

## CS 420/594

(Advanced Topics in Machine Intelligence)

### Complex Systems and Self-Organization

Bruce MacLennan

<http://www.cs.utk.edu/~mclennan/Classes/420>

## Contact Information

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## CS 420 vs. CS 594

- CS 420: Undergraduate credit (but graduate students can count one 400-level course)
- CS 594: Graduate credit, additional work

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## Grading

- You will conduct a series of computer experiments, which you will write up
- Some of these will be run on off-the-shelf simulators
- Others will be run on simulators that you will program
- Graduate students will do additional experiments and mathematical exercises
- No exams

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## Prerequisites

- CS 420 & 594: None per se, but you will be required to write some simulations (in Java, C++, or whatever)
- CS 594: Basic calculus through differential equations, linear algebra, basic probability and statistics

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## Textbooks

- CS 420 & 594: Flake, Gary William. *The Computational Beauty of Nature*. MIT Press, 1998
- CS 594: Bar-Yam, Yaneer. *Dynamics of Complex Systems*. Perseus, 1997. This book is available online in pdf format

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## Contents of Flake CBN

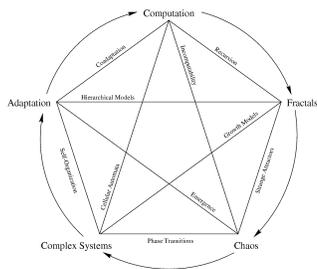


Figure 1.1 An association map of the contents of this book

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## What We Will Cover

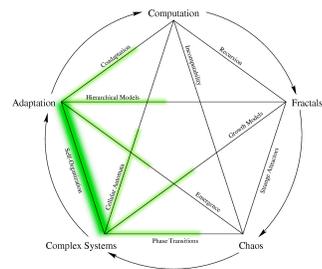


Figure 1.1 An association map of the contents of this book that we will cover

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## Reading for Next Week

- Flake: Ch. 1 (Introduction)
- Flake: Ch. 15 (Cellular Automata)
- 594: Bar-Yam:
  - Secs. 0.1 – 0.5 (Overview)
  - Sec. 1.5 (Cellular Automata)

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## Course Web Site

- [www.cs.utk.edu/~mclennan/Classes/420](http://www.cs.utk.edu/~mclennan/Classes/420)
- Syllabus
- Link to Flake *CBN* site (with errata, software, etc.)
- Link to Bar-Yam (CS 594) online text
- Links to other interesting sites
- Handouts:
  - assignments
  - slides in pdf formats (revised after class)

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## Discussion

- What is a *complex system*?
- What is an *emergent property*?
- What is *self-organization*?

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## Weaver's Stages in the Progress of Science

- Simple systems
- Disorganized complexity
- Organized complexity

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## Complex vs. Simple Systems

- Have many parts
- Parts are interdependent in behavior
- Difficult to understand because:
  - behavior of whole understood from behavior of parts
  - behavior of parts depends on behavior of whole

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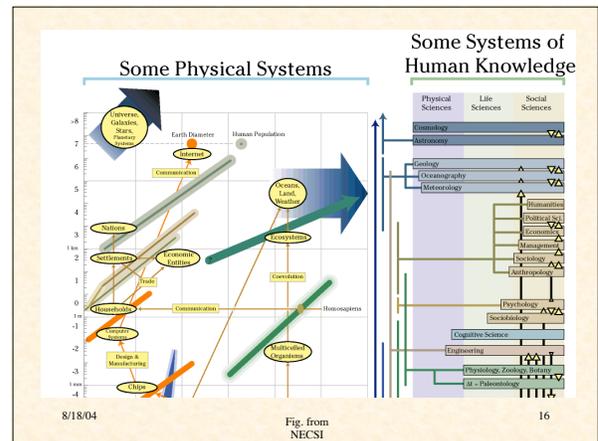
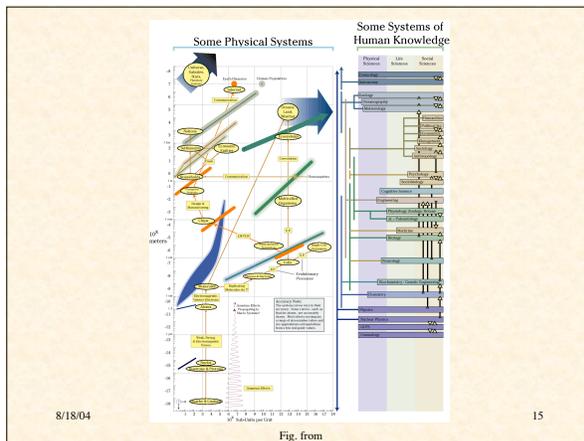
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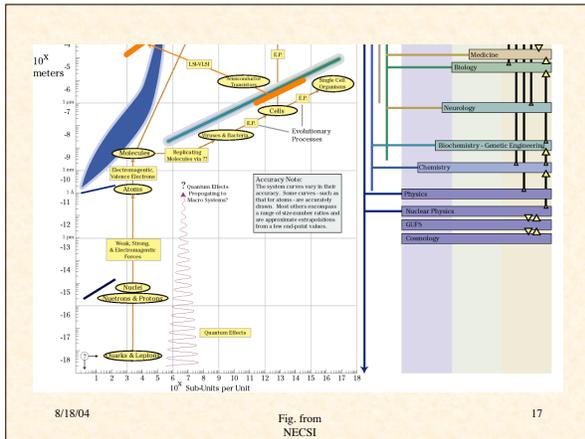
## Examples of Complex Systems

