

# ***A Brief Introduction to Policy Modelling***

## *Using agent-based simulation*

### Session 1

*About agent-based simulation*



**Introduction:**  
*some history and motivation, a  
first model to play with*

# Welcome

- This brief introduction is part of the EAEPE Conference, Manchester Metropolitan University, Nov. 2016.

It is organised and run by

- **Bruce Edmonds** and **Ruth Meyer** from the *Centre for Policy Modelling* at the **Manchester Metropolitan University**
- If you have not installed NetLogo (version 5.2.something), please do so now from: <http://ccl.northwestern.edu/netlogo>

# Aims of the Sessions

To introduce you to:

- Agent-based simulation
- Its application to policy modelling

It **will not** get you to a point where you can start to program your own simulations, this takes quite a bit longer (just like any other technique).

However it **will** give you an idea of what this approach can do, some of its difficulties, and help you understand some of its key ideas

# Outline of the Sessions

## Session 1: *Agent-based simulation* (ABS)

- Background and introduction
- About ABS, including how a model is made
- Some examples to play with

## Session 2: *Its application to policy issues*

- About policy modelling
- Some more applied examples to play with
- What to do next if you want to go further
- Concluding discussion and Q&A

# The importance of formal models

Formal models are important because:

- they allow the sharing of representations (without being changed by re-interpretation), and so allow a community of researchers to critique, check, compare and improve such models collectively
- they can be indefinitely elaborated to ‘fit’ almost anything if complicated enough
- they are complementary to natural language accounts – allowing the properties and outcomes of processes and systems that are too complicated for the mind to track, to be reliably traced and inspected

# Mathematical formal models

- Arithmetic, trigonometry, difference equations, differential equations, statistics etc.
- Used to be the only kind of formal model practically available and thus were essential to any science of the measurable
- After WWII these models were applied to understanding social phenomena
- If one wanted to analytically solve them, one is limited to quite simple systems
- Which limited their use to: analogies of behaviour or aggregate summaries of systems

# Economics

- By focusing on money (rather than value), preferences (rather than item properties), optimizing utility functions (rather than choice processes) etc. it was found that some interesting models of social phenomena involving exchange were solvable
- This became known as neo-classical economics
- It might have been that such models would approximate the behaviour of observed economic phenomena, in aggregate
- However, it became more interested in the mathematical properties of its models than whether it successfully captured observed phenomena



# Simulation

- Numerical solutions to mathematical models have been around a long time
- Computers made this a feasible approach
- Alternative models of computation (such as cellular automata) appeared since WWII
- Simulation developed into an essential tool of science and engineering, allowing systems that were too complex for solvable mathematics to be modelled

# Agent-Based Simulation

- In 1967 the computer language Simula 67 was specified and developed for organisational modelling
- This used separate computational entities for each thing modelled, and messages between the entities for interaction (this became object-oriented computing)
- One use is to model social systems, (such as the Schelling model in a following slide)
- (the computational entities are called ‘agents’ when the entities can be usefully interpreted as having cognition)
- It was no longer *necessary* to put up with simplistic or wrong assumptions just to get a useable formal model
- Solvable mathematical models and computational models each have different pros and cons...
- ...but now can *choose* the most appropriate kind of formal model for the phenomena one is dealing with

# Schedule, Course Material, etc....

The course materials, examples etc. are all at

<http://cfpm.org/eaepe>

More materials for a fuller, 2-day course are freely available at:

<http://cfpm.org/simulationcourse>

This latter site has pointers to:

- The example models and the slides that explain them, divided into 8 sessions
- Further material on the web
- Pointers to books, links, tutorials etc.

