

Instructors

Dr. Navneet Bhalla has been conducting research in self-assembly for 10 years. His specialties include using evolutionary computing to design, and 3D printing to fabricate, self-assembling systems. His research interests include synthetic development; applying the principles of biological development to create evermore complex self-assembling systems. Dr. Bhalla is currently a Postdoctoral Fellow at Cornell University. He graduated with a B.Sc. in Computer Science from the University of Ottawa, an M.Sc. in Intelligent Systems from University College London, and a Ph.D. in Computer Science from the University of Calgary.

Instructors

Dr. Peter J. Bentley is an Honorary Reader at the Department of Computer Science, University College London (UCL). Peter runs the Digital Biology Interest Group at UCL. His research investigates evolutionary algorithms, computational development, artificial immune systems, swarming systems and other complex systems, applied to diverse applications including design, control, novel robotics, nanotechnology, fraud detection, mobile wireless devices, security, art and music composition. He has published over 200 scientific papers and is editor of the books "Evolutionary Design by Computers", "Creative Evolutionary Systems" and "On Growth, Form and Computers", and author of "The PhD Application Handbook" and the popular science books "Digital Biology", "The Book of Numbers", "The Undercover Scientist" and "Digitized."

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Prof. Marco Dorigo is the inventor of the ant colony optimization metaheuristic. His research interests include swarm intelligence, swarm robotics, and metaheuristics for discrete optimization. He is the Editor-in-Chief of Springer's journal "Swarm Intelligence". He is a Fellow of the IEEE and of the ECCAI, and was awarded the Marie Curie Excellence Award in 2003, the Dr. A. De Leeuw-Damry-Bourlart award in applied sciences in 2005, the Cajastur "Mamdami" International Prize for Soft Computing in 2007, and an ERC Advanced Grant in 2010.

Prof. Marco Dorigo received his PhD in electronic engineering in 1992 from Politecnico di Milano, Milan, Italy. From 1992 to 1993, he was a research fellow at the International Computer Science Institute, Berkeley, CA. In 1993, he was a NATO-CNR Fellow, and from 1994 to 1996, a Marie Curie Fellow. Since 1996, he has been a tenured researcher of the FNRS, the Belgian National Funds for Scientific Research, and a research director of IRIDIA, the artificial intelligence lab of the Université Libre de Bruxelles.

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Agenda

- Introduction
- A Self-Reproducing Analogue
- DNA Nanotechnology and DNA Computing
- 3D Printed Self-Assembling Tiles
- Self-Assembling Robots
- Evolutionary Self-Assembly
- Staged Self-Assembly
- Conclusions

Self-Assembly

How do you design something that builds itself?





Motivation

- Self-assembly is considered to be a vital part to understanding the architecture of life [19]
- Self-assembly is viewed as an enabling technology for the creation of artificial systems [22]
- Engineering new technologies with natural characteristics, such as parallel construction, self-repair, reconfiguration, adaptability, and self-replication [16]

What is Self-Assembly?

- Origins in organic chemistry
- Self-assembly is not a formalized subject
- Self-assembly: autonomous "processes that involve pre-existing components (separate or distinct parts of a disordered structure), are reversible, and can be controlled by proper design of the components" [28]

Types of Self-Assembly

- Static self-assembly: processes that lead to structures or patterns in local or global equilibrium and do not dissipate energy [28]
- Dynamic self-assembly: processes that lead to structures or patterns that can only occur while the system is dissipating energy [28]
- Further subcategories of self-assembly include: templated, biological, netted systems, hierarchical, algorithmic, and software [4]

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- Tile Hard-coding Programming
- Staged Programming
- Tile Concentration Programming
- Temperature Programming

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DNA Nanot GECCO

DNA Nanotechnology and DNA Computing GECCO 2014 Tutorial: Self-Assembly

- The aTAM has been used to investigate the complexity of self-assembly
- The problem of determining if a set of tiles selfassemble into a target structure is an NPcomplete decision problem [1]
- The aTAM and its extensions have been used to investigate the algorithmic complexity of self-assembling a variety of target structure [15]





Level 1: Definition of Rule Set

- Component Rules: specify the arrangement of component information
- Environment Rules: specify temperature and boundary constraints
- System Rules: specify the frequency of component types, and component-component and component-environment interactions

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Level 2: Virtual Execution of Rule Set

	Tiling Models	
Model Features	сТАМ	aTAM
Seed Components	not required	required
Parallel Self- Assembly	yes	no
Number of Tile	multiple	one
2D/3D	2DcTAM/3DcTAM	2D
Rotations	2D/3D	no
One-Pot-Mixture	yes	yes
Error Checking	yes	no





