Agent Spatial Embedding in 2D Landscapes

Nathaniel Osgood

Using Modeling to Prepare for Changing Healthcare Needs Duke-NUS April 16, 2014

Lecture Outline

- •AnyLogic's Spatial embedding types
 - -Overview
 - –Reminder of continuous space
 - –A glimpse of a discrete space & discrete time model
- Agent Mobility

Agent Spatial Embedding

Spatial embedding of agents is key to

 Expressing essential dynamics for problems
 Locality of influence/Transmission
 Insight into certain phenomena (spatial concentration, percolation, spatial reference modes)

 Spatial embedding can permit GIS integration

2D Spatial Embedding: Two Options •Continuous embedding (e.g. Wandering elephants, our built-up model)

- No physical exclusion: Agents are assumed to be small compared to landscape scale, and exhibit arbitrary spatial density without interfering
 We have seen this much with distributing agents initially around the space, adding agents in
- •Discrete cells (e.g. The Game of Life, Agent-based predator prey, Schelling Segregation)

-Divided into "Columns" and "Rows"

–Physical exclusion: Only one agent in a cell at a time

The Locus of Control: Environment

•The Anylogic Environment sets the parameters for the nature of the 2D landscape

- –Width
- –Breadth
- -Continuous vs. Discrete
- –Character of discrete neighbourhoods (cardinal directions vs. Euclidian { N,NE,E,SE,S,SW,W,NW}

Lecture Outline

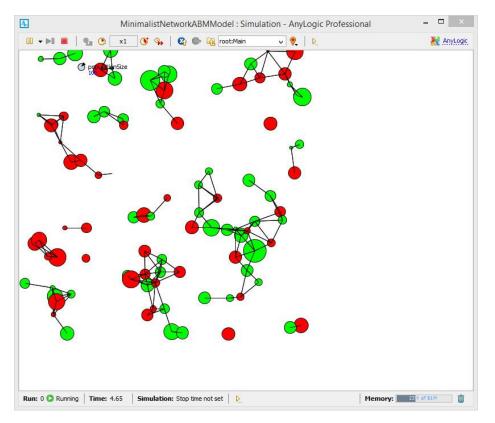
- AnyLogic's Spatial embedding types
 √Overview
 - –Reminder of continuous space
 - –A glimpse of a discrete space & discrete time model
- Agent Mobility

Continuous Environment

4			AnyLogic Professional			- 0 ×			
File Edit View Draw Model									
	t 🗈 🖀 🗙 📑 🖸 • 🏘 • 🔳 🔀	[:9] ≤ 100% ∨ ≤ []	🤻 🕶 冊 抱 马 🔹 🚫 Get	Support j j		🏂 🐼			
 Projects SX Search Gamma Search G	(NumberOfElept	ants i makeUpAltitudes i makeUpVegetation i placeElephants i altitude	Image: second system Image: second system	 altitudeToColor vegetationToColor altcolor viewVegetation 	View 80 40 20	Relette X Image: Constraint of the con			
	✓ Y I I I I I I I I I I I I I I I I I I								
	🕄 Main - Agent Type								
	 Movement parameters Environment for other agents Select the agents you want to place in 	the environment:							
	Z-Height: 0			Time units: days		v			

Continuous Environment: Your Model

•We've already seen the continuous embedding in our built up model.



Lecture Outline

AnyLogic's Spatial embedding types √Overview

 $\sqrt{\text{Reminder of continuous space}}$

–A glimpse of a discrete space & discrete time model

•Agent Mobility

By Comparison: Discrete Environment

		ł	AnyLogic Professional			- 0 ×				
File Edit View Draw Model Tools										
🚳 • 😂 🖬 🔞 🗳 🌣 🛛 👘	💼 🗙 📾 🔾 = 🏘 = 🔳 🛷 🗍	🖓 🔍 100% 🗸 🖓 🎈	→ 井 芯 ┖ * 🛛 🗞	iet Support		参 🚳				
🔓 Projects 🛛 🛷 Search 🖵 🗖 👩 N	Main 🖾				- 0	🙀 Palette 🖾 📃 🗖				
Wandering Elephants* Simulation: Main	🕐 NumberOfElephants	 makeUpAltitudes makeUpVegetation 	😯 elephants []	 altitudeToColor vegetationToColor 	View e0	Statechart BB X Statechart Entry Po ^ State @ State @ State @ State @ State @ State @ State @ State @ State @ State @ History State				
<		**************************************			>					
- offerer										
	Main - Agent Type									
	Movement parameters Environment for other agents									
	Select the agents you want to place in the en	vironment:								
			Not	e extra pres	ence of					
				lumns" and						
	Neighborhood type: Moore v	Apply on startup								
- I I				Time units: days						