# About NetLogo

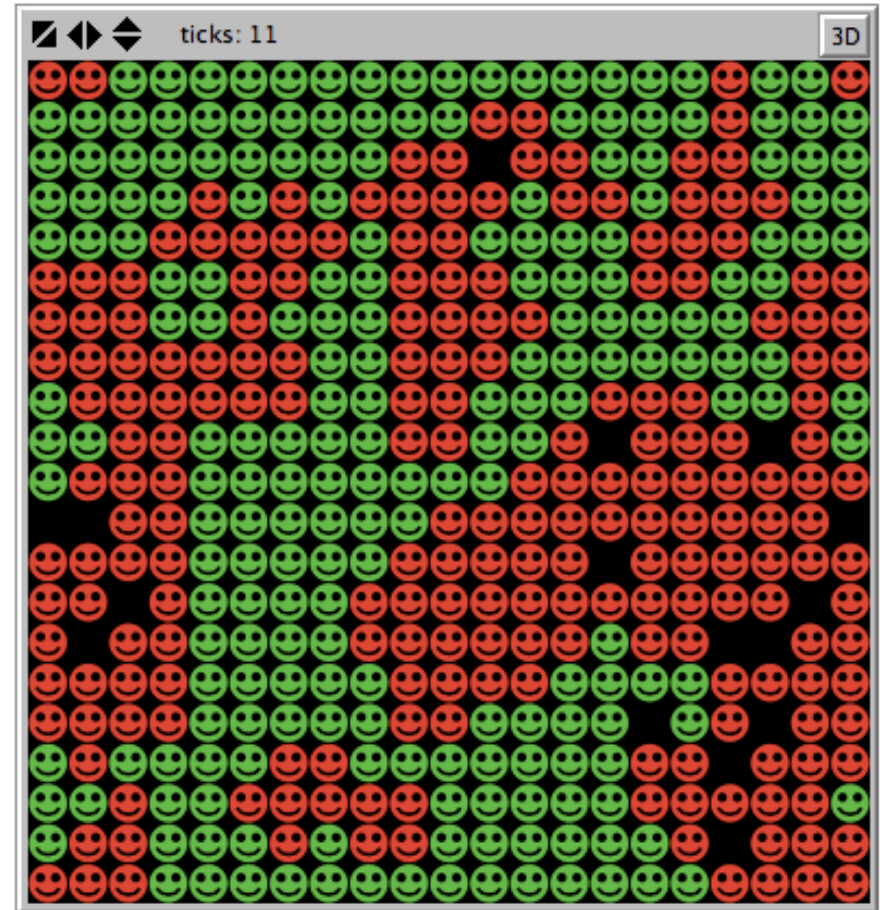
- “Logo” was a language invented by Semour Papert (a student of Piaget)
- Designed to be easy to write and read – ‘english like’ – a large built-in vocabulary and designed so one can progressively build up a personal set of user-defined words
- Designed as a language to explore ideas with in a playful manner
- NetLogo is a development of this, but with agents, patches etc. to facilitate the accessible construction, sharing and exploration of simulations
- But it is a full programming language and you could program any simulation in it if you wanted to
- Has become somewhat of a standard in the social sciences, with many available models (e.g. at <http://OpenABM.org> or bundled in the package)

# A Classic Example of an Agent-Based Model: *Schelling's Segregation Model*

Schelling, Thomas C. 1971.  
Dynamic Models of Segregation. *Journal of Mathematical Sociology* 1:143-186.

**Rule:** each iteration, each dot looks at its 8 neighbours and if, say, less than 30% are the same colour as itself, it moves to a random empty square

*This was a kind of **thought experiment** to look at the possible outcomes that result from the above rule*



# Starting the first NetLogo Model

- Goto <http://cfpm.org/eaepe> and download the file “schelling.nlogo” file
- If NetLogo is installed properly this should load and run when launched, if not you may have to start NetLogo and use “File” then “Open” etc. to load the model.