- government
- family
- person (physiology)
- brain
- world ecosystem
- local ecosystem (desert, rainforest, ocean)
- weather
- corporation
- computer
- ant colony
- university

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## Defining Properties

- Elements (& their numbers)
- Interactions (& their strengths)
- Formation/operation (& their timescales)
- Diversity/variability
- Environment (& its demands)
- Activities (& their objectives)

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What are the *universal properties* shared by all complex systems?

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## Ockham's Razor

- *Pluralitas non est ponenda sine necessitate.*
- "Plurality should not be posited without necessity"
- Advocated by William of Ockham (1285-1347/49)
  - also spelled "Occam"
- A law of economy fundamental to science

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## Universal Properties

- By Ockham's Razor:
  - for explaining system properties/behavior...
  - don't make use of particulars of elements unless necessary
- Often discover: properties & behavior of the system are independent of the specifics of the elements
- E.g., ant colonies and neural networks obey similar laws

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## Emergence

- The appearance of *macroscopic* patterns, properties, or behaviors
- that are not simply the "sum" of the *microscopic* properties or behaviors of the components
  - non-linear but not chaotic
- Macroscopic order often described by fewer & different variables than microscopic order
  - e.g. ant trails vs. individual ants
  - *order parameters*

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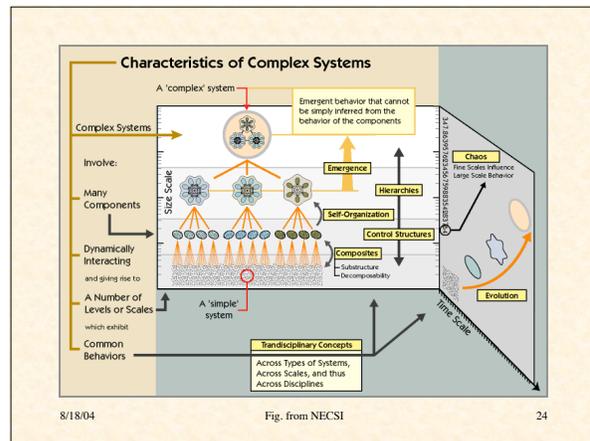
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## Self-Organization

- Order may be imposed from outside a system
  - to understand, look at the external source of organization
- In *self-organization*, the order emerges from the system itself
  - must look at interactions within system
- In biological systems, the emergent order often has some adaptive purpose
  - e.g., efficient operation of ant colony

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Fig. from NECSI

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## Why Are Complex Systems & Self-Organization Important for CS?

- Fundamental to theory & implementation of massively parallel, distributed computation systems
- How can millions of independent computational (or robotic) agents cooperate to process information & achieve goals, in a way that is:
  - efficient
  - self-optimizing
  - adaptive
  - robust in the face of damage or attack

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## Some of the Natural Systems We Will Study

- adaptive path minimization by ants
- wasp and termite nest building
- army ant raiding
- fish schooling and bird flocking
- pattern formation in animal coats
- coordinated cooperation in slime molds
- synchronized firefly flashing
- soft constraint satisfaction in spin glasses
- evolution by natural selection
- game theory and the evolution of cooperation
- computation at the edge of chaos
- information processing in the brain

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## Some of the Artificial Systems We Will Study

- artificial neural networks
- simulated annealing
- cellular automata
- ant colony optimization
- artificial immune systems
- particle swarm optimization
- genetic algorithms
- other evolutionary computation systems

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