Load AnyLogic Sample Model: The Game of Life

The "Game" of Life: Background

- Invented in 1970 by Mathematician Conway (modifying ideas from Von Neumann)
- •Inspiration: Lifecourse of cells
 - -Key dichotomy: A space contains a living element or not
 - -Stylized rules for birth, death
- •Cellular automaton: Uses Discrete Time (Steps) &
- Discrete Space (Cells) with evolving cell state
- •Deterministic rules
- •Illustrates the emergence of tremendous complexity
- from very simple rules
 - -Computationally universal

The Behavioral Rules of the Game of

- •Cells are viewed as surrounded by 4 neighbors (in cardinal directions)
- •Living cells require some neighboring empty space,
- but also some proximity to nearby living cells
- •Birth: An empty cell becomes occupied if it has an
- "ideal" nurturing environment around it (3 surrounding cells)
- •An existing cell dies if
 - -Too isolated: It has too few neighbors (1 or 0)
 - -Too crowded: It is surrounded by other cells (4 surrounding cells)
- •No mobility: Cells are born, live and die in same
- I . .

Scroll Left to See Population &

Fnviron AnyLogic Professional

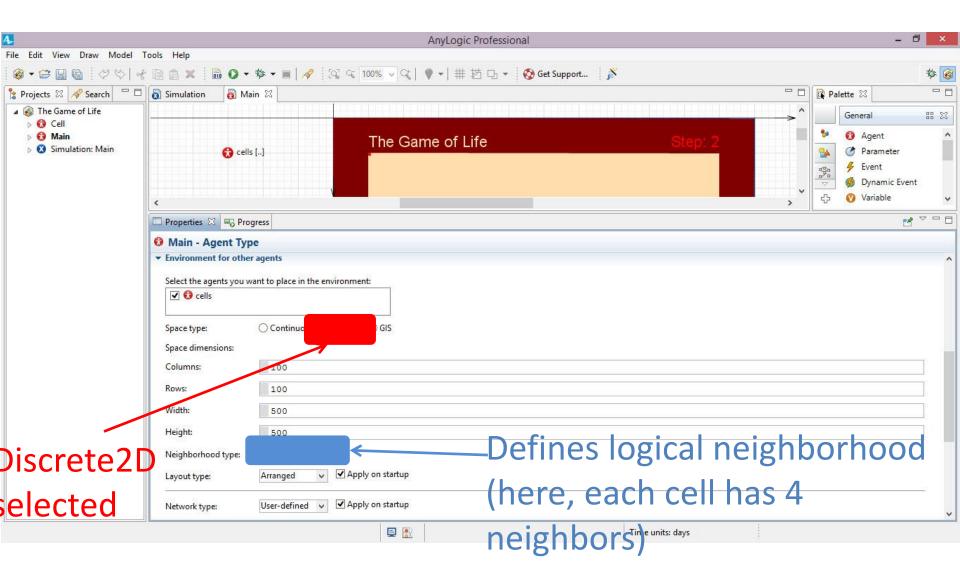
	A CONTRACTOR OF	

😵 Projects 🖾 🛷 Search 🖵 🗖] 🗑 Simulation 🛛 👸 Main 🖾			Palette 🖾	\$¢ 🐼 □ □
a is The Game of Life b is the Gam				General	:: 2
 Simulation: Main Simulation: Main 	Cells [] Cells [] Properties X To Progress	The Game of Life	Step: 2	 Agent Parameter Perent Event Dynamic Event Variable Collection Function Function Custom Distribution Custom Distribution Connector Connector Link to agents 	
	No elements are selected				

