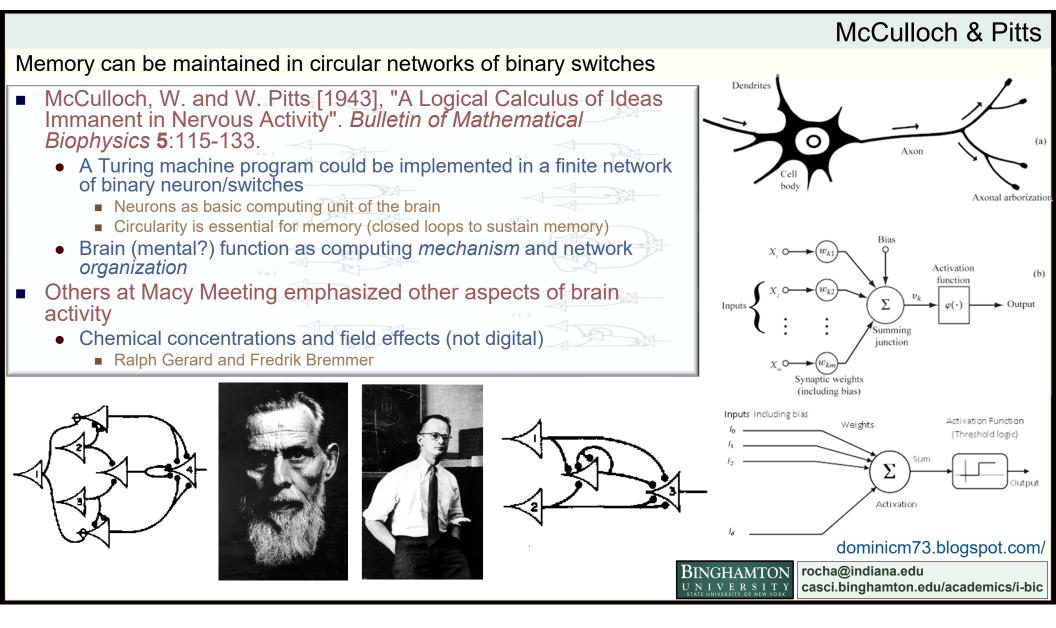


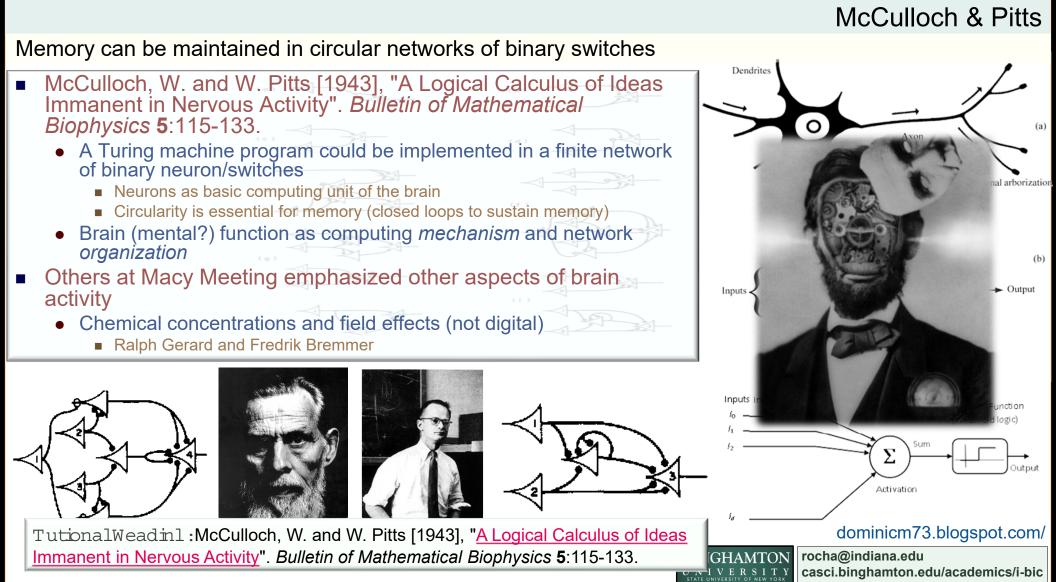
Warren S. McCulloch Margaret Mead Claude Shannon Heinz Von Foerster Walter Pitts

