#### NetLogo Basics

EES 4760/5760 Agent-Based & Individual-Based Computational Modeling Jonathan Gilligan

Class #3: Tues. January 17 2017

#### Agenda

- 1. Understanding structure of NetLogo models
- 2. Elementary NetLogo commands
- 3. Some principles of good programming
- 4. Overview of agent-based modeling

Start NetLogo on the computer in front of you.

Remember: All slides from class are posted:

- As PDF on Blackboard
- As live web pages at https://ees4760.jonathangilligan.org/

# Fundamentals of NetLogo

#### Four Fundamental Code Parts

```
globals []
                                                         1. Declaration of variables and collectives
turtles-own []
breed [wolves wolf]
to setup
  clear-all
   ask patches [ do-something ]
                                                         2. Model initialization
   ask turtles [ do-something ]
   reset-ticks
   ask patches [ do-something ]
                                                         3. Scheduled actions (tick)
   ask turtles [ do-something ]
   tick
end
to do-something-special
end
                                                         4. Submodels (science and cosmetics)
to do-something-boring
end
```

#### Objects (Nouns)

#### Two categories of objects:

- 1. Turtles
  - Turtles are any kind of agent
  - Turtles can move around
  - Turtles have properties (turtles-own)

```
turtles-own [ age height hunger ]
```

• Your model can have more than one "breed" of turtle (e.g., wolves and sheep)

```
breed [wolves wolf]
breed [sheeps sheep] ; names must be distinct
```

#### 2. Patches

- Patches represent the environment in which turtles live
- Patches are always square and stationary
- Like turtles, patches can have properties patches own

#### Operations (Verbs)

#### Two kinds of operations:

- 1. Procedures
  - Do things (eat, move, grow, buy, sell, ...)
  - Defined using to:

```
to wander
right random 360
forward random 5
end
```

- 2. Reporters
  - Calculate something and return a value
  - Defined using to-report:

```
to-report turtles-nearby report count turtles-on neighbors end
```

#### Let's Build A Model!

#### A Simple Model of an Ecosystem

- The landscape is initialized with random amounts of sugar on each patch
- 100 turtles live on the landscape
- At each tick:
  - Every patch adds 0.075 to its sugar up to a maximum of 100
  - Every turtle's hunger increases by 1, up to a maximum of 10
  - Every turtle eats sugar until it is no longer hungry, or the sugar on that patch runs out
  - The turtle decides whether it wants to move:
    - If there are other turtles on the patch, or if there is not enough sugar on the patch to satisfy its hunger, then the turtle will move to the neighboring patch with the largest amount of sugar.

#### Create a New Model

- In NetLogo, open File menu and choose New
- Add three buttons:
  - "setup" (type "setup" in "Commands" space)
  - "go" (check the "forever" button)
  - "step" (type "go" in "Commands" space and "step" in "Display Name")
- Go to the code tab and type this:

```
globals
[
max-sugar
sugar-growth
]
turtles-own [ hunger ]
patches-own [ sugar ]
```

#### Model Initialization (setup)

Include only things done once to initialize the model

#### Example:

clear-all

setup patch variables paint patches in neat colors

create turtles

setup turtle variables, etc. plot initial model state (histograms, etc.)

reset-ticks

#### Initialize Your Model

Type this into the code tab for your model:

```
to setup
  clear-all
  set sugar-growth 0.075
  set max-sugar 100
  ask patches
    set sugar random max-sugar
    update-pcolor
  create-turtles 100
    setxy random-xcor random-ycor
    set hunger 5
    update-color
  reset-ticks
end
to update-color
end
to update-pcolor
end
```

#### Scheduled Actions (go)

- "go" is repeated over and over to execute model.
- Include only stuff to be executed each time step
- Keep the "go" procedure simple and neat
  - For complicated stuff, call submodels
- Include termination point

#### Type this into your model:

```
to go
 tick
 ask turtles [
    if hunger < 10 [ set hunger hunger + 1 ]
    eat
    move
    update-color
  ask patches
    if sugar < max-sugar [ set sugar sugar + sugar-growth ]</pre>
    update-pcolor
  if ticks > 2000 [ stop ]
  Submodels
to eat
end
to move
end
```

# Tricky Things

#### tick vs. ticks

- tick (verb) increments time by one period
- ticks (noun) measures the time elapsed since the start
- More technical explanation:
  - NetLogo has an internal tick counter
    - tick increments the tick counter
    - ticks reports the current value of the tick counter