Physical Encoding Scheme

- Place 1 permanent magnetic disc in each bit location in a key
- Place 2 permanent magnetic discs in each bit location in a lock
- Strong key-lock binding, and weak key-key binding (break using environment temperature)
- Assign magnetic-bit patterns to keys and locks to prevent or reduce mismatch errors

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Key/Lock	5-Bit	Label	Fits Rule	Breaks Rule
Lock	00000	I	I fits J → I+J	ф
Lock	10000	К	K fits L → K+L	φ
Lock	01010	М	M fits N \rightarrow M+N	ф
Lock	10011	Р	P fits $O \rightarrow P+O$	ф
Lock	00111	R	R fits $Q \rightarrow R+Q$	φ
Lock	10111	Т	T fits S → T+S	φ
Key	11111	J	J fits I → J+I	ф
Key	01111	L	L fits K → L+K	φ
Key	10101	Ν	N fits $M \rightarrow N+M$	φ
Key	01100	0	O fits $P \rightarrow O+P$	φ
Key	11000	Q	Q fits $R \rightarrow Q+R$	φ
Key	01111	S	S fits T → S+T	φ

3D System Rules

3D Printed Self-Assembling Tiles GECCO 2014 Tutorial: Self-Assemb 2D System Rules

Key/Lock	3-Bit	Label	Fits Rule	Breaks Rule
Lock	000	А	A fits B → A+B	ф
Lock	110	С	C fits D \rightarrow C+D	ф
Lock	011	E	E fits F → E+F	ф
Lock	101	G	G fits $H \rightarrow G+H$	ф
Key	111	В	B fits A → B+A	ф
Кеу	001	D	D fits C \rightarrow D+C	ф
Кеу	100	F	F fits E → F+E	ф
Кеу	010	Н	H fits $G \rightarrow H+G$	ф

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Self-Assembling Robots

- Self-propelled
- Externally propelled:
 - Component directed
 - Environment directed

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Evolving Self-Assembling Systems

- Hierarchical processes
- Self-assembly protocols
- Component and environment information (forwards problem)
- Specific component sets (backwards problem)













D (<mark>0,0,1</mark>)

B (1,1,1)

B (1,1,1) D (0,0,1) F (1,0,0)

H (0,1,0)

 $F2D = \left(0.18\sum_{i=1}^{5} |TOi - ANOi|\right) + 0.05(ANO6 + NO7)$

 $F3D = \left(0.15\sum_{i=1}^{n} |TOi - ANOi|\right) + 0.05(ANO7 + NO8)$

F (1,0,0)

H (<mark>0,1,0</mark>)

Evolutionary Self-Assembly





Leveraging Time

- Using components that cannot differentiate results in self-assembly being constrained to a limited set of components and their binding mechanisms
- Staging addresses this challenge by dividing the self-assembly process into time intervals, and encodes the construction of a target structure into the staging algorithm itself, and not exclusively into the design of the components [13]



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Synthetic Development

• Synthetic Development: applying the principles of evolution and biological development to the design and construction of selfassembling systems [7]



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3D System Rules

Key/Lock	5-Bit	Label	Fits Rule	Breaks Rule
Lock	00000	I	I fits J → I+J	φ
Lock	01111	L	L fits K → L+K	φ
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Lock	01100	0	O fits P → O+P	φ
Lock	11000	Q	Q fits R → Q+R	φ
Lock	01111	S	S fits T → S+T	φ
Key	11111	J	J fits I → J+I	φ
Key	10000	K	K fits L → K+L	φ
Key	10101	Ν	N fits $M \rightarrow N+M$	φ
Key	10011	Р	P fits O → P+O	φ
Key	00111	R	R fits Q → R+Q	φ
Key	10111	Т	T fits S → T+S	φ
		3D P	rinted Self-Assembling '	Tiles





Agenda Conclusions Introduction • A Self-Reproducing Analogue • Research in self-assembling systems is continuing to expand, within multiple disciplines DNA Nanotechnology and DNA Computing • One subfield that is still in its infancy is • 3D Printed Self-Assembling Tiles optimizing self-assembling systems, particularly • Self-Assembling Robots applying evolutionary computation • Evolutionary Self-Assembly • An area we believe to have tremendous promise is synthetic development • Staged Self-Assembly Conclusions 73 74 The Vision Acknowledgements

Hybrid 3D printing and self-assembly to fabricate

biomimetic products

Biomimetic products

Biomimetic products

that self-reconfigure

that self-repair

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