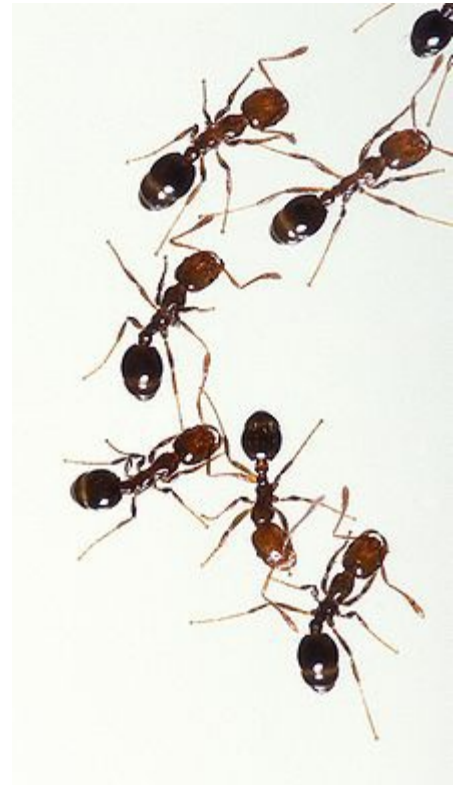


Emergent Behavior

Introduction

In the real world, organisms may individually behave in predictable ways. However, when they interact with other organisms, very complex behaviors can result. These are called emergent behaviors.

Agent-based modeling has the advantage of being particularly suited to the study of emergent behaviors. In this activity you will examine a simulation in which the behavior of an individual is quite predictable, but combining several agents within the simulation will result in unpredictable behavior



<http://en.wikipedia.org/wiki/Ant> (c)

Materials

- Paper and a writing utensil
- Computers with NetLogo and Microsoft®Excel® spreadsheet installed

Procedure

Part I: Simple, Predictable Behavior

1. Form pairs as directed by your teacher. Meet or greet each other to practice professional skills.
2. Review the code basics of NetLogo:

Refer to your downloadable resources for this material. Interactive

content may not be available in the PDF edition of this course.

3. Open the “Vants” simulation in NetLogo by selecting **File > Models Library** and then **Sample Models > Computer Science > Vants**.
4. Click the **setup** button and allow the simulation to run for at least 1,000 ticks. Describe the behavior you observe (you can see the number of ticks in the upper left hand corner of the viewport as shown below).



5. Switch to the **Code** tab of NetLogo. The entire code for the simulation is shown below.

```

to setup
  clear-all
  ask patches
    [ set pcolor white ]
  create-turtles num-vants
    [ face one-of neighbors4
      set color red
      set size 6 ]    ;; much easier to see this way
  reset-ticks
end

;; We can't use "ask turtles", because then the vants would
;; execute in a different random order each time.  So instead
;; we use SORT to get the turtles in order by who number.

to go-forward
  foreach sort turtles [
    ask ? [
      fd 1
      turn
    ]
  ]
  tick
end

to go-reverse
  foreach reverse sort turtles [
    ask ? [
      turn
      bk 1
    ]
  ]
  tick
end

to turn
  ifelse pcolor = white
    [ set pcolor black
      rt 90 ]
    [ set pcolor white
      lt 90 ]
end

; Copyright 2005 Uri Wilensky.
; See Info tab for full copyright and license.

```

Procedures in NetLogo are like functions in *Python*[®] programming language. This simulation has 4 procedures. What are their names?

6. The command `clear-all` on line 2 makes sure that there is nothing showing in the viewport from previous runs. Similarly, the `reset-ticks` command on line 9 makes sure that the tick counter is set back to 0 between runs. In your own words, describe the behavior of a Vant when the button that calls the go-forward procedure is clicked for the first time.
7. Imagine that a Vant starts out facing North in a viewport that has been freshly set up. It is at location (0, 0), which is the center of the viewport. Coordinates on the viewport are measured as they are on the Cartesian plane. After 5 clicks of the go-forward button, where will the Vant be located, what direction will it be facing, and what will the color of the patch underneath it be? Work through this problem without using NetLogo. Once you are finished, you may check your answer using the simulation.
8. When an agent's behavior is completely predictable in such a fashion as in the previous step, it is said to be deterministic. As a general guideline, if there is any way that you can know the

outcome of a simulation without having to run it, then it is a deterministic environment. If you add in more Vants, is the environment still deterministic? Why or why not?

