# Enzymatic Computing

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# Biological Computing Substrates







#### **Outline**

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Access to a 19th century database...



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Access to a 19th century database...









The idea of the computer as we know it has been conceived in face of an intense need for tables:

- $\blacktriangleright$  Astronomical tables
- $\triangleright$  Barometrical tables
- $\blacktriangleright$  Nautical tables
- $\blacktriangleright$  Trigonometrical tables
	- . . .
	-







A computer in the 1940s (on the chair—not on the table!)







A computer in the 1940s (on the chair—not on the table!)







The equivalent of a server room...





Two place anourany is sufficient.  $300.3$  $D = S$  sec.  $\overline{S}$  {ft.  $= D/M.V.$  $1500.$  $N = 193$   $t^2$   $\{10\}$  $\overline{f_1}$  $N + J$  [in.]  $2D + s$  liest  $-575$   $N+1$ . j jMin.  $[2D + s]$ 800.K  $I \{in. \}$  $2S + S$  $5731$ side [Mit.] jump  $28 + R$ Mean vertical jump  $\epsilon$  . And it is a constant  $M_i$  in Mean side jump r assessed as so make several hill. Computed by-session-term Chaored by ------------ $D = 5 - - - - - - - - - -$ 





## The Present Computing Paradigm

#### Mechanisation of table calculation

- $\triangleright$  Fast, simple operations
- $\blacktriangleright$  Large cycle numbers

Universal Computation. . .  $\rightarrow$  Computer Science focused almost exclusively on processing *time* and memory *space*.







## The present computing paradigm: A GEAT SUCCESS!



Exponential progress over 30 years with essentially same operational principle and device structure.

#### Gordon Moore 1965





## The present computing paradigm: A GEAT SUCCESS!



Gordon Moore 1965

No doubt, this will end.

Exponential progress over 30 years with essentially same operational principle and device structure.







## Mechanisation of Table Calculation

TA 951 STATISTICS. NAUTICAL TABLES. **S EXPLANATORS OF THE TIBLES Constantine Physicians** 



*Right approach for any kind of information processing?*

*Suitable for any computational substrate?*



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## Why look for other paradigms?

#### **Efficiency**

- $\blacktriangleright$  Turing computable  $\neq$  real-time with a realisable device
- $\blacktriangleright$  Programmability has high cost

#### Scope

Programming is limited to compressible maps

**Density** Driven my material properties

*"It is not at all certain that in this domain a real object might not constitute the simplest description of itself, that is, any attempt to describe it by the usual literary or formal-logical method may lead to something less manageable and more involved."* John von Neumann, 1948







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#### Life needs Information Processing

- $\triangleright$  From the very outset living matter had to defend its intricate organisation against the onslaught of entropy.
- $\triangleright$  Subsequently the need to compete with rivalling life forms required evermore refined information processing.

 $\rightarrow$  *As a consequence organisms exhibit an intriguing sophistication in overcoming computationally difficult challenges.*



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## Nature vs. Engineering

#### Our paradigm

Machines designed to precisely enact a formalism that is arbitrary with regard to the computing substrate.

- $\blacktriangleright$  Physics of the machine is hidden from the programmer
- $\blacktriangleright$  Requires high energy barriers to enforce precise control over machine states

#### Nature's paradigm

No need for predictable behaviour of components and component interaction (but of course repeatability).

- $\blacktriangleright$  Large number of component interactions
- $\triangleright$  Course of computation driven by physics and chemistry
- $\blacktriangleright$  Small amounts of matter sufficient to implement function





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#### Nature's Molecular Computers



Seed germination: Complex, ambiguous sensor information has to be evaluated to make a crucial decision: to grow or not to grow.



Bacterial chemotaxis: Molecular motors are controlled according to the fused information from a large number of sensors.

#### *Single cells* → *all information is processed on the molecular level*





#### A Very Brief History of Molecular Computing

1970s First ideas (M. Conrad, 1972; E. Liberman, 1972)

- 1980s Many conceptual architectures, first experiments, Biophysical Institute at Puchino
- 1990s Several prototypes, DNA Computing (R. Birge, 1992; L. Adlemann, 1994; Winfree & Seeman, 1998) 2000 First commercial application (N. Hampp)





ACM 1985 Bacteriorhodopsin, 2000





#### Molecules offer:

- $\triangleright$  Reproducable nonlinearity
- $\triangleright$  Self-assembly (defined shape, additive weak forces)
- $\blacktriangleright$  High integration density of complex I/O mappings



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## Self-Assembly Computing

- $\triangleright$  Molecules are large enough to possess specific shape features.
- $\triangleright$  Molecules are small enough to explore each other by diffusion.
- $\triangleright$  Molecules interact through short range, additive electrostatic forces.
- If the shapes of two molecules are complementary, the numerous close contacts allow for potential energy to overcome entropy at relatively high temperature.





## Self-Assembly Computing



#### Abstract model of self-assembly processing

M. Conrad, 1989





## Self-Assembly Computing

- $\triangleright$  Symbolic pattern recognition  $\rightarrow$ free-energy minimisation
- $\triangleright$  Protein, RNA, DNA or organic molecules can be employed
- $\blacktriangleright$  Problem: diffusion does not scale up (Adam & Delbrück 1968)



The self-assembly properties of DNA oligonucleotides are relatively easy to predict.