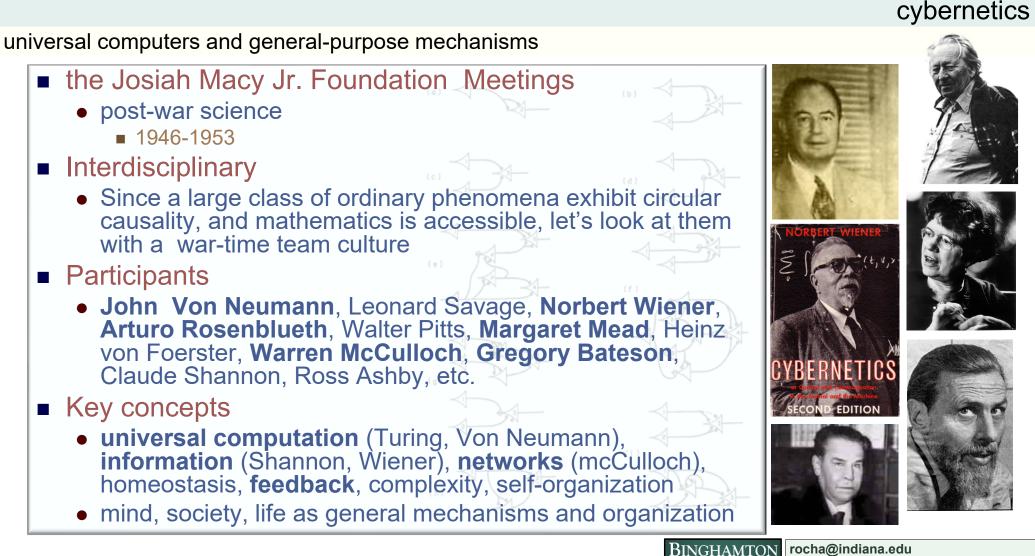
# Macy Conferences: 1946-53



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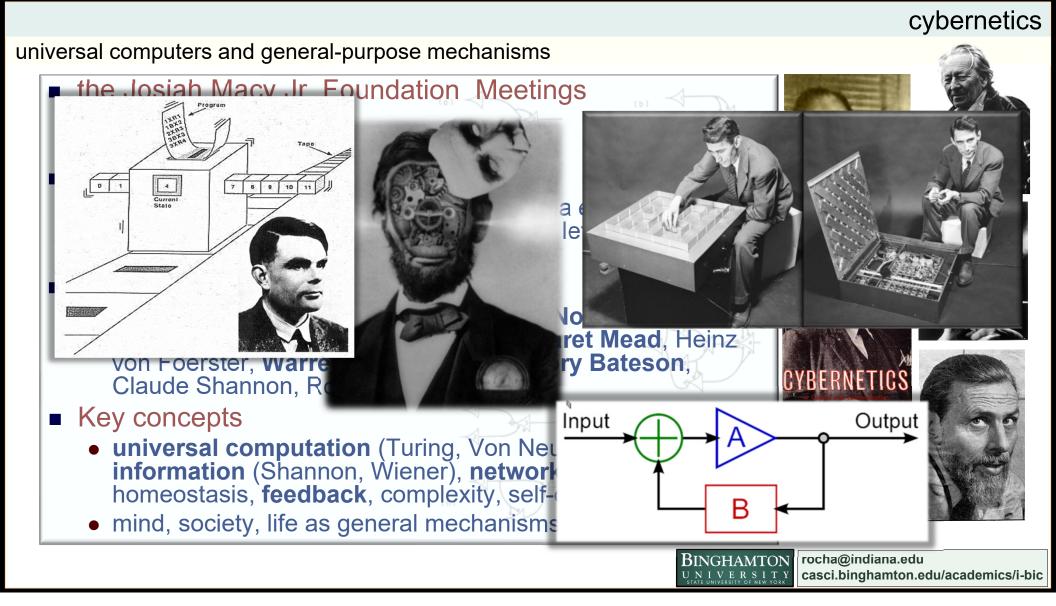






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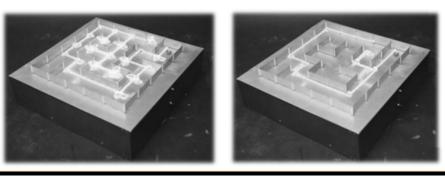
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# Shannon's mouse