#### tick vs. ticks

#### Good code:

```
to go
    tick

if ticks > max-ticks
       [stop]
...
    ask turtles [set age ticks]
end
```

#### Bad code:

```
to go
   ticks

if tick > max-ticks
     [stop]
...
ask turtles
   [
        tick
        set age ticks
]
end
```

#### Elementary NetLogo Commands

- 1. Searching NetLogo dictionary
- 2. Working with agentsets
- 3. Working with variables
- 4. Code branching (conditional statements)
- 5. Working with stochasticity
- 6. Working with graphics
- 7. How to make your code legible to others (documentation, comments, and tabbing)

#### Searching NetLogo Dictionary

- NetLogo dictionary is a web page
- Use "Find on this page" in your web browser.

### Working with agentsets (ask)

- An agentset is a group of zero or more turtles, patches, etc.
  - Plural nouns (turtles, patches) refer to agentsets.
  - Singular nouns (turtle, patch) refer to individual agents.
- "ask" tells an agent or all members of an agentset to do the code in the following brackets:

```
ask turtles [forward 5]
```

- All members of the agentset do the code, one at a time
- Be careful not to put anything in the brackets that should not be repeated for each member of the agentset!

#### How are these different?

```
ask turtles
[
buy
sell
update-bank-account
]
```

```
ask turtles [buy]
ask turtles [sell]
ask turtles [update-bank-account]
```

### Working with agentsets (with)

- turtles is an agentset of all turtles.
- "with" is one of many primitives that subset an agentset:

```
ask turtles with [color = blue] [move]
```

- Similar keywords for sub-setting: with-min, with-max, n-of, max-n-of, min-n-of, one-of, max-one-of, min-one-of
- Use the dictionary to look up correct syntax.

### Working with agentsets (of)

- "of" provides a *list* of the values of an -own variable
  - set happiness min [happiness] of neighbors
- More generally, "of" is a primitive for getting a value from *another* agent or agents
  - set happiness [happiness] of a-neighbor-turtle
- Use the dictionary to look up correct syntax.

#### Add Movement to Our Model

```
to move
   if hunger > sugar
[
      move-to max-one-of neighbors [ sugar ]
]
end
```

If there isn't enough sugar to satisfy the turtle, it moves to the neighboring patch with the most sugar.

### Working with agentsets (=, set)

- Two fundamental kinds of operations:
  - Changing the value of a variable:
    - Assignment operations (set)
  - Checking to see whether a value satisfies some condition:
    - Conditional operations (=, also >, <, >=, <=, !=)</li>

#### Equals or no equals?

# Assignment statements • Wrong: happiness = ([happiness] of a-neighbor-turtle) • Right: set happiness ([happiness] of a-neighbor-turtle)

#### Equals or no equals?

#### Assignment statements

• Wrong:

```
happiness = ([happiness] of a-neighbor-turtle)
```

• Right:

```
set happiness ([happiness] of a-neighbor-turtle)
```

#### Conditional statements (Boolean: yes or no)

```
if happiness = 3
    [stop]

if happiness <= 3
    [stop]

if happiness != 5 or ticks > 17
    [stop]
```

#### Working with variables: set vs. let

- Global variables (known to all procedures)
- Local variables (known only to one procedure)
- Use let to create and set the value of a new local variable:

```
let mean-neighbor-size mean [size] of turtles-on neighbors
```

Use set to change the value of an existing variable (global, local, patch, turtle, etc.)

```
set wealth wealth * 1.1 set hypotenuse sqrt(a ^{\circ} 2 + b ^{\circ} 2)
```

#### Working On Our Model

Type this into "code" tab to update to eat and to move in our model:

```
to eat
 ifelse hunger > sugar
    ; Use set to change an existing variable "hunger"
    set hunger hunger - sugar
    set sugar 0
    set sugar sugar - hunger
    set hunger 0
end
to move
 if hunger > sugar or any? turtles-here
    ; Use let to create a new variable "dest"
    let dest max-one-of neighbors [ sugar ]
   move-to dest
end
```

- How does one patch (or turtle) give the value of one of its variables to other patches?
  - There are two ways to do this.

```
ask neighbors [set pcolor [pcolor] of myself]

let my-color pcolor

ask neighbors [set pcolor mycolor]
```

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- Converse is not true: Patches don't automatically see turtles-own

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- Why?

