

# Natural Computation

Transforming Tools of NBIC: Complex Adaptive Systems

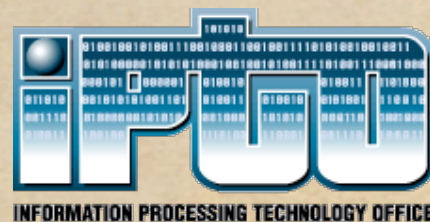


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Nanotechnology, Biotechnology, Information Technology, and Cognitive Science  
NBIC Convergence 2004

Converging Technologies for Improving Human Performance  
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# Agenda

- ◆ Victims of Success:  
Instrumentation and Computing
- ◆ Pattern Discovery
- ◆ Intrinsic Computation
- ◆ Distributed Emergent Computation in Plants
- ◆ Biological Information Processing



# Success in Instrumentation: Data Explosion

- ◆ Neurophysiology: multiple neuron recordings (> 100 neurons @ 1kHz)
- ◆ Web Data-Mining: 10-100 GB/day, multi-terabyte databases
- ◆ Astrophysical data: Hubble, EUV, Sky Survey, ...
- ◆ Neuroimaging: MEG 100-300 Squids (x 16 bits@ 1 kHz)
- ◆ Geophysics: Earthquake monitoring with 1000s sensors, of different kinds
- ◆ Bioinformatics: Genome projects, microarray sequencing, ...
- ◆ Searchable Video Databases
- ◆ Very large-scale simulations: weather, hydrodynamics, reaction kinetics, ...