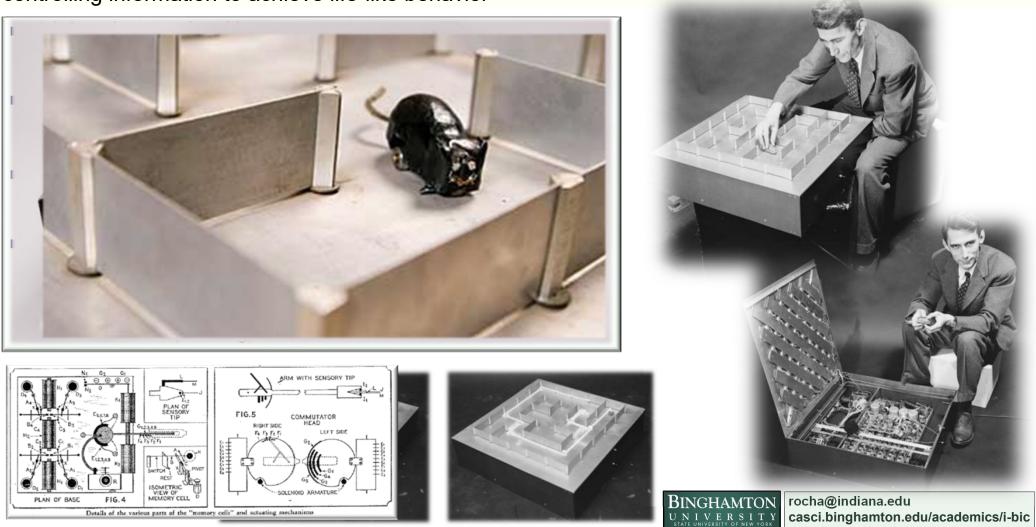
#### controlling information to achieve life-like behavior

- trial and error algorithm
  - information as reduction of uncertainty in the presence of alternatives (combinatorics)
- lifelike behavior
  - trial and error to <u>learn</u> path from many alternatives
  - adapts to new situations
- how is learning achieved?
  - Correct choices, **information** gained from reduced uncertainty, must be **stored in memory**
- memory of information as a design principle of intelligence in uncertain environments
  - 75 bit memory
  - stored in (telephone) switching relays
    - Brain as (switching) machine

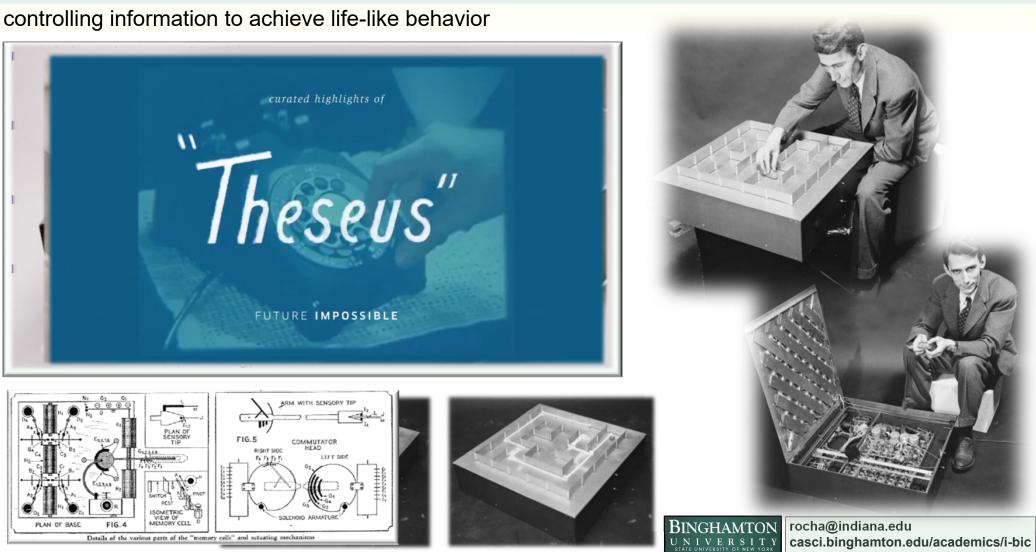




# Shannon's mouse



controlling information to achieve life-like behavior

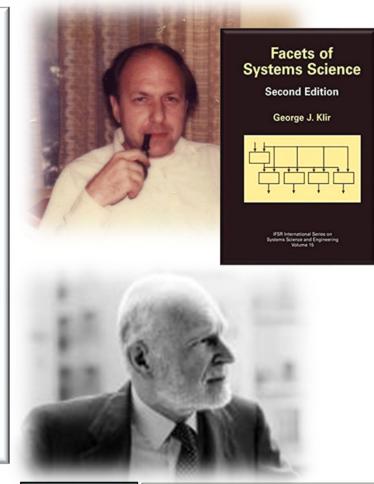


# Shannon's mouse

# (complex) systems science

a science of organization across disciplines

- Systemhood properties of nature
  - Robert Rosen
    - Systems depends on a specific adjective: thinghood
    - Systemhood: properties of arrangements of items, independent of the items
      - Similar to "setness" or cardinality
  - George Klir
    - Organization can be studied with the mathematics of relations
    - $\bullet S = (T, R)$ 
      - *S*: a System, *T*: a set of things(thinghood), *R*: a (or set of) relation(s) (Systemhood)
      - Same relation can be applied to different sets of objects
      - Systems science deals with **organizational properties** of systems independently of the items
    - Examples
      - Collections of books or music files are sets of things
      - But organization of such sets are systems (alphabetically, chronologically, typologically, etc.)