# NetLogo – Interface Panel

Command Buttons

Parameter Slider

Graph of outcomes

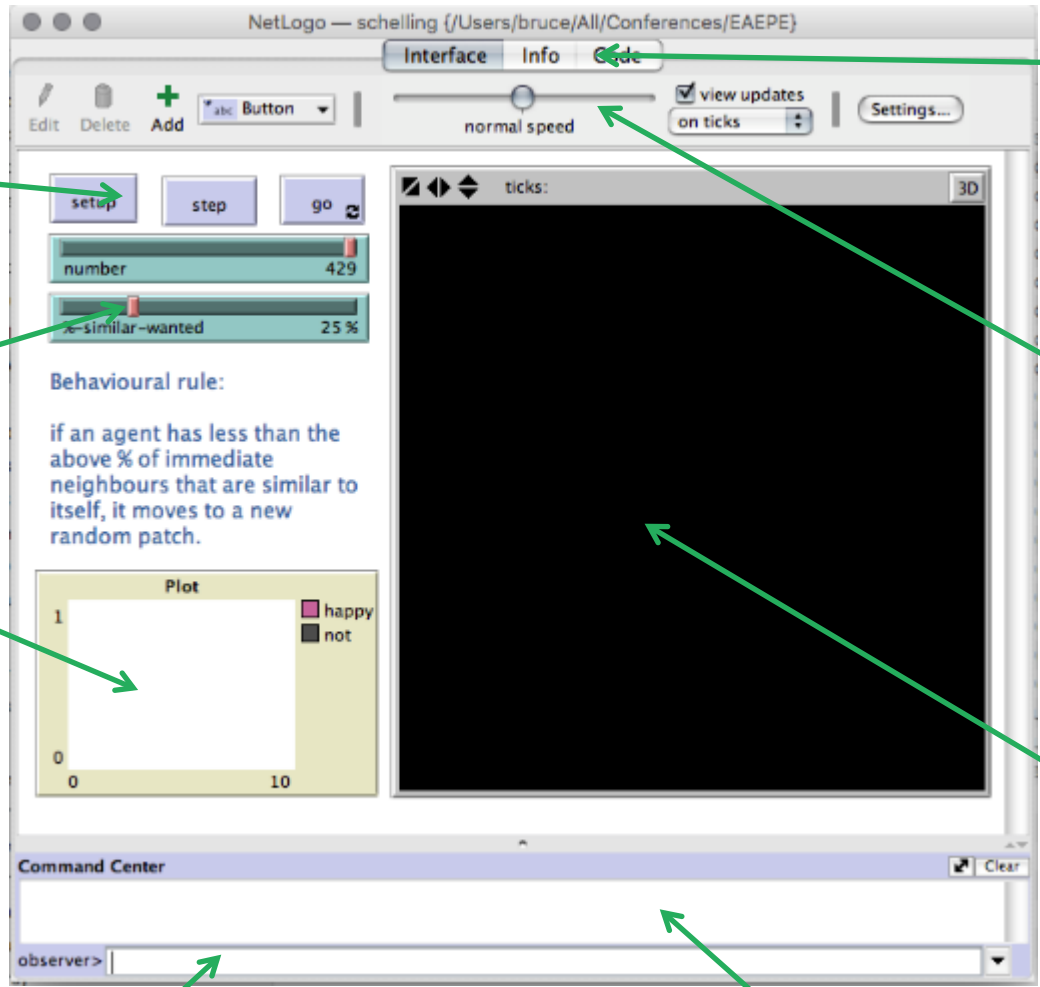
Typed Direct Commands

Text Output

Panel Selection (looks slightly different on Windows and Macs)