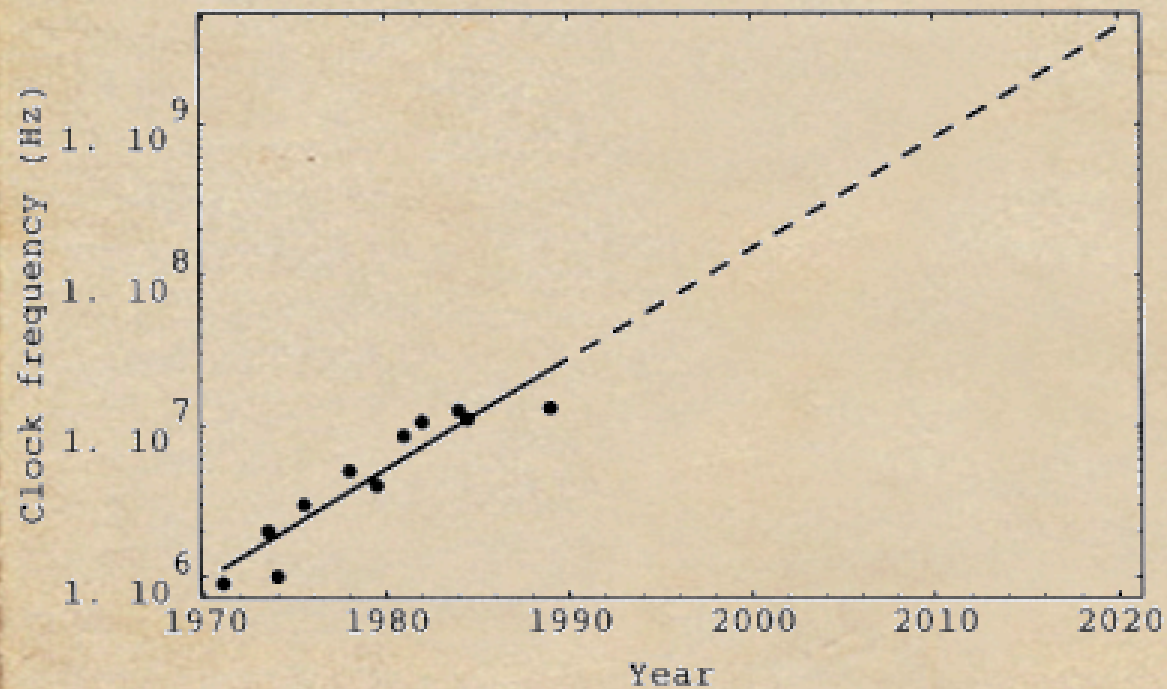
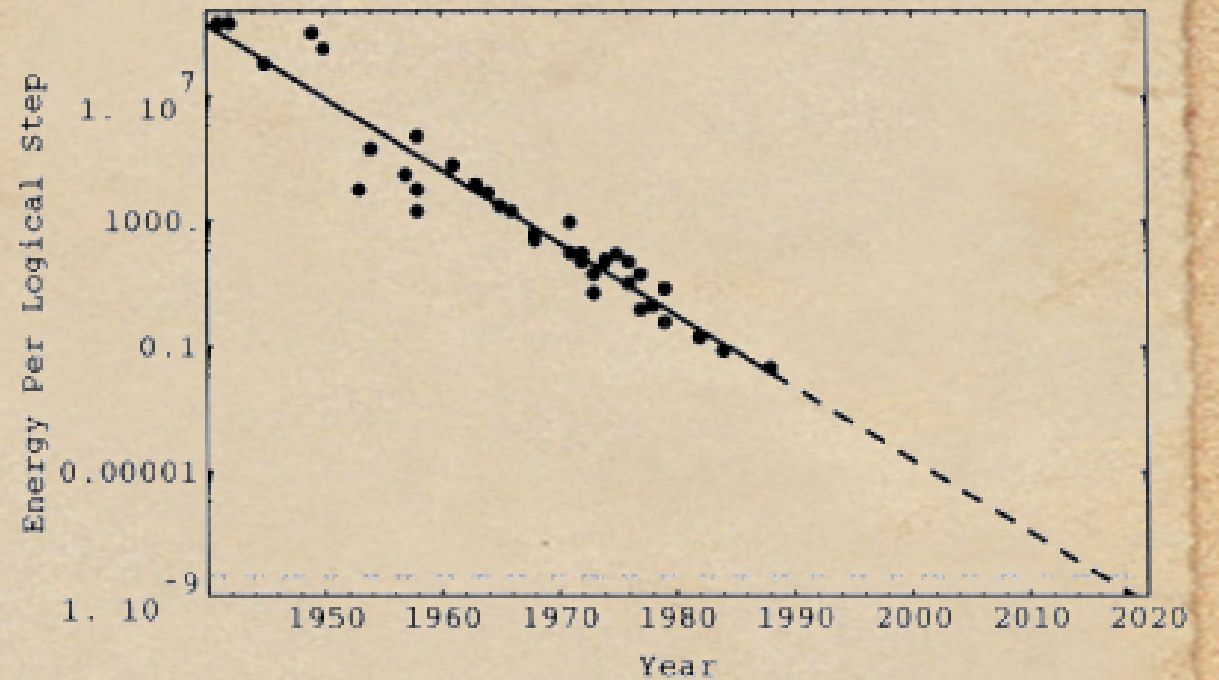