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- Turtles implicitly access patches-own variables (e.g., pcolor, sugar) of the patch they're on as though they were turtles-own
- Converse is not true: Patches don't automatically see turtles-own
- Why?
  - A turtle can only be on one patch at a time,
  - but a patch may have multiple turtles.

### Code branching (conditional statements)

### Working with stochasticity (randomness)

Uniform distribution of random numbers between a and b:

```
a + random (b-a)
```

Normal distribution with mean m and std. deviation s:

```
random-normal m s
```

Selecting one patch at random and turn it green

```
ask one-of patches [set pcolor green]
```

Selecting one agent at random from an agentset and turn it right 5 degrees:

```
ask one-of turtles [right 5]
```

# Working with graphics

	black = 0					white =						
gray = 5	0	1	2	3	4	5	6	7	8	9	9.9	
red = 15	10	11	12	13	14	15	16	17	18	19	19.9	
orange = 25	20	21	22	23	24	25	26	27	28	29	29.9	
brown = 35	30	31	32	33	34	35	36	37	38	39	39.9	
yellow = 45	40	41	42	43	44	45	46	47	48	49	49.9	
green = 55	50	51	52	53	54	55	56	57	58	59	59.9	
lime = 65	60	61	62	63	64	65	66	67	68	69	69.9	
turquoise = 75	70	71	72	73	74	75	76	77	78	79	79.9	
cyan = 85	80	81	82	83	84	85	86	87	88	89	89.9	
sky = 95	90	91	92	93	94	95	96	97	98	99	99.9	
blue = 105	100	101	102	103	104	105	106	107	108	109	109.9	
violet = 115	110	111	112	113	114	115	116	117	118	119	119.9	
magenta = 125	120	121	122	123	124	125	126	127	128	129	129.9	
pink = 135	130	131	132	133	134	135	136	137	138	139	139.9	

## Updating Our Model

Type the following into the "code" tab to update the procedures update-pcolor and update-color

```
to update-pcolor
set pcolor scale-color yellow sugar 0 (2 * max-sugar)
end

to update-color
ifelse hunger > 5
[
set color scale-color red hunger 15 5
]
[
set color scale-color green hunger 5 -5
]
end
```

- scale-color color number range1 range2 sets the lightness of the color. Higher numbers = lighter, lower = darker.
- If range1 > range2, light and dark are reversed.

## Running Our Model

- Press "Check" and make sure there are no syntax errors
- Go to "Interface" tab
- Click on "setup"
- Click on "go"
- You can download a copy of the model from https://ees4760.jonathangilligan.org/models/class\_03\_example.nlogo

### Monitoring and Interacting with a Model

#### On the "interface" tab:

- Right click and add a Plot
  - Name the plot "Hunger"
  - Set X max to 10 and Y max to 100
  - Type "Hunger" for "X axis label" and "# Turtles" for "Y axis label"
  - Click on the pencil icon under "default" pen
    - Choose "Bar" for "Mode"
    - In "Pen update commands" type histogram [hunger] of turtles
  - Press "OK"

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    - Choose "Bar" for "Mode"
    - In "Pen update commands" type histogram [hunger] of turtles
  - Press "OK"
- Right click and add a Slider
  - Type "sugar-growth" into "Global Variable"
  - Set minimum to 0, increment to 0.005, maximum to 0.1, and value to 0.075

### Monitoring and Interacting with a Model

#### On the "interface" tab:

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  - Name the plot "Hunger"
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  - Click on the pencil icon under "default" pen
    - Choose "Bar" for "Mode"
    - In "Pen update commands" type histogram [hunger] of turtles
  - Press "OK"
- Right click and add a Slider
  - Type "sugar-growth" into "Global Variable"
  - Set minimum to 0, increment to 0.005, maximum to 0.1, and value to 0.075
- Open the code tab and comment out definition and initialization of sugar-growth

```
globals
[
    max-sugar
    ; sugar-growth
]
...
to setup
    clear-all
    ; set sugar-growth 0.075
...
```

## Play with the model

- Do interesting things happen for different values of sugar-growth?
- It might be fun to comment out the line in to go that stops the model after 2000 ticks

```
; if ticks > 2000 [ stop ]
```