Imposing the Regular 2D Structure

L.			AnyLogic Professional			- Ō	×	
File Edit View Draw Model 1	Fools Help							
🚳 🕶 🔚 📓 🖉 🗇 😽	• 🗈 🗴 🛛 🛱 🖉 🗸	🏇 🕶 🔳 🛷 🗔 🖓 🖓 100% 🗸 🍳	, 🌒 🕶 井 芯 🕁 👻 Get Suj	pport 🎢			参 🞯	
🝃 Projects 🛛 🛷 Search 🖵 🗆	🐻 Simulation 🛛 👩 Ma			🙀 Palette 🖾				
 The Game of Life Cell G Main Simulation: Main 	cells	₅) The G	ame of Life	Step: 2	^ ~	General Second Agent Constant Agent Consta	*	
	Properties 🖾 🔫 Pro	gress				<u> </u>		
	• Main - Agent Type • Environment for other agents Select the agents you want to place in the environment: • Continuous • Discrete • GIS Space type: • Continuous • Discrete • GIS Space dimensions:							
	Columns: Rows: Width:	500		ed that cells				
	Height:	500	snould	be laid out i	n			
.00x100	Neighborhood type: Layout type:	Moore 🗸	a regula	ar grid in spa	ace			
rid define	E Wetwork type:	User-defined V Apply on startup					~	
nere		5	2	Time units: days				

Environment: Enabling Discrete Space (Cells)



Neigbourhood Models

•Moore: Cardinal directions –NORTH,SOUTH,EAST, WEST

•Euclidean

–NORTH, SOUTH, EAST, WEST, NORTHEAST, NORTHWEST, SOUTHEST, SOUTHEST, SOUTHWEST

🛾 Properties 🔀 🗖 Pro	ogress		2 - 6
Main - Agent Ty	ре	Set Neighbourhood Type	
 Environment for other agents 			~
Select the agents you v	want to place in the environment:	Of Environment here	
🗹 🔞 cells		of Environment here	
Space type: Space dimensions:	○ Continuous Discrete GIS		
Columns:	100		
Rows:	100		
Width:	500		
Height:	500		
Neighborhood type:			
Layout type:	Arranged 🗸 🗹 Apply on startup		
Network type:	User-defined 🗸 🗹 Apply on startup		

Population: One Cell Agent per Grid

Point

4

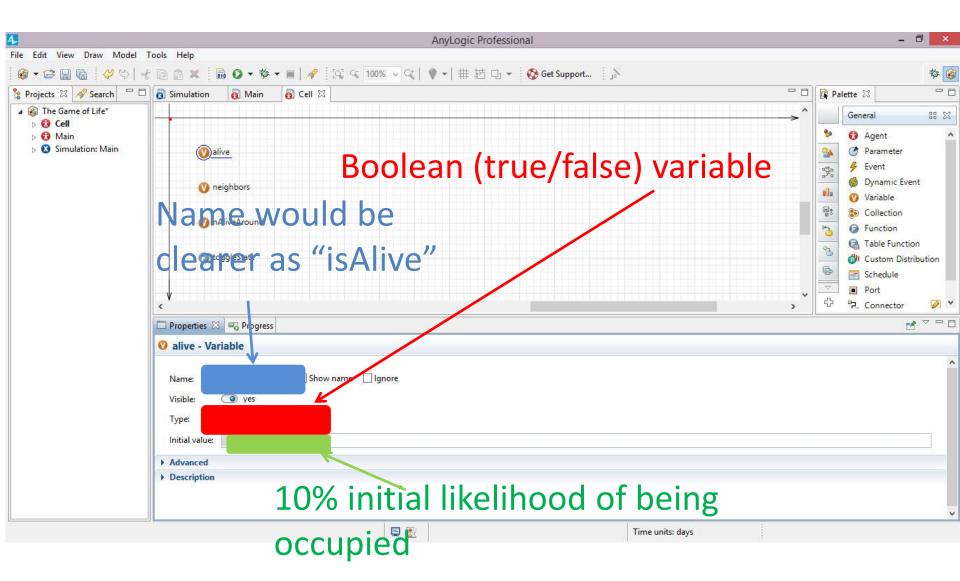
- 🗇 🗙

🍃 Projects 🛛 🔗 Search 🖵 🗖	🐻 Simulation 🛛 👸 Main 🖂		- 8)	Palette 🖾 📃 🗖
 Projects & Search The Game of Life Cell Main Simulation: Main 	Isimulation Image: Addition of the second	The Game of Life	Step: 2	General B & S General B & S Agent Agent Parameter Event Dynamic Event O Variable Collection Function Table Function Custom Distribution
	< Properties Progress			Schedule Port Connector 오 Link to agents 전 모 드
	Cells - Cell Name: Cells Visible: Single agent Population of agents Initial number of agents	Show name Ignore		
The Game of Life	These settings are applied only if the User-	-defined" layout type is set in the $(=100*100)$		