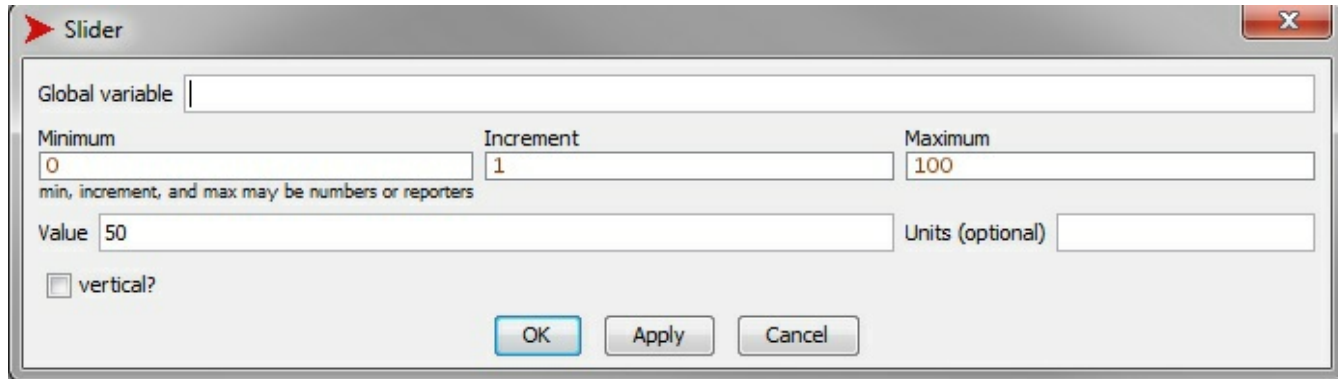
Part II: Unpredictable or Unforeseen

8. A model that incorporates randomness is called a **stochastic** model. Stochastic models are not reliably predictable in their outcomes. Name one way that you could modify the Vants model to make it a stochastic environment.
9. This model is an example used to show the emergence of ordered behavior from seemingly chaotic behavior. Let the model run for 11,000 ticks with one Vant. What behavior do you start to see emerge?
10. This kind of behavior doesn't necessarily lend itself well to the kind of Monte Carlo techniques we've used previously to analyze a simulation because the pattern that has evolved is primarily a visual one. Describe a method that you might use for determining when and how many highways Vants make.
11. Just because you didn't foresee a behavior occurring doesn't mean it's unpredictable. Remember that the Vants simulation as it is written is deterministic. Run the simulation with one Vant, again using the forward button. After a couple highways have formed, stop the simulation by clicking the forward button and then restart it by clicking the reverse button. Allow the simulation to run for a while and describe what you observe.
12. Modify the code by replacing the `turn` method with the following.

```
to turn
  ifelse pcolor = white
    [ set pcolor black
      ifelse random-float 100 < 0.25
        [ lt 90 ]
        [ rt 90 ] ]
    [ set pcolor white
      lt 90 ]
end
```

Run the simulation with as many Vants and using forward and reverse as you see fit to help you determine how the model behaves.

- Is the simulation stochastic or deterministic?
 - Do the Vants still make highways? If so, how are they the same or different?
13. In the Interface tab, select **slider** from the dropdown menu and click within the GUI frame. You should see this window.



