

The evolutionary origin of complex features

- Richard Lenski, Charles Ofra, Robert Pennock (Michigan), Christoph Adami (CalTech)
- Nature, 8 May 2003
- “A long standing challenge to evolutionary theory has been whether it can explain the origin of complex organismal features.”

Phenotypes

- “Computational metabolism”: Boolean functions with 1 or 2 arguments

AND	input-1	input-2	output
	0	0	0
	0	1	0
	1	0	0
	1	1	1

NOT	input-1	output
	0	1
	1	0

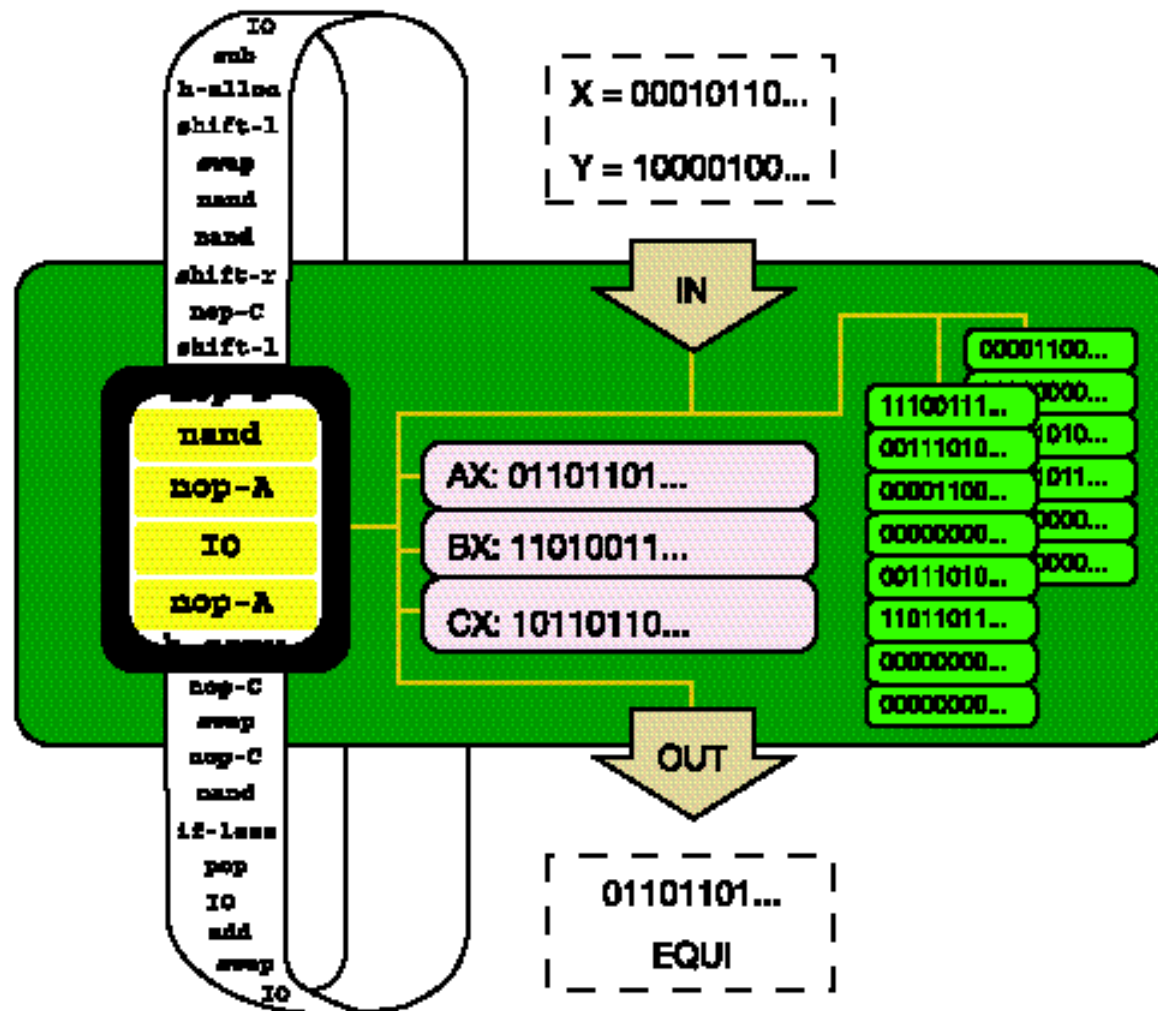
XOR	input-1	input-2	output
	0	0	0
	0	1	1
	1	0	1
	1	1	0