View the "Cell" Class

4		AnyLogic Professional		- 🗇 🗙				
File Edit View Draw Model	Tools Help							
🚳 🕶 🔚 🔞 🖉 🌣 🖣 🦷	४ 🗎 🗈 🗙 🛛 🖬 💽 न 🏇 न 🔳 🛹 🕅 🐼 🤤	100% 🗸 🛛 🗣 🕶 井 范 🕞 🔹 🚫 Get Support 🍌		参 🞯				
🐕 Projects 🖾 🔗 Search 🛛 🗖	I 👸 Simulation 👸 Main 👸 Cell 🛛		🗖 🗖 🕅 🕅 Palette 🕱					
 The Game of Life Cell Main Simulation: Main 	oneighbors in t	s class represents he entire space – alive or not	whether	ameter nt namic Event iable lection nction ole Function stom Distribution				
	🖻 Properties 🖄 🖦 Progress							
	Cell - Agent Type Name: Cell Ignore Agent actions Entity actions Use in flowcharts as: Entity On exit flowchart block: On exit flowchart block: On seize resource:							
The Game of Life			Time units: days					

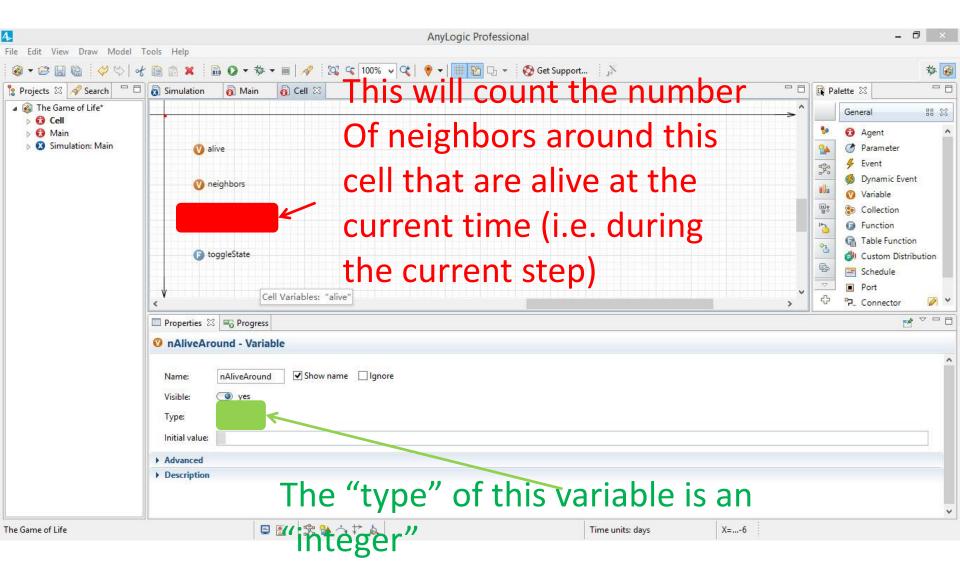
Cell Variables: "alive"



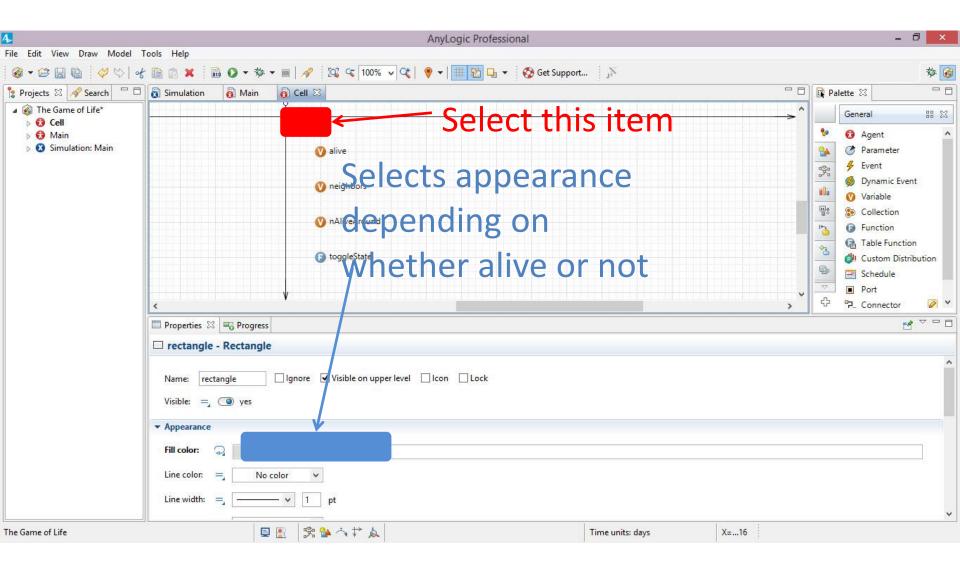
Cell Variables: "neighbors"