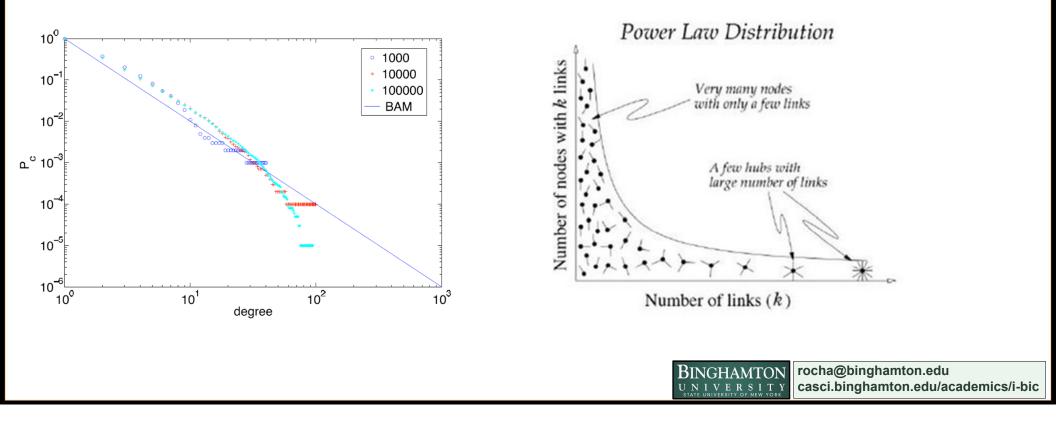
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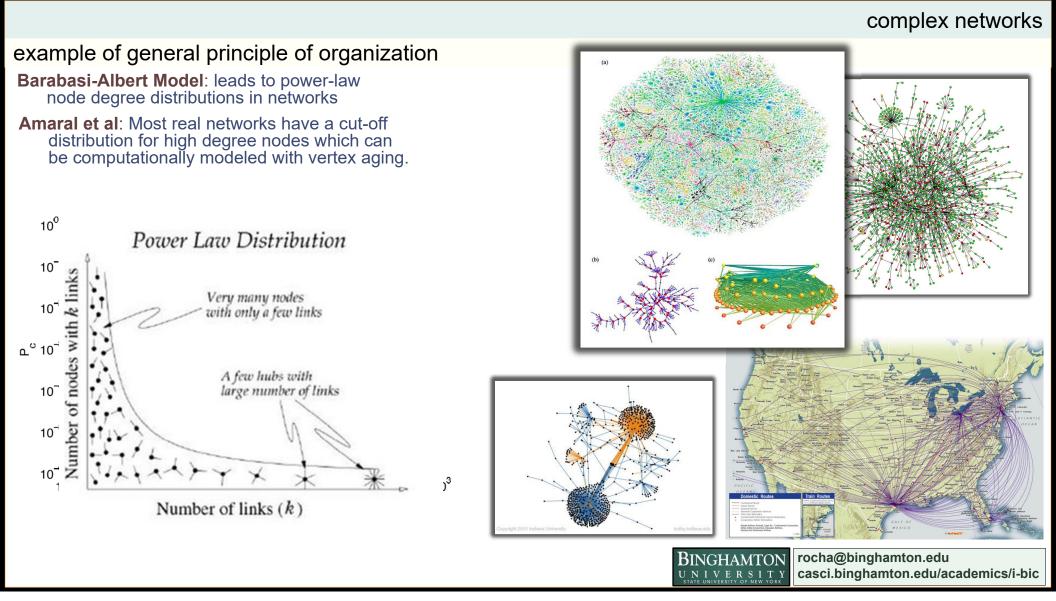
#### complex networks

### example of general principle of organization

Barabasi-Albert Model: leads to power-law node degree distributions in networks

**Amaral et al**: Most real networks have a cut-off distribution for high degree nodes which can be computationally modeled with vertex aging.





# Next lectures

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