EQU	input-1	input-2	output
	0	0	1
	0	1	0
	1	0	0
	1	1	1

- Selfreplication

Genotypes

EQU						
#	Inst	AX	BX	CX	Stack	Output
1	IO	?	X	?	?	?
2	IO	?	X	Y	?	?
3	nop-C					
4	push	?	X	Y	X, ?	
5	nand	?	X nand Y	Y	X, ?	
6	swap	?	Y	X nand Y	X, ?	
7	nand	?	X or ~Y	X nand Y	X, ?	
8	swap	X or ~Y	?	X nand Y	X, ?	
9	nop-A					
10	pop	X or ~Y	X	X nand Y	?	
11	nand	X or ~Y	Y or ~X	X nand Y	?	
12	swap	X nand Y	Y or ~X	X or ~Y	?	
13	nop-C					
14	nand	X nand Y	X xor Y	X or ~Y	?	
15	push	X nand Y	X xor Y	X or ~Y	X xor Y, ?	
16	pop	X nand Y	X xor Y	X xor Y	?	
17	nop-C					
18	nand	X nand Y	X equ Y	X xor Y	?	
19	IO	X nand Y	Z	X xor Y	?	X equ Y

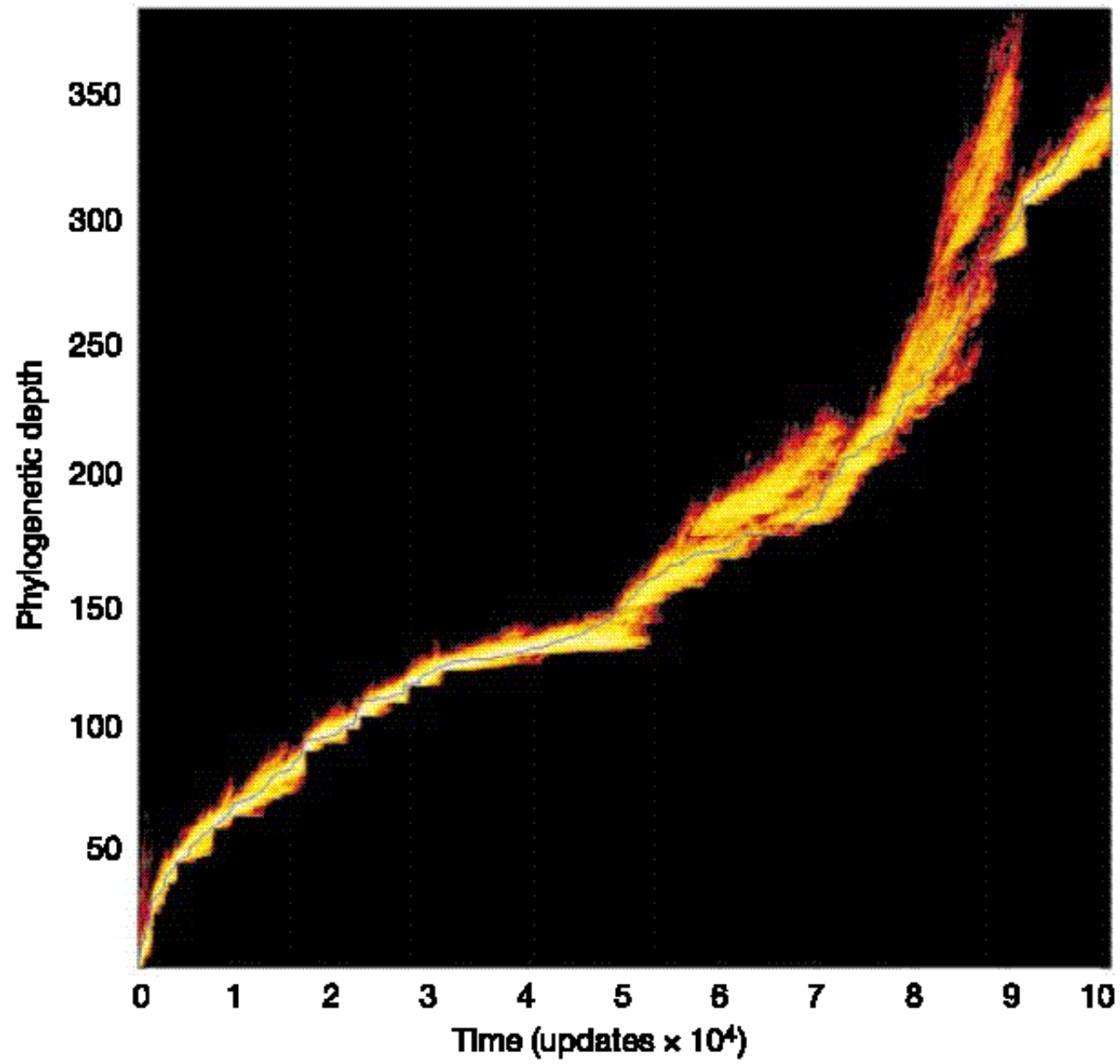


Fitness

Energy occurs as quanta, called “single-instruction processing” units. Each organism receives SIPs in proportion to its genome length.

Table 1 **Rewards for performing nine one- and two-input logic functions**

Function name	Logic operation	Computational merit
NOT	$\sim A; \sim B$	2
NAND	$\sim(A \text{ and } B)$	2
AND	A and B	4
OR_N	$(A \text{ or } \sim B); (\sim A \text{ or } B)$	4
OR	A or B	8
AND_N	$(A \text{ and } \sim B); (\sim A \text{ and } B)$	8
NOR	$\sim A \text{ and } \sim B$	16
XOR	$(A \text{ and } \sim B) \text{ or } (\sim A \text{ and } B)$	16
EQU	$(A \text{ and } B) \text{ or } (\sim A \text{ and } \sim B)$	32



Results: EQU evolves

- "there was a strong tendency for increased length to precede the origin of EQU" (p142) — *there is an explicit selection pressure on length*
- "The presence of deleterious mutations along the line of descent is more surprising. Fifteen of the 18 deleterious mutations [...] might have hitchhiked with beneficial mutations that arose soon after in the same genetic background" — *no reference to hitch-hiking theory in PG*
- "a mutation that was highly deleterious when it appeared was highly beneficial in combination with a subsequent mutation" — *how likely is it that populations in nature go through adaptive valleys? It depends on the representation.*