# Good Practices for Programming

## Making your code legible to other people

- 1. Comment, comment, comment.
  - Variable declaration: purpose, legal values
  - Procedure: purpose and description
  - Submodel equations: cite and explain
- 2. Indent code so it shows clear blocks
- 3. After you're finished coding, take time to write detailed documentation (ODD)

### When in doubt, use this.

NetLogo
User Manual
version 5.3
December 14, 2015

#### Release Notes

What's New?
System Requirements
Contacting Us
Copyright / License

#### Introduction

What is NetLogo?
Sample Model: Party

#### Learning NetLogo

Tutorial #1: Models
Tutorial #2: Commands
Tutorial #3: Procedures

#### Reference

Interface Guide
Info Tab Guide
Programming Guide
Transition Guide
NetLogo Dictionary

#### **NetLogo Dictionary**

NetLogo 5.3 User Manual

#### Alphabetical: ABCDEFGHIJLMNOPRSTUVWXY?

Categories: Turtle - Patch - Agentset - Color - Task - Control/Logic - World - Perspective Input/Output - File - List - String - Math - Plotting - Links - Movie - System - HubNet

Special: Variables - Keywords - Constants

#### Categories

This is an approximate grouping. Remember that a turtle-related primitive might still be used by patches or the observer, and vice versa. To see which agents (turtles, patches, links, observer) can actually run a primitive, consult its dictionary entry.

#### **Turtle-related**

back (bk) <br/>
back (bk) <br/>
breeds>-at <br/>
breeds>-here <br/>
breeds>-on can-move? clear-turtles (ct) create-<br/>
create-ordered-turtles (cro) create-turtles (crt) die distance distancexy downhill downhill4 dx dy face facexy forward (fd) hatch<br/>
hatch-<br/>
breeds> hide-turtle (ht) home inspect is-<br/>
breed>? is-turtle? jump layout-circle left (lt) move-to myself nobody<br/>
no-turtles of other patch-ahead patch-at patch-at-heading-and-distance patch-here patch-left-and-ahead patch-right-<br/>
and-ahead pen-down (pd) pen-erase (pe) pen-up (pu) random-xcor random-ycor right (rt) self set-default-shape set-<br/>
line-thickness setxy shapes show-turtle (st) sprout sprout-<br/>
breeds> stamp stamp-erase stop-inspecting subject subtract-<br/>
headings tie towards towardsxy turtle turtle-set turtles turtles-at turtles-here turtles-on turtles-own untie uphill uphill4

### Agent-based models

- Agents/Individuals are discrete, unique, and autonomous entities.
- Discrete entities: Important at low densities
- Unique: Individuals, even of same age and species, can be different
- Individuals have a life history
- Interactions among individuals are usually local, not global
- Individuals make decisions, which can be adaptive
- Ecology or society emerges from individual behavior (bottom-up)

## Why agent-based models?

- 1. Individuals/agents are unique and different
- 2. Individuals/agents interact locally
- 3. Individuals/agents show adaptive behavior

## Why agent-based models?

Use ABM if *one or more* of the following are **essential** to your research question:

- 1. Individual variability
- 2. Local interactions
- 3. Adaptive behavior
- ABMs that include all three elements can be called full-fledged.
- Most ABMs focus on only one or two elements.

## Why not agent-based models?

- Too complex
- Too data hungry.
- Too many parameters unknown.
- Too much uncertainty in model structure.
- Hard to test.
- Require too much person and computer power.

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When ABMs are too hard, use aggregated modeling techniques:

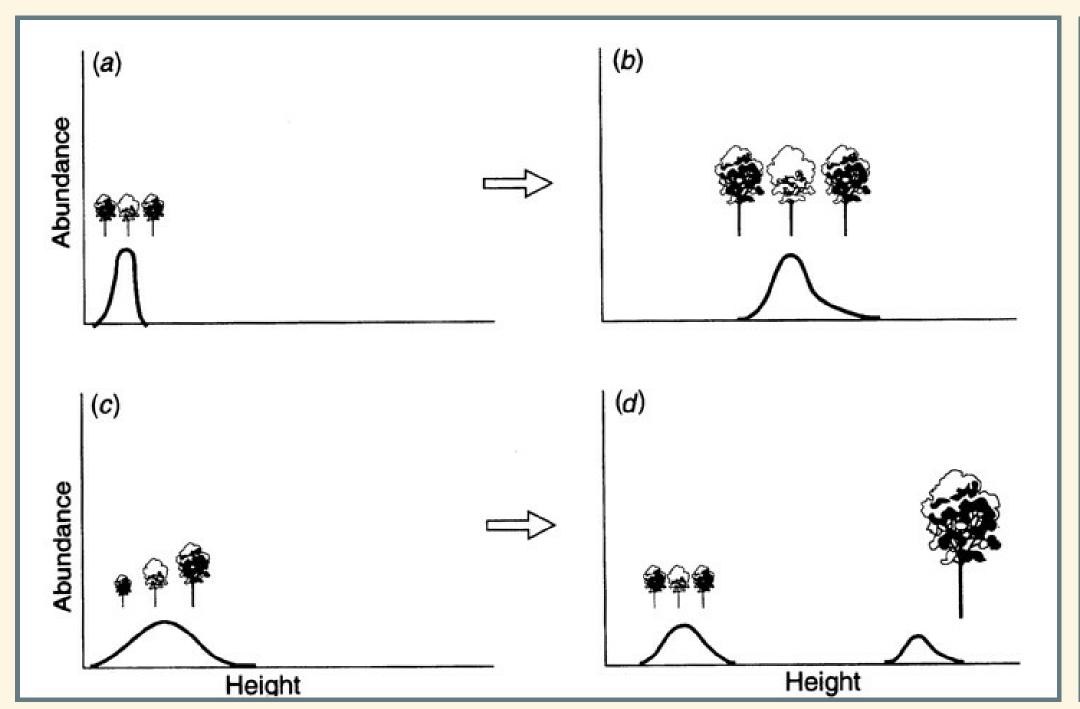
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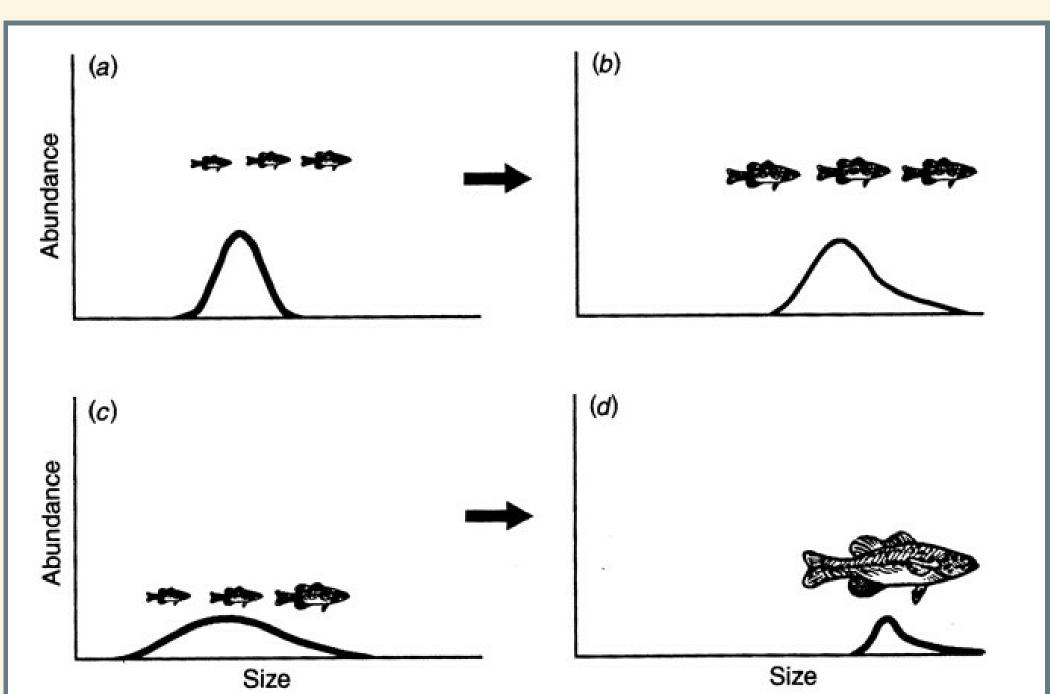
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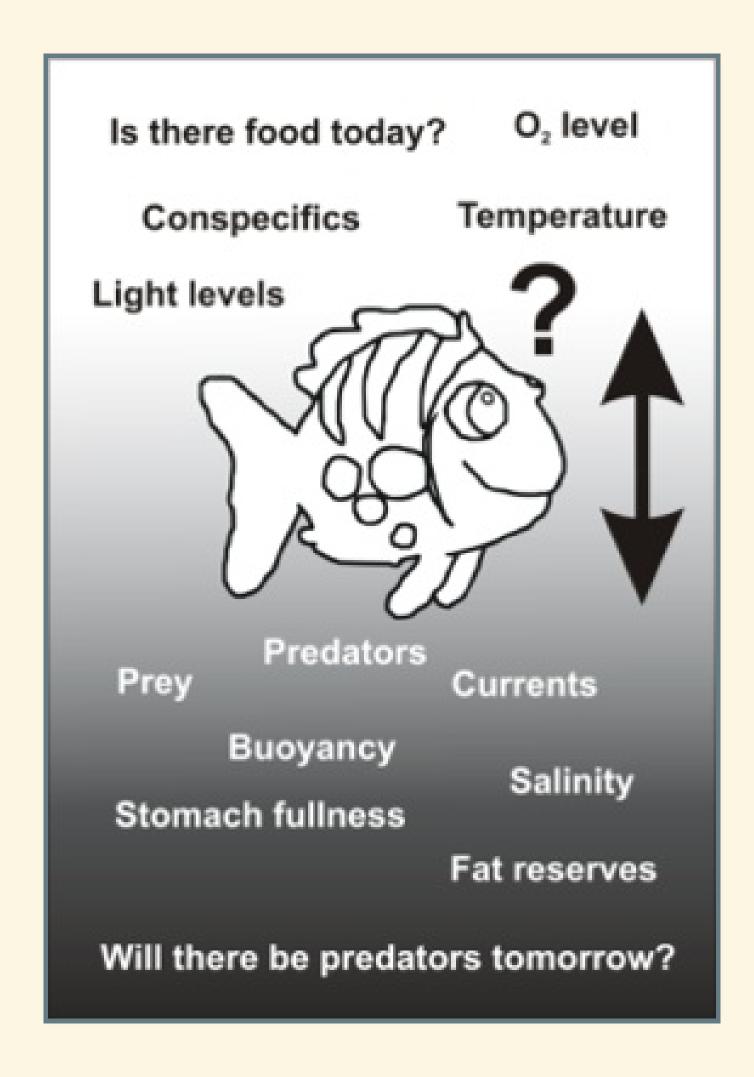
- Microeconomics looks at aggregate supply and demand;
  - does not model individual consumers and producers.
- Biology can use population dynamics without looking at individuals
- Chemists model chemical reactions with rate constants,
  - not individual atoms and molecules.