4		AnyLogic Professional	- 🗇 🗙						
File Edit View Draw Model T	ools Help								
🛛 🖉 🕶 🔛 🔞 🔤 💝 😒 🔤	🗎 🗋 🗙 🛛 🛱 🖉 🕶 🏇 🕯	🕶 📄 🛹 🛛 🖾 🔍 100% 🐱 🔍 💗 🕶 🛛 🏥 🔯 🕞 👻 🤣 Get Support	参 🎯						
😫 Projects 🛛 🔗 Search 🖵 🗖	👸 Simulation 👩 Main	🖥 Cell 🛛 🖓	Palette 🛛 🗖 🗖						
 ✓ Water Game of Life* ▶ G Cell ▶ G Main ▶ Simulation: Main 	 ♥ alive ♥ nAliveAround () toggleState 	This will reference a Collection ("Array") that Contains references to each neighbor of the	General Image: Construction Image: Construction Image: Construction Image: Construction Image: Construction Image: Construction Image: Construction Image: Construction Image: Construction						
			Schedule						
	<	current cell	· · · · · · · · · · · · · · · · · · ·						
	Properties X Progress								
	 neighbors - Variable Name: neighbors Visible: ves Type: Initial value: Advanced Description 	Show name Ignore							
The Game of Life	9								
		"Array" type							

Cell Variables: "nAliveAround"



Visual Representation of Cell (Click on Cell Icon at Origin)



Cell Update Logic ("Agent" Properties of "Cell")

4					AnyLogic Pro	fessional						- 0	×
File Edit View Draw Model T	ools Help												
🔞 • 😂 🖬 🔞 🔗 💖 🚽	🗈 🖻 🗶 🗎 🛅	0 • 🕸 • 🔳	1 🛷 🖾 🤜	100% 🗸 🔍	💗 🕶 🏢 🔯	🕞 🔹 🛛 🐼 Get Sup	port						蓉 🞯
😫 Projects 🛛 🔗 Search 🖵 🗖	🐻 Simulation 🛛 👸 Main 🔹 Cell 🕴									Dalette 🖾		- 0	
 ▲ State Game of Life* ▶ Go Cell ▶ Go Main ▶ Simulation: Main 		🕐 ali	ve							<u> </u>	* *	General G Agent Parameter F Event Dynamic Event	*
	<	V								, v	∇	Variable Collection	*
	Properties 🛛	C Progress										- -	
	On arrival to target location:							^					
	On before step:												
	<pre>//count the number of alive neighbors nAliveAround = 0; for(Agent a : neighbors) if(((Cell)a).alive) nAliveAround++;</pre>												
	On step:							ĩ					
	//alive //dead c alive =	ell becomes a	live if it h alive if the <= nAliveAn	ere are exa	alive neighbo actly 3 neighb AliveAround <=	ors							1
	▼ Entity actions												
		12 0					There are a second seco		1				~
The Game of Life		E 💽	旁 🐕 🐴	↓> 🔈			Time unit	ts: days	X=42				

Two Key Models of Time in Anylogic:

- •This is what we have dealt with to this point
- •Here, every agent is updated at a different time, according to events
- •No two agents are typically likely to be updated at exactly the same time during most of model execution, so when considering the state of other agents they "see" the last situation where the other agent has been updated

Two Key Models of Time in Anylogic: Discrete (Synchronous) Time

- •Here, agents all change in lockstep, separated by fixed "time steps"
- •When computing agent behavior (to determine agent state in the next timestep), our enquiries about agent state (e.g. using *getAgentAtCell* or *getAgentNextToMe*) need to ask about the situation *in the current timestep*
 - –We gather needed information regarding current state in "On Before Step", and changes are performed in "On Step".
- •This is similar to what we saw in System Dynamics the changes over the next small interval of time (Δt)