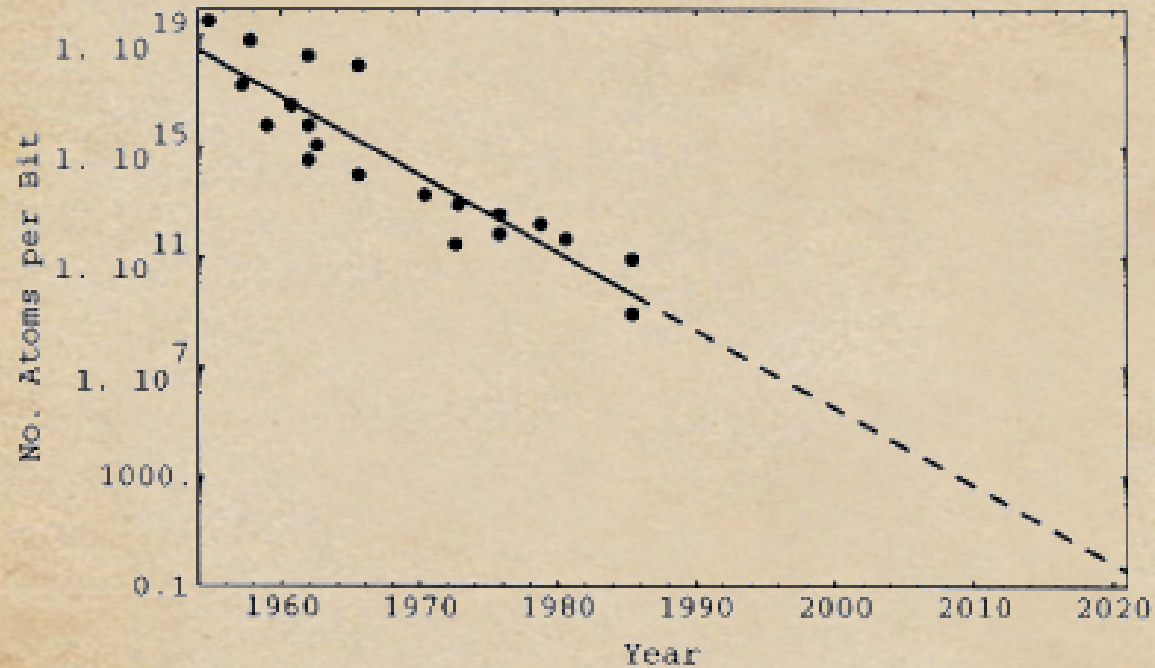
# Pattern Discovery

