Introduction to Evolutionary Computation

Questions to consider during this lesson:

- How is digital evolution similar to biological evolution? How is it different?

- How can the principles of natural selection be applied to solve engineering design problems?

Evolution

Evolution is a process that results in heritable changes in the traits of a population of organisms over multiple generations

Evolution occurs whenever and wherever three conditions are met:

- replication (reproduction)
- variation (differences among individuals)
- **competition** (different reproduction rates)

This process is called natural selection. There are other mechanisms that contribute to the process of evolution, but natural selection is the main force that leads to adaptive traits

Introduction to Digital Evolution

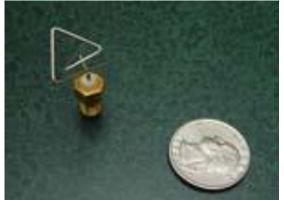
- Avida software was created to study the process of evolution ("a" = artificial "vida" = life)
- Digital organisms are small, self-replicating computer programs
- * Digital organisms live and reproduce in a virtual environment determined by the user
- Random replication errors cause mutations to occur in the programs as they reproduce, which leads to variation within a population



- Instance of evolution in a model environment
- Digital organisms and the environment in Avida differ from the biological world, but the mechanisms that cause evolution are the same
- The application enables researchers to address questions about evolution that are difficult or impossible to answer using biological organisms
 - Faster replication
 - Larger population sizes
 - Complete control over environment
 - Observe and record events without interfering

Evolutionary Computation & Engineering

- The principles of natural selection can be applied to engineering problems
 - A random set of potential solutions to a problem are competed in a modeled environment
 - * The best solutions outcompete less efficient solutions
- Evolutionary computation has been applied to solve many engineering problems, such as:
 - * robotic controllers and morphology
 - * self-managing computer systems
 - 🔹 a NASA satellite antenna 🗲



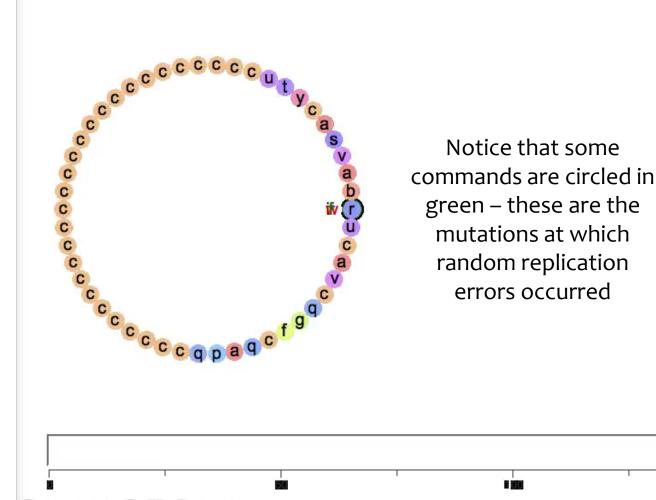


- Avida-ED is an educational version of Avida that was developed to teach evolution and the nature of scientific inquiry
 - * user-friendly interface
 - you can ask your own questions and collect data to answer them
 - * outcomes are not preprogrammed every run is unique
 - you can observe mutations, replication and the effects of evolution on a population

Digital Organism Replicating in Avida-ED

@ancestor

Flip to Settings



2 And: 0 3 Orn: 0 4 Oro: 0 5 Ant: 0 6 Nor: 0 7 Xor: 0 8 Equ: 0 Hardware Vinput array VOutput O-CORPERSION NO. Registers AX, BX, CX Stack A (first two frames) Stack B (first two frames) About to Execute r: h-alloc This instruction allocates additional memory for the organism up to the Vlust Executed (no instruction)

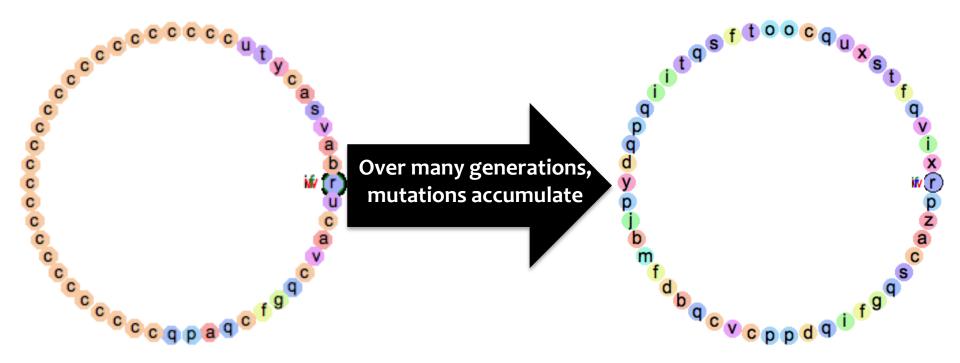
Function Counts

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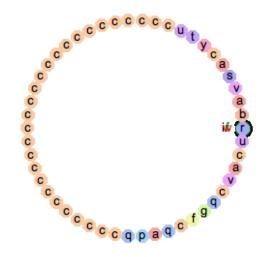
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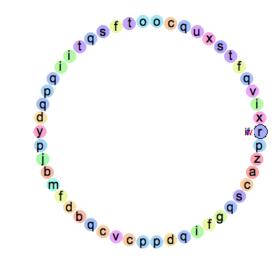
Digital Organisms in Avida-ED