Speed Control

Visualisation of world



# Play with the model!

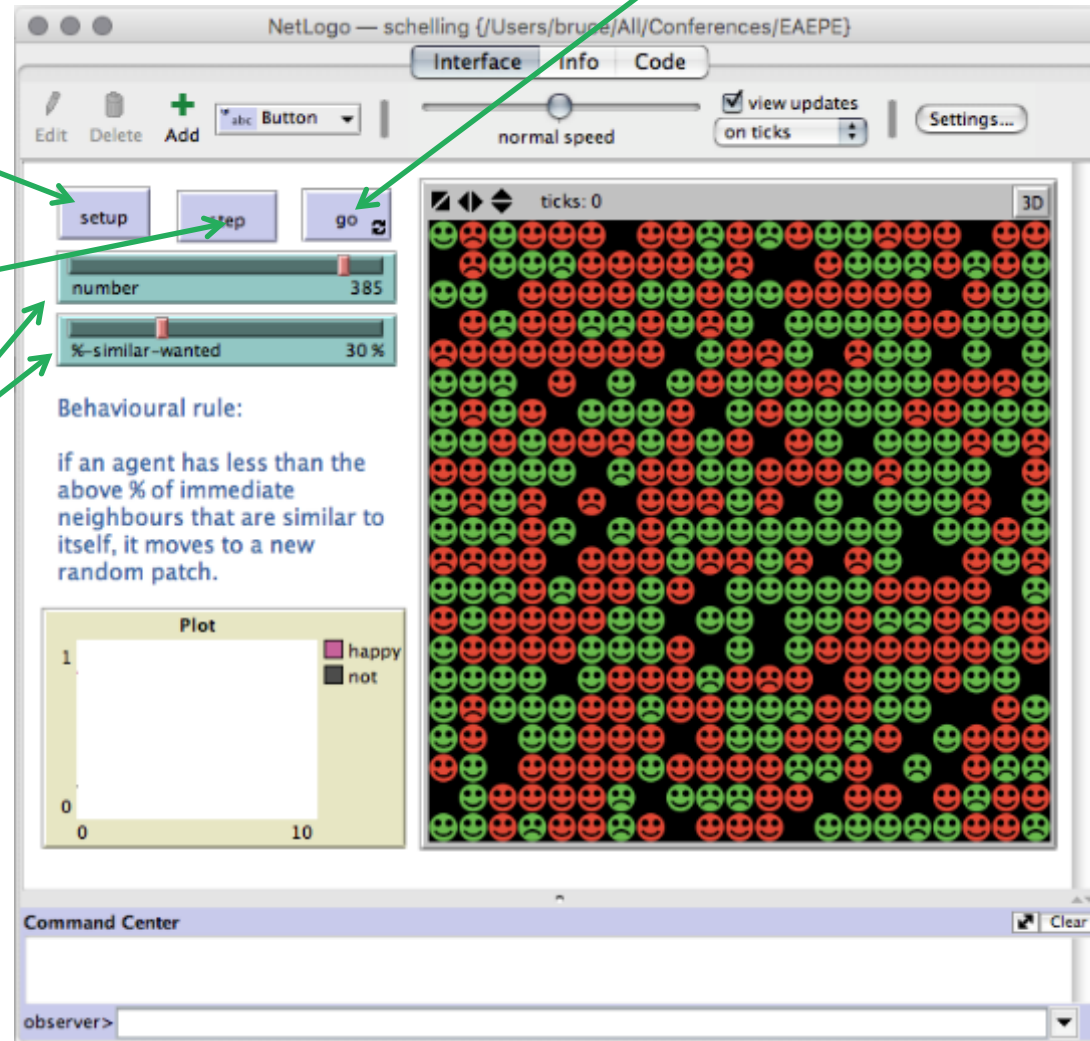
2. Press “setup” to initialise model

3. Press “step” to make model do one set of instructions, press again...

1. Set the parameters

Play with the model, try different parameters, see what the results are, what do you conclude?