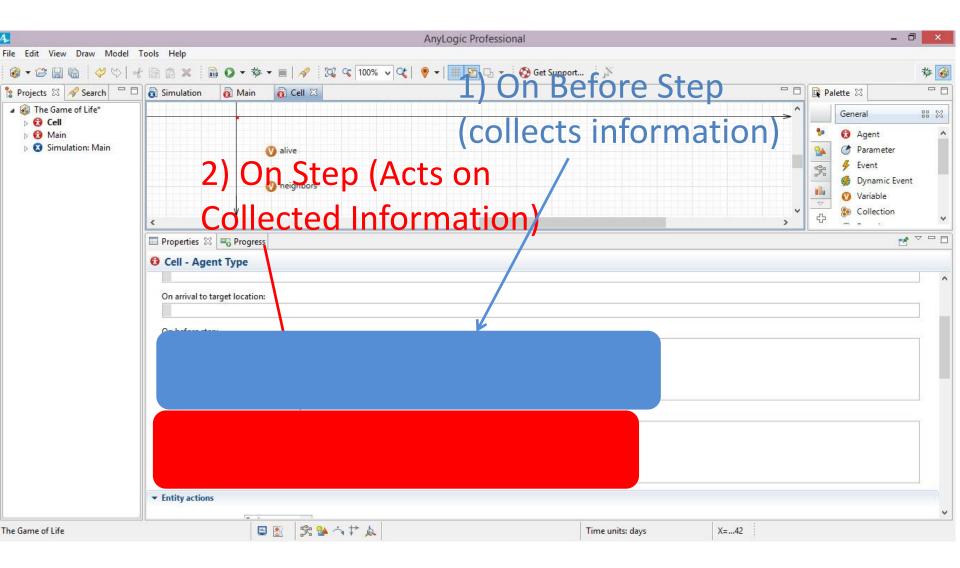
Enabling Discrete (Synchronous) Time

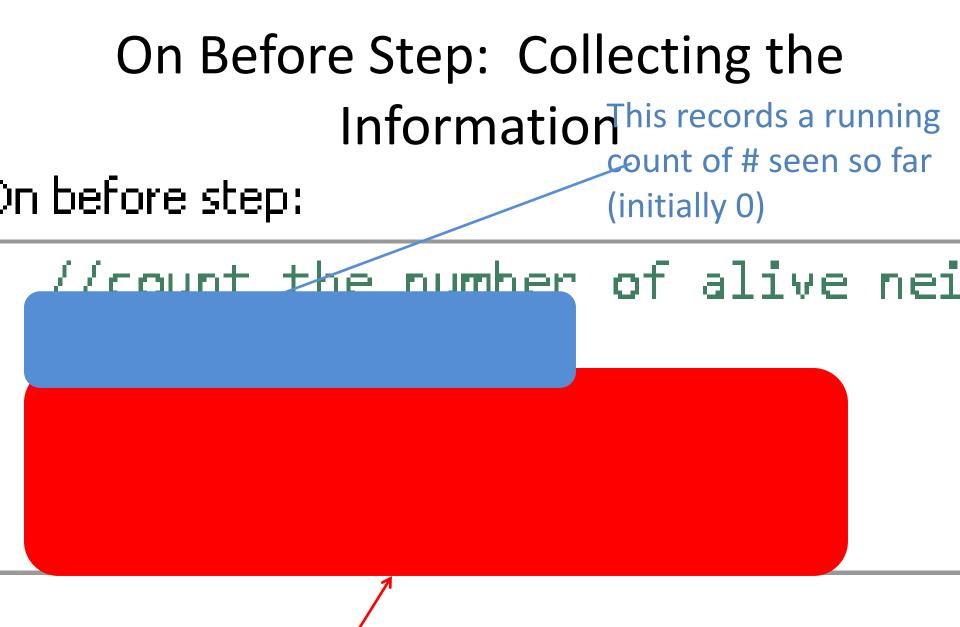
- •When enable the steps, the various handlers for synchronized time (e.g. "On before step", "On
- step", "On after step") etc.) are executed
 - –Both environment and agents have "On before step" and "On after step" handlers
 - -"On before step" for environments is executed before the corresponding method for agents
 - -"On after step" for environments is executed after the corresponding method for agents
- •Synchronous time can be enabled via the class's "General" page
 - -Click checkbox "Enable steps"