- ◆ Machines must help
- ◆ Understand “structure”, “pattern”, “regularity”, ...
- ◆ Well enough to teach machines
- ◆ Beyond Pattern Recognition

J. P. Crutchfield. Is Anything Ever New? Considering Emergence. In *Complexity: Metaphors, Models, and Reality*, G. Cowan, D. Pines, and D. Melzner, editors, *Santa Fe Institute Studies in the Sciences of Complexity XIX* Addison-Wesley, Reading, Massachusetts (1994) 479--497.



# Success in Computation



Roadblock in 2020:

1 bit per atom

1 kT per logical operation

40 GHz, 4 billion gates, 200 GB RAM

Dev Cost: 50% of GDP

Energy: 5% US total power

Keyes 1988, Malone 1995, Hutcheson 1996



# Intrinsic Computation

- ◆ How much stored historical information?
- ◆ How is that information stored?
- ◆ How is it processed to produce future behavior?

The Theory of Computational Mechanics:

J. P. Crutchfield and K. Young. Inferring Statistical Complexity. *Physical Review Letters* **63** (1989) 105-108.



# Success into Success?

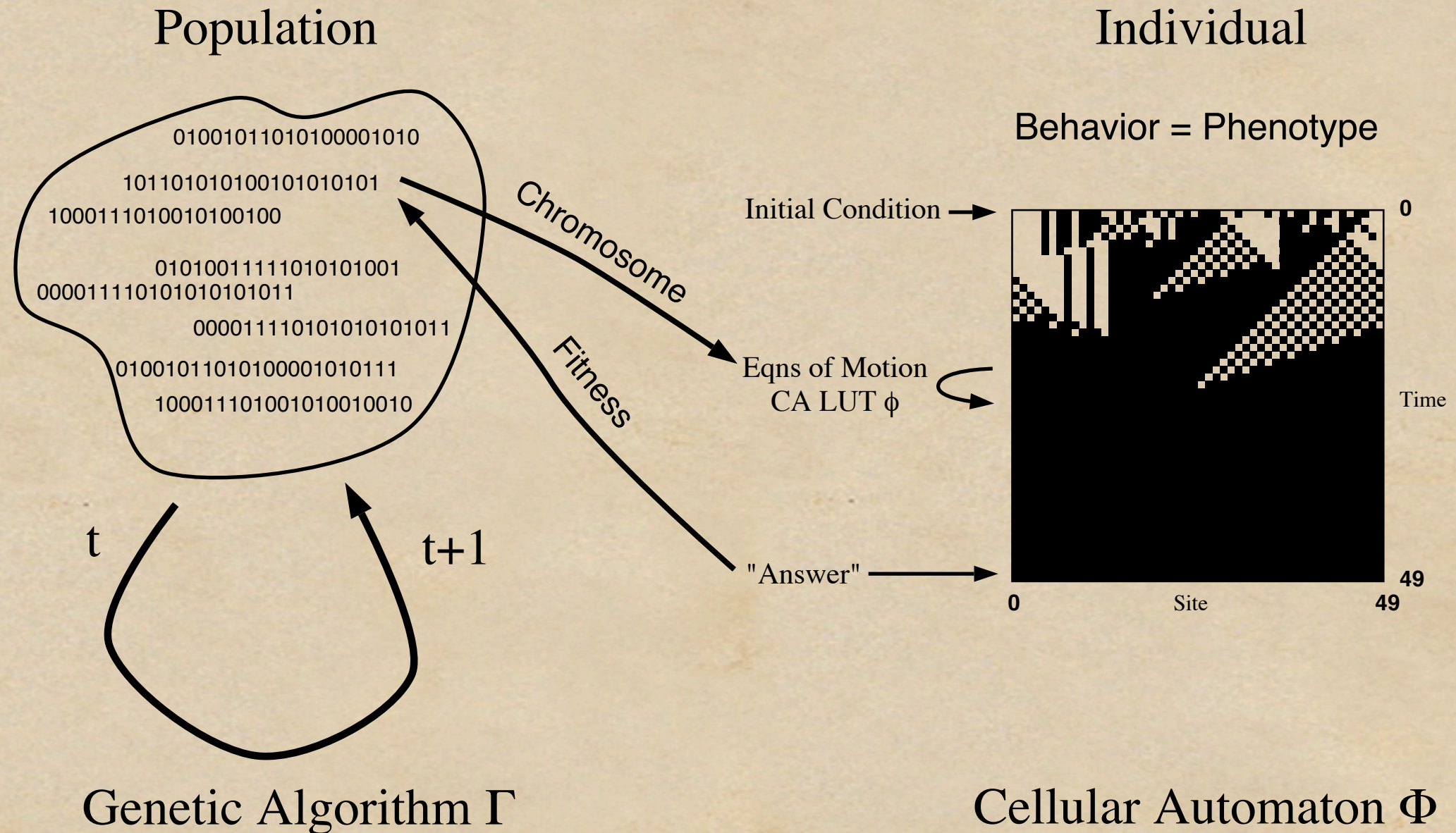
- ◆ Theory of pattern
- ◆ Theory of intrinsic computation
- ◆ These, it turns out, are the same:

How nature “computes” is how nature is “structured”