14. You will now create a slider that allows you to control the value attached to the probability that a Vant wanders in that was added in the previous step. Enter the following values and then click **OK**:
 - Global variable: wander-factor
 - Minimum: 0
 - Increment: 0.1
 - Maximum: 1
 - Value: 0.2
15. In order for this slider to have any effect, you will need to change line 37 to read: `ifelse random-float 100 < wander-factor`. Once you have done this, try adjusting the slider to various values and running the simulation. What do you notice about how the values of wander-factor impact the agent's behavior?

Part III: In-Depth Analysis

16. In this part of the activity, you will perform an in-depth analysis of the effects of one key example of emergent behavior, genetics. A **genetic algorithm** (GA) is a means for solving a wide variety of computational problems using evolutionary theory as a model. Select **File > Models Library**, and then **Sample Models > Computer Science > Simple Genetic Algorithm**. Read through the Info tab of this simulation and answer the following questions with your partner.
 - What is the problem that this GA is attempting to solve?
 - What does a solution to this problem consist of?
 - What is the best solution to this problem?
 - In your own words, explain how a new generation of solutions is created.
17. In the image below, the black patches represent 0's in the best solution found so far, and the white patches represent 1's. Run the simulation once by clicking **setup** and then **go**. What happens over time to the best solution?
18. You will now walk through the creation and analysis of a BehaviorSpace experiment so that you can design and analyze the results from your own experiment later in this activity. Open Behavior Space by selecting **Tools > BehaviorSpace**. Click **New**. Set up your first experiment as follows:
 - Change the line under "Vary variables as follows" that involves `mutation-rate` to read `["mutation-rate" [0 1 10]]`.
 - Change the field "Measure runs using these reporters" to contain each of the following

lines:

```
max[fitness] of turtles
mean[fitness] of turtles
min[fitness] of turtles
```

- Un-tick the “Measure runs at every step” tick-box
- Set “Time limit” to 75.

Describe the data that will be produced by this experiment

19. Click **OK**, and then click **Run**. Save the spreadsheet file in a convenient location. It should look like this when you are done:

	A	B	C	D	E	F	G
1	BehaviorSpace results (NetLogo 5.0.5)						
2	Simple Genetic Algorithm.nlogo						
3	experiment						
4	04/25/2014 10:59:33:930 -0400						
5	min-pxcor	max-pxcor	min-pycor	max-pycor			
6	0	99	0	3			
7	[run number]	1	1	1	2	2	2
8	crossover-	70			70		
9	mutation-	0			1		
10	population	100			100		
11	plot-diversity	TRUE			TRUE		
12	[steps]	75	75	75	49	49	49
13							
14	[initial & final fitness]	max [fitness]	mean [fitness]	min [fitness]	max [fitness]	mean [fitness]	min [fitness]
15		86	86	86	100	96.87	94

20. Row 7 shows the run number. You can see that there are 3 columns for each run that you executed, for a total of 33 columns of data. Excel has some powerful functions for manipulating data. If you were only interested in the maximum value achieved by each solution population in each run, you could get all those values into one convenient location quickly using a formula.
 - In cell A16, type `=OFFSET(A15,0,(COLUMN(A15)*3-2))`. You should see the number from cell B15 appear in A16.
 - Drag the formula from A16 across all the cells in that row up to and including P16. You should see 0's appear in cells L16-P16.
 - Verify that all of the values in row 16 come from columns that contain `max [fitness] of turtles` in row 14.

Create a line chart of the data points shown in row 16. Include only the relevant values from row 16, and use proper conventions for creating a line chart.

21. As a class, brainstorm questions that you could answer about this model, using Behavior Space and the kind of Excel functions demonstrated in the previous step.
22. With your partner, design an experiment to examine a question of interest to you about this

model, execute the experiment, analyze the results, and produce a data visualization that accurately depicts the results of your analysis of the model.

Conclusion

1. Explain how Monte Carlo tools like Behavior Space have increased the amount of data available for analysis at a profound rate
2. Perform a Monte Carlo analysis of your own on a NetLogo model of your choice, and bring back a visualization of your experimental data to discuss as directed by your instructor.