### Conformation-based computing



#### Conformation fuses signals form the chemical context.





## Bacteriorhodopsin: A Photonic Automaton

- $\blacktriangleright$  Photocycle comprises at least 8 states
- $\triangleright$  B  $\rightarrow$  M transition produces photocurrent
- <sup>I</sup> Fastest transition:





Transition scheme for BR states commonly employed in information processing applications.





## Bacteriorhodopsin: Application



- $\triangleright$  Commercial application: holographic real-time image processing
- BR films with  $90 \times 90$  mm aperture
- Resolution: 5000 lp/mm
- $\triangleright$  BR can x support processing speed at video frame rate (30 f/s)
- $\blacktriangleright$  The optical computation in the joint transfrom correlator corresponds to  $900\,000 \times 900$ 000 pixels



#### Juchem & Hampp 2000





#### Cells offer:

- $\triangleright$  Cheap and fast nano-engineering (self-reproduction)
- $\triangleright$  QA build in (testing at point of assembly)
- $\triangleright$  Replenishment of components
- $\triangleright$  Self-reconfiguration and self-repair



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#### Vision (50+ years)

#### Molecular information technology at the border between inanimate and animate matter.



*inanimate*

*animate*

Future Information Processors





### Vision (50+ years)

#### Molecular information technology at the border between inanimate and animate matter.



#### *inanimate*

*animate*

#### Lab-on-chip  $\rightarrow$  Future



## Information Processors

#### $\leftarrow$  Living devices





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#### Potential Benefits

## Robotics at mm<sup>2</sup>-scale

- $\triangleright$  Bioimmersive devices
- $\triangleright$  Complexification of matter





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#### Orchestration of Informed Matter



#### *Computer Science needs to be expanded from formal to physical paradigms*





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### Towards artificial devices

Bacterial chemotaxis—sensory signals are processed on the molecular level to control a molecular motor.



#### We need:

- 1. a Robot
- 2. a Molecular Controller
- 3. an Interface







## Molecular Robot Control

1. The robot: A Braitenberg Vehicle



V. Braitenberg: Experiments in Synthetic Psychology, MIT Press, 1984





## Malate Dehydrogenase (MDH)

2. The Molecular Controller

L-malate + NAD<sup>+</sup>  $\xrightarrow{MDH}$  oxalacetate + NADH + H<sup>+</sup> Ma<sup>2</sup> Citrate NADH L-Malate Oxalacetate NAD<sup>®</sup>

Malate dehydrogenase

Malate dehydrogenase is an enzyme that occurs in a wide variety of species including the microbial world and plants.





## Molecular Robot Control

#### 3. Interfacing



#### Computer controlled fluidics to transduce signals from the robot's light sensors to chemical signals ("second messengers").





## Molecular Robot Control



The chemical signals from the robot's light sensors are processed by the enzyme malate dehydrogenase. The resulting output is detected with a spectrophotometer and used to control the wheels of the robot. with Naoki Matsumaru and Jeff Pfaffmann





#### Molecular Robot Control: MDH



Phototaxis of a Braitenberg Vehicle controlled by malate dehydrogenase activity. The nonlinear response of MDH allows the robot to remain within a zone of intermediate light level.

with Naoki Matsumaru and Jeff Pfaffmann









## From Cells to Circuits and back I

- $\triangleright$  Single cell (Plasmodium)
- **Very robust**
- $\triangleright$  Distributed, parallel, molecular information processing
- $\triangleright$  Cells can be shaped into circuits of coupled oscillators



*Physarum polycephalum*





Optical interfacing Cellular robot control



Grown in desired shape





#### Robot Control With a Cell



Signals from the robot's light sensors are projected onto the channels of the *Physarum* circuit. The oscillations of the cell are mapped onto the robot legs.



Tsuda, Zauner & Gunji, 2005





#### **Miniaturisation**



Original setup (2005)



Electronic interfacing (2006)



#### Integration in chip (2007)



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## Physarum on a chip



#### with Ferran Revilla and Hywel Morgan





## Physarum on a chip





- $\blacktriangleright$  Impedance Measurements at 100 kHz to 1 MHz
- $\triangleright$  Supply of water and nutriants
- $\triangleright$  Optically tarnsparent

with Ferran Revilla and Hywel Morgan











## Concluding Remarks

- 1. Interfacing with biological substrates is now becoming feasible in small devices
- 2. We *need new computing paradigms* to elicit efficient computation from the novel bio- and nano-materials that are becoming available
- 3. We need to learn to engineer systems that contain both "programmable" and "non-programmable" components.





#### *Many Thanks to:* MICHAEL CONRAD

YUKIO GUNJI,GARETH JONES, TOBIAS KLEEMAN, PAUL MACEY, NAOKI MATSUMARU, HYWEL MORGAN, JEFF PFAFFMANN, EFFIRUL RAMLAN, FERRAN REVILLA, ROBERT SPANTON, SOICHIRO TSUDA

#### NASA

Microsoft Research Cambridge

*Publications are available at:* www.ecs.soton.ac.uk/people/kpz/