- "The evolution of a complex feature, such as EQU, is not always an inexorably upward climb toward a fitness peak, but instead may involve sideways and even backward steps, some of which are important." (p141) — *follows trivially from any "fitness landscape" type consideration, although it is a point that unfortunately still needs to be made in discussions with some "adaptationists"*
- "Although the mutation of only one instruction produced this innovation when it originated, the EQU function evidently depends on many interacting components." (p141) — *hardly a result of the simulations, because they already stated that when introducing the EQU function; i.e. it follows trivially from the problem definition*

- "The actual paths [toward the EQU function in different simulations] were much longer and highly variable, indicating the circuitousness and unpredictability of evolution leading to this complex feature." (p141)
- "beneficial mutations that produced this new function usually, but not always, engendered trade-offs in other aspects of performance" (p142) – *valid points, but follow so trivially from the non-linear genotype–phenotype mapping (and the resulting pleiotropy & epistasis) and mutation scheme that we didn't need these simulations to make these points.*
- "The consequences of asexual and sexual reproduction for the evolution of complex features deserves further research."

Simulations & Artificial Life

1. Hinton & Nowlan (1987): How learning can guide evolution
2. Hillis (1990): co-evolving parasites
3. Karl Sims & Thomas Ray: evolution of locomotion strategies
4. Boerlijst & Hogeweg (1991): Spiral waves (spatial pattern formation)
5. Kirby (2000): Cultural evolution of language

6. Pagie & Hogeweg: evolution of population-based vs. individual-based resistance

7. Watson & Pollack (2000): How symbiosis guides evolution

Wolfram (1d cellular automata), Hogeweg & Hesper (social dominance hierarchies), Pollack (fractal encoding of grammar), Dorigo et al (ant algorithms).