4. The “go” button means “repeatedly do go”

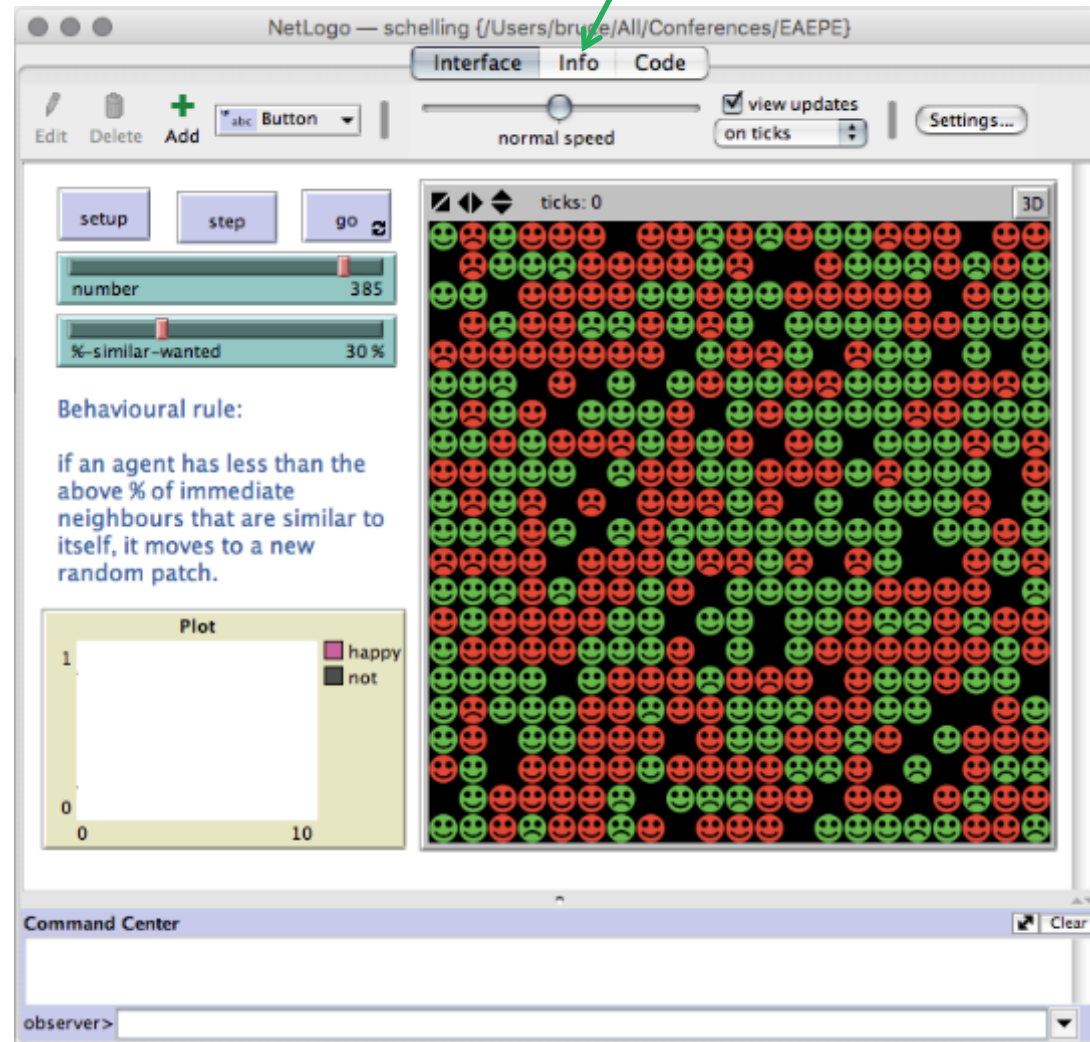




# Play with the model!

- Try swapping between “Interface”, “Info” and “Code” panels
- Read the explanation
- Look at the code

These change the view of the model



# The Information Tab

Click on the “**Info**” tab to see a description of the model (or whatever the programmer has written, if anything!)

Read it, scrolling down

Here are some suggestions of bits of code to add and things to

1-commands-begin - NetLogo {C:\Users\99900588\ownCloud\2-day intro ABM}

File Edit Tools Zoom Tabs Help

Interface Info Code

Find... Edit

### WHAT IS IT?

This is an example model, used as part of the “2-day Introduction to Agent-Based Modelling”.

This model is to illustrate the basic principles of “asking” all agents to do a command, and “if” commands.

### HOW IT WORKS

A random number of patches are coloured white - these are the obstacles. One patch is red, the target patch. When stepped, turtles (each step) do the following: if the patch in front is not white, then move forward; if the patch ahead is white turn to the right; if the patch underneath is red, finish.

### HOW TO USE IT

Press...

“setup” to initialise the world  
“step” to make the turtle do one set of instructions - one step as described above.

### THINGS TO NOTICE

- How does the number of white patches effect what happens to the green agent?
- How often does it get stuck and in what circumstances?

# The Code Tab

Code is complex and it will take some time to learn to “read” it (but NetLogo code is a **LOT** easier than most)

**Grey**=comments (you can ignore these)

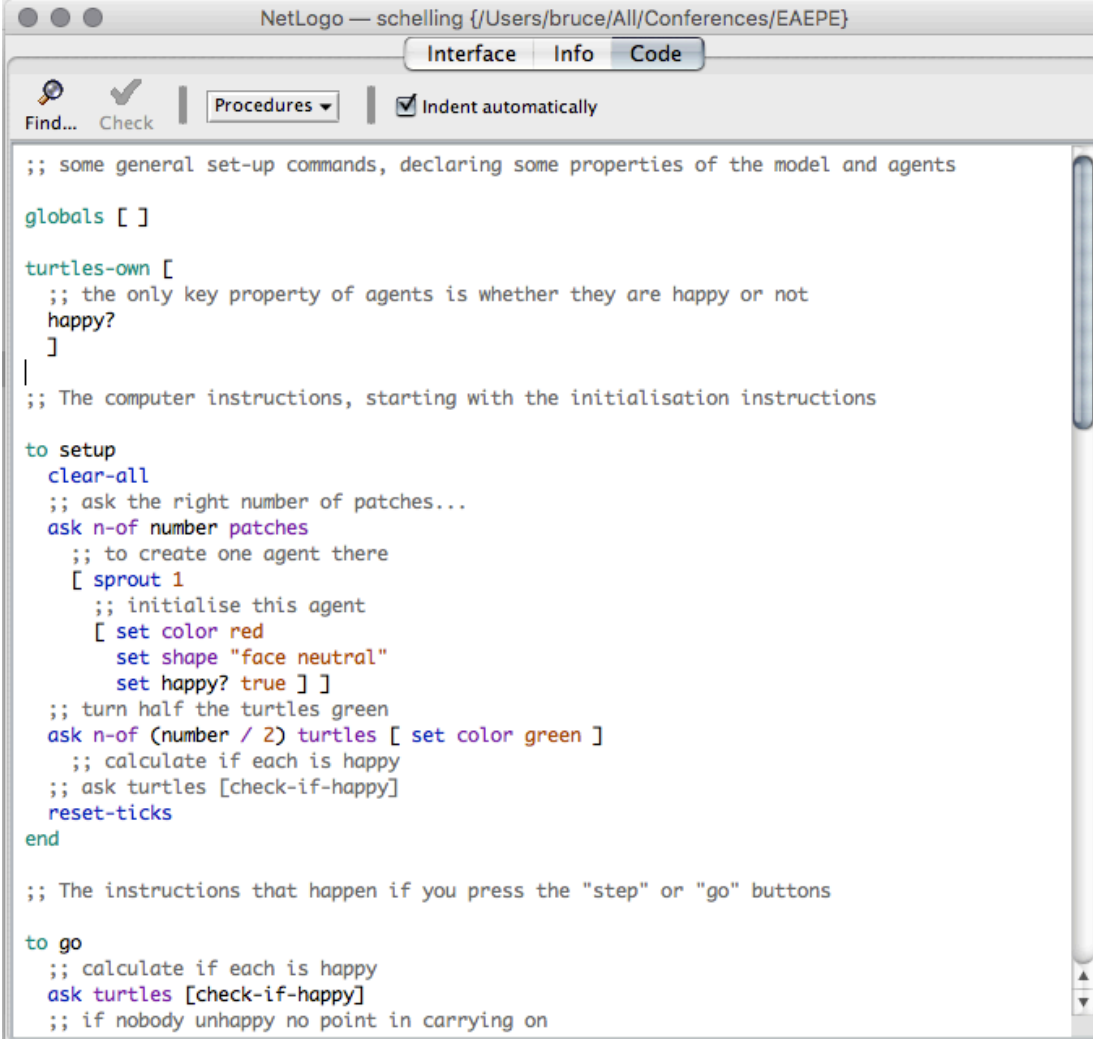
**Green** = special structural words

**Blue** = commands

**Purple** = NetLogo defined

**Red** = constants

**Black** = programmer defined words



```
NetLogo — schelling [/Users/bruce/All/Conferences/EAEPE]
Interface Info Code
Find... Check Procedures Indent automatically

;; some general set-up commands, declaring some properties of the model and agents

globals [ ]

turtles-own [
  ;; the only key property of agents is whether they are happy or not
  happy?
]

;; The computer instructions, starting with the initialisation instructions

to setup
  clear-all
  ;; ask the right number of patches...
  ask n-of number patches
    ;; to create one agent there
    [ sprout 1
      ;; initialise this agent
      [ set color red
        set shape "face neutral"
        set happy? true ] ]
  ;; turn half the turtles green
  ask n-of (number / 2) turtles [ set color green ]
  ;; calculate if each is happy
  ;; ask turtles [check-if-happy]
  reset-ticks
end

;; The instructions that happen if you press the "step" or "go" buttons

to go
  ;; calculate if each is happy
  ask turtles [check-if-happy]
  ;; if nobody unhappy no point in carrying on
```

# NetLogo Documentation

- The NetLogo documentation is good – accessible, well written, gives examples and is extensive
- Access it either by using the menus:
  - ‘Help >> NetLogo User Manual’
- Particularly useful is the Dictionary got to:
  - Either from the