## Individual variability

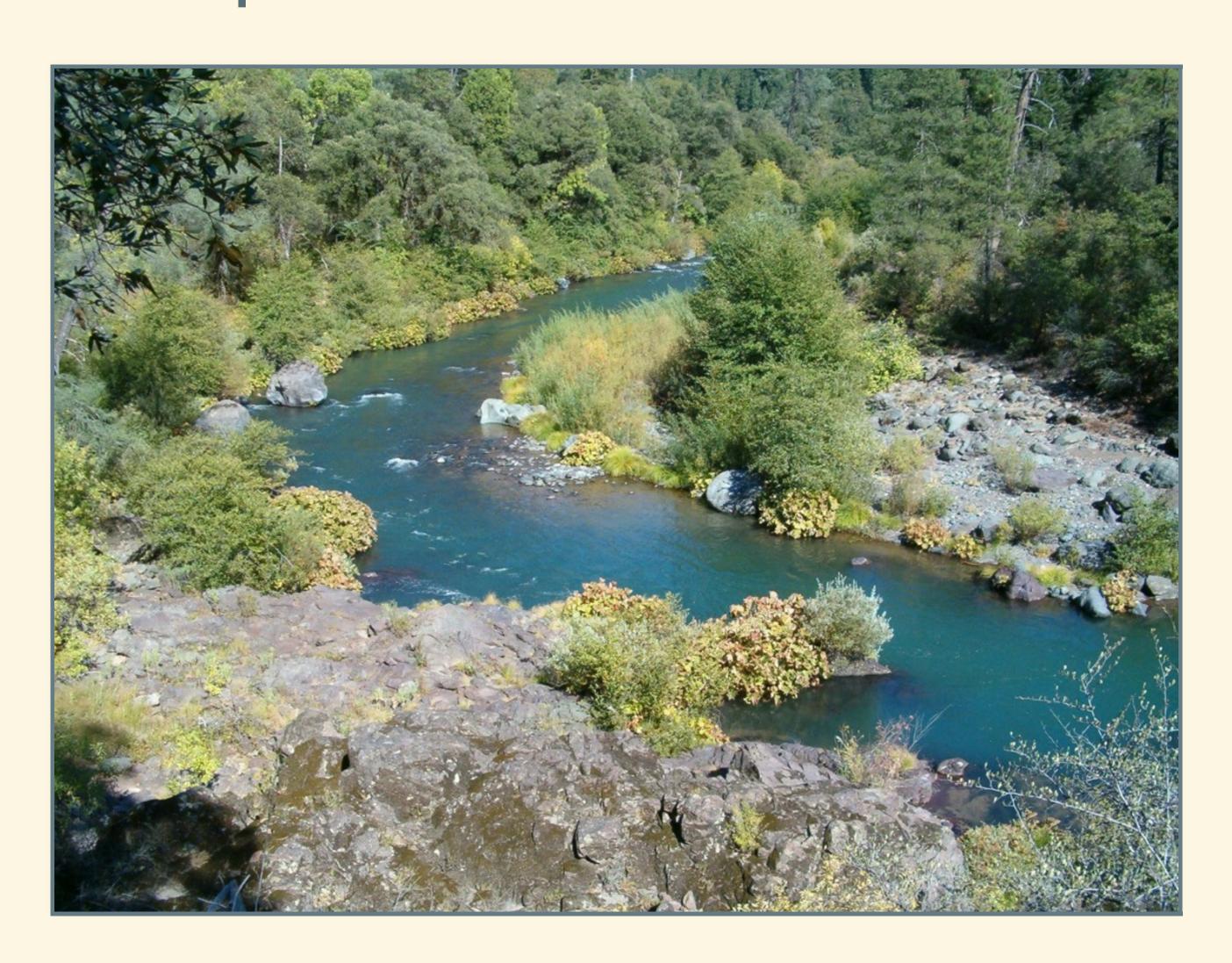




## Adaptive behavior



### Adaptive behavior: Characteristic patterns in trout habitat selection



### Adaptive behavior: Characteristic patterns in trout habitat selection

- Use of shallow habitat when small; deep habitat when big
- Shift in habitat when predators, larger competitors are introduced
- Hierarchical feeding: big guys get the best spots
- Movement to margins during floods
- Use of slower, quieter habitat in high turbidity
- Use of lower velocities at lower temperatures

Source: Railsback and Harvey, 2002.

## Example: flocks of starlings

- Thousands of individuals
  - unique and different
  - interact locally
  - show adaptive behavior

Behavioral Ecology doi:10.1093/beheco/arq149

# Self-organized aerial displays of thousands of starlings: a model

#### H. Hildenbrandt, a C. Carere, b,c and C.K. Hemelrijk a

<sup>a</sup>Theoretical biology; Behavioural Ecology and Self-organisation, Centre for Ecological and Evolutionary Studies, University of Groningen, PO Box 14, 9750 AA, Haren, The Netherlands, <sup>b</sup>CNR–INFM, Dipartimento di Fisica, Universita' di Roma La Sapienza, P.le A. Moro 2, 00185 Roma, Italy, and <sup>c</sup>Dipartimento di Ecologia e Sviluppo Economico Sostenibile Università degli Studi della Tuscia, Viterbo, Italy

Through combining theoretical models and empirical data, complexity science has increased our understanding of social behavior of animals, in particular of social insects, primates, and fish. What are missing are studies of collective behavior of huge swarms of birds. Recently detailed empirical data have been collected of the swarming maneuvers of large flocks of thousands of starlings (*Sturnus vulgaris*) at their communal sleeping site (roost). Their flocking maneuvers are of dazzling

### Flock of thousands of starlings

Your browser does not support the video tag. You can play the video at

https://ees4760.jonathangilligan.org/Slides/Class\_03/assets/video/MovieS6.mp4

## Simulated flock of thousands of starlings

Your browser does not support the video tag. You can play the video at

https://ees4760.jonathangilligan.org/Slides/Class\_03/assets/video/MovieS1.mp4

## Simulated flock of thousands of starlings

Your browser does not support the video tag. You can play the video at

https://ees4760.jonathangilligan.org/Slides/Class\_03/assets/video/MovieS2.mp4