Environment: Enabling Discrete Time

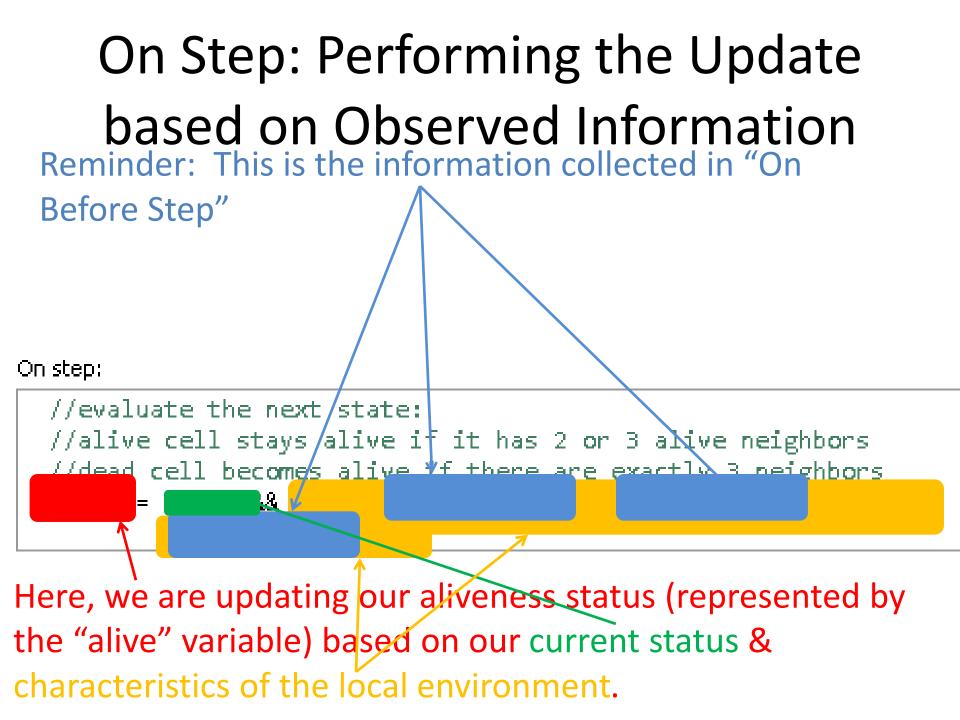
		AnyLogic Professional	- ć							
ile Edit View Draw Model To	ols Help									
🚳 🕶 🔚 📓 🗳 🍄 😽	🗈 🛍 🗶 📄 🖸 🕶	🌣 🕶 📄 🛹 🏽 🕄 🔍 100% 🗸 🔍 🖤 🕶 🗰 描 🕁 👻 🚱 Get Support 👘 🔊		蓉 🞯						
🍃 Projects 🛛 🛷 Search 🛛 🗖	🗟 Simulation 🛛 👸 Maii	n 🚯 Cell 🛛 🖓	🙀 Palette 🖾	- 0						
 The Game of Life* Cell Main Simulation: Main 	♥ alive ♥ neighbors									
	<	· · · · · · · · · · · · · · · · · · ·	· · · ·	~						
	🗖 Properties 🖾 🖷 Progress									
	🔁 Main - Agent Type									
	Columns:	nns: 100								
	Rows:	100								
	Width:	500								
	Height:	500								
	Neighborhood type: Layout type:	Moore v Arranged v Apply on startup								
	Network type: Step duration (in model 1 1.0 On before step:	User-defined ✓ Apply on startup ime units: Otice checkmark to enable								
	d	iscrete time (steps)								

Cell Update Logic ("Agent" Properties of "Cell")





2) Loops through each of the neighbors. Every time we see a live neighbor, increment the count of alive neighbors



Obtaining the List of Neighboring Cells at Startup

4		AnyLogic Professional		- 8 ×				
File Edit View Draw Model T	ools Help							
🛛 📽 🕶 🔛 🔞 🛛 🔗 🖓	🗈 💼 🗶 📑 🔕 🗸 🎋 🕶 🖬 🚀 🗔 🔩 🕲 100%	6 🗸 🤇 🗣 🕶 井 枯 马 🔹 🚫 Ge	t Support 🕴 🔊	参 🎯				
	Simulation Main FOR properties Properties Properties Progress Cell - Agent Type Name: Cell Ignore Agent actions On charters	erformance ns a referer	e reasons, this nce to a set of s, and stores it in	Image: Palette X General Gen				
	On before step:							
	<pre>//count the number of alive neighbor nAliveAround = 0; for(Agent a : neighbors)</pre>	s		v				
			Time units: days					

Running the Model