# Distributed Emergent Computation

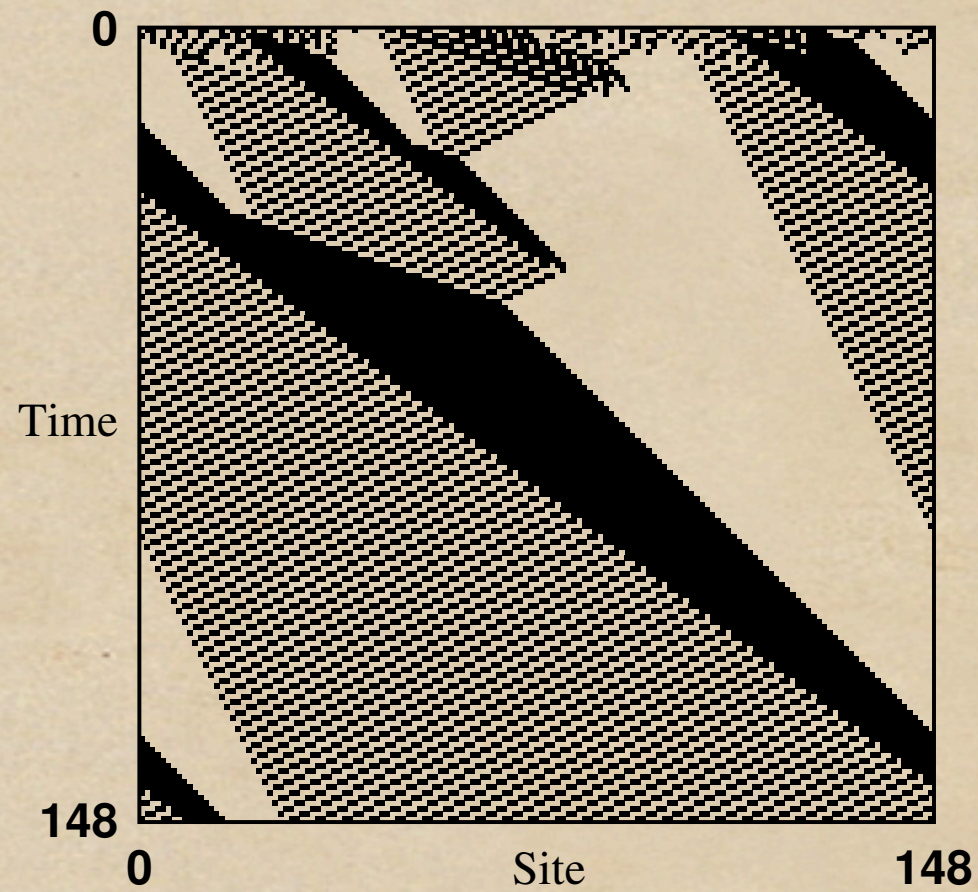
## A GA Evolves CAs



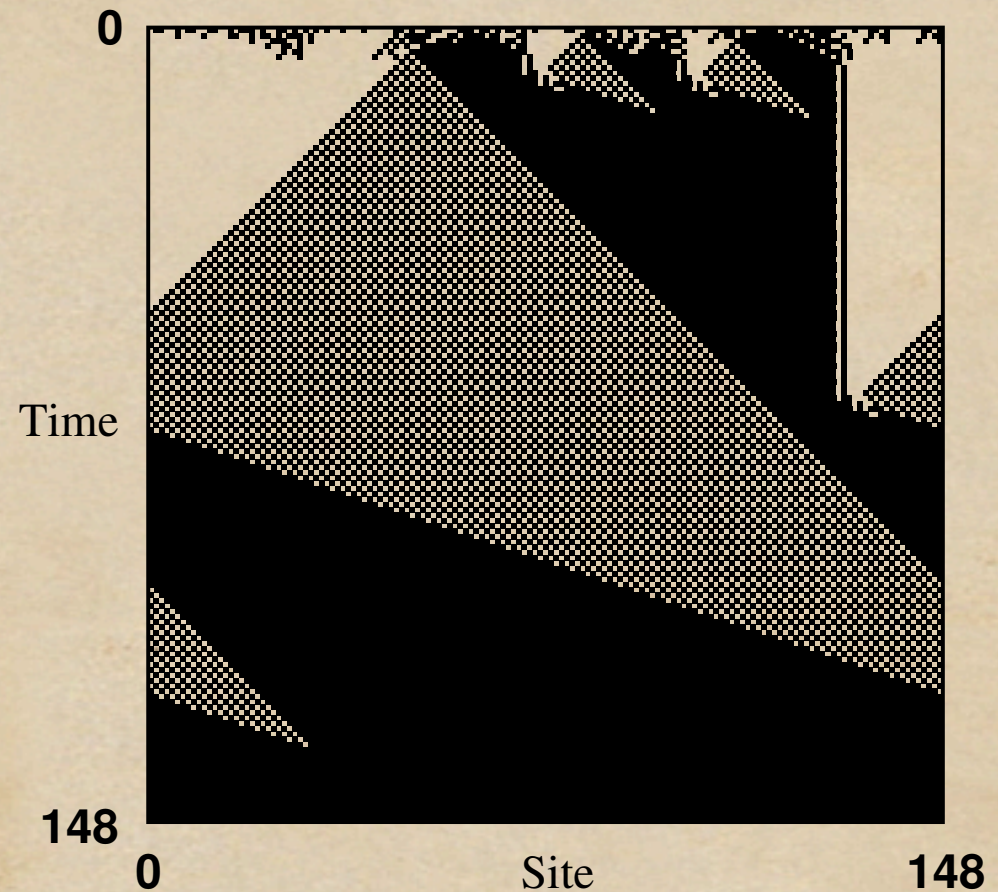
J. P. Crutchfield and M. Mitchell, The Evolution of Emergent Computation,  
*Proceedings of the National Academy of Sciences USA* **92** (1995) 10742-10746.