A series of computer commands represented by letters (A-Z) Genetic information of the organism (similar to DNA)

Digital Organisms in Avida-ED process numbers from their environments





Original ancestor:

- Capable of replication only
- Half of its code is (c), which is a no-operation command

Descendant:

- Differs from ancestor due to random replication errors
- May have a series of commands that code for a specific function (for example, adding two numbers together)

The ancestor organism reproduces in the virtual petri dish and results in a population of unique individuals

000	Avida-ED	- Unnamed Workspace	Click here to	change	
Viewers Population	@default	Flip to Settings	the environi variables	mental	o
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The user controls which logic functions are rewarded, as well as the mutation rate and world size

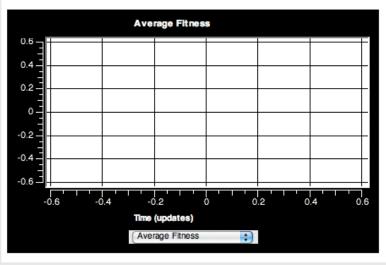
Viewers			
Population	@default Flip to Petri Dish		
Organism	Environmental Settings		
Analysis	Per Site Mutation Rate World Size		
Freezer	3.0 % 60 × 60 cells		
V Configured Dishes	Ancestral Organism(s)		
@example no_mutations			
V Populated Dishes			
@example Update200			
▼ Organisms @ancestor	Place offspring: Near their parent Anywhere, randomly		
	What resources are available in the environment? (strength of reward shown in parentheses)		
	Easy Moderate Hard Very Hard Brutal (x 2) (x 4) (x 8) (x 16) (x 32)		
	🗹 notose 🗹 andose 🗹 orose 🗹 norose 🗹 equose		
	🗹 nanose 🗹 ornose 🗹 antose 🗹 xorose		
	Repeatability Mode: Experimental (natural variation) Demo (forces exact replay) 		
	Pause Run: Manually At 0 updates		
	Freeze Petri Dish		

Click here to return to the virtual petri dish

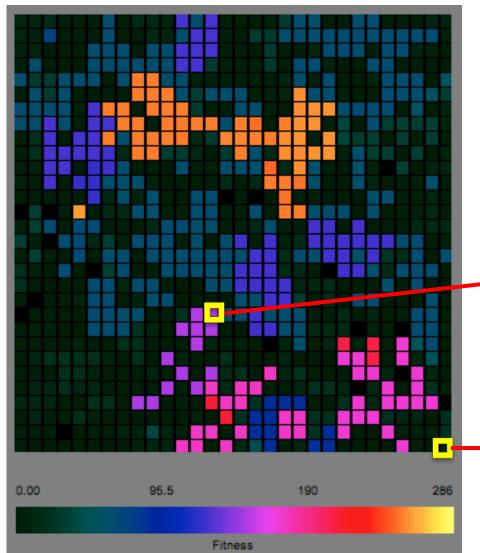
Fitness: -				
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Gestation: -				
Age (updates): -				
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Functions	Times Performed			
Not-	-			
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Ant-	-			
Nor-	-			
Xor-	-			
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	-			
Avg. Fitness:				
Avg. Metabolic Rate:				
Avg. Gestation:				
Avg. Age (updates):				
Functions	Orgs Performing			
Not] -			
Nan] -			
And] -			
Orn] -			
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stics



The sequence of commands differs among individuals. Certain logic functions are rewarded with increased "energy" (computing power), which allows the organism to execute its commands (and reproduce) faster



Individuals compete for space on the grid. Offspring are placed into a random adjacent box on the grid and may overwrite existing organisms.

t 0 0 c

^{'q}c_{vcppd}qi^{fgq'}

^ac_{vcppb}q^{hqi}^q

Individuals in a population can be viewed and saved in Avida-ED.

Summary

Avida-ED provides an instance of evolution because digital organisms:

- replicate
- differ from each other due to random replication errors
- compete for space on the virtual petri dish

Although the digital organisms are not identical to any biological organism, the processes that act on them and lead to evolution are the same

Software such as Avida can be used to solve engineering problems.

Each digital organism represents a possible solution and the digital environment is a model of the real-world conditions that the design would be subjected to. Discuss your answers to the following questions:

1. How is digital evolution similar to biological evolution? How is it different?

2. How can the principles of natural selection be applied to solve engineering design problems?