# Evolutionary Stages



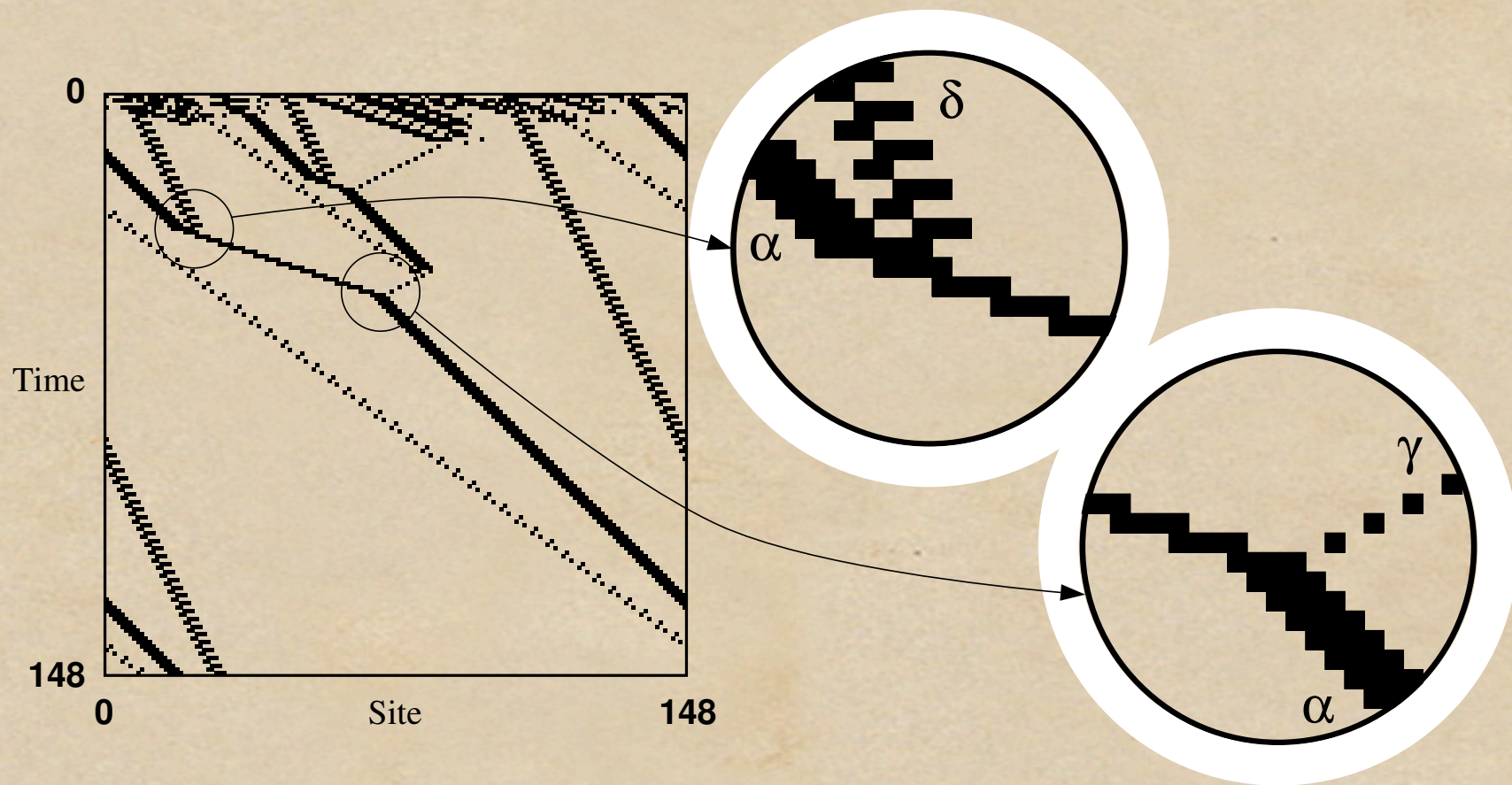
(a)



(b)

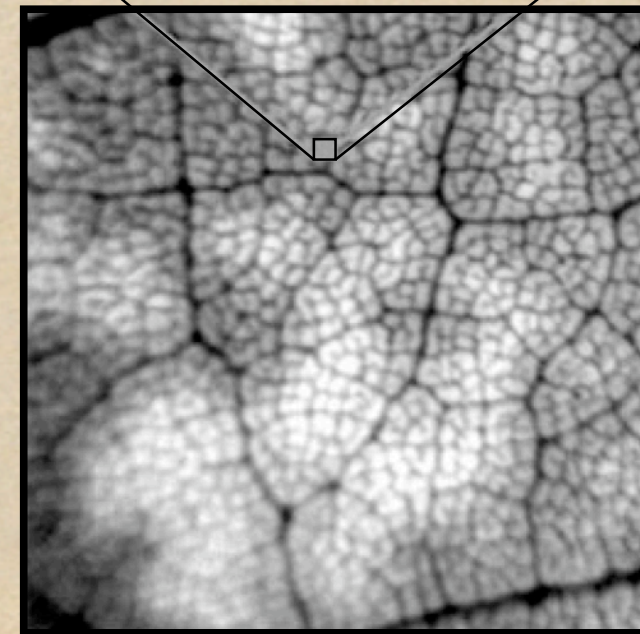
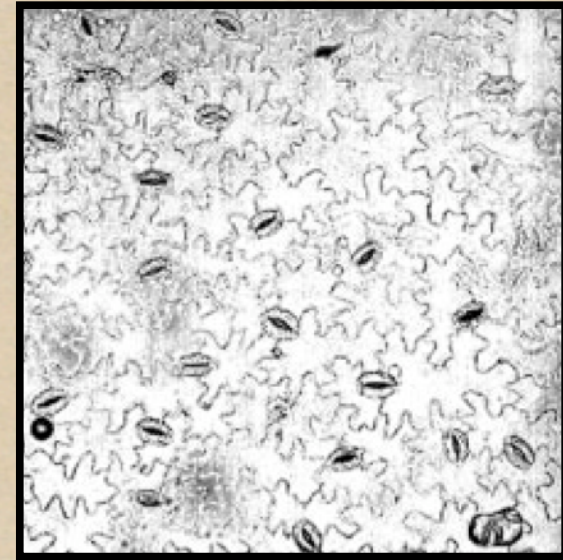


# Particle Analysis





# Stomataputers: Intrinsic Computation in Plant Respiration

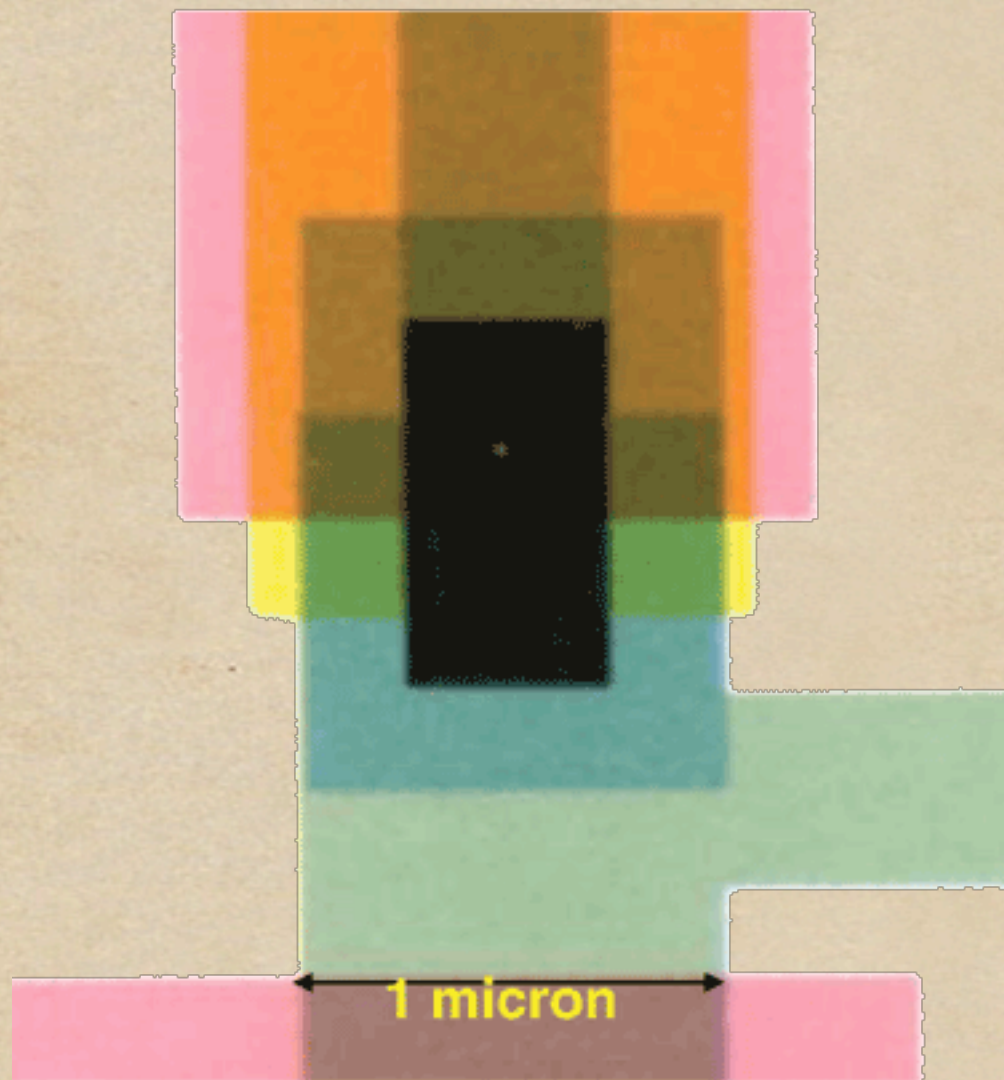


Peak, D. . . . and K. A. Mott. Evidence for complex, collective dynamics and emergent, distributed computation in plants. *Proceedings of the National Academy of Sciences* **101** (2004) 918-922.



# Intrinsic Computation in Molecular Biology

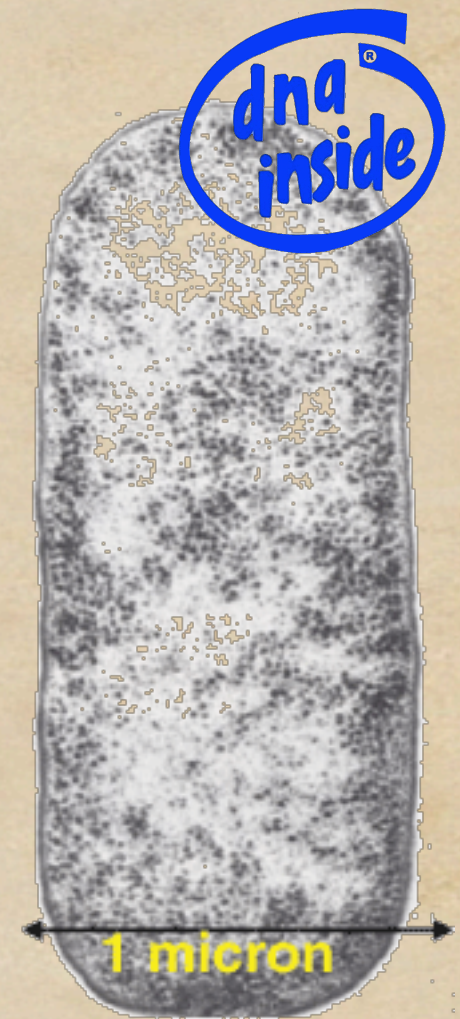
Pentium II



DVD



E. Coli





# Biological Information Processing

(w/ Walter Fontana & David Krakauer, SFI)

Component turn-over:

- Persistence of identity

- Memory of state via structure & form

Stochasticity (in number and recognition):

- Error-correction

Massive concurrency:

- Emergence of determinism

- Coordination & conflicts

Communication by contact:

- Energy transport

- Control of space

Function:

- Driven by energy, but

- Supported by transformation of stored information



Biological architectures emphasize systemic capacities:

Plasticity

Reconfigurability

Compressibility

Evolvability (neutrality, modularity)

Autonomy

Self

Robustness

Desirable but absent in today's computer architectures







# Novel Forms of Information Processing: Natural Computation

- ◆ Tech: Information storage and processing in new substrates, at new scales and speeds (nano/bio)
- ◆ Science: New View of how Nature organizes and computes (info/cogno)

Toward a Thermodynamics for the Information Age

[www.santafe.edu/~chaos](http://www.santafe.edu/~chaos)

[www.santafe.edu/projects/CompMech](http://www.santafe.edu/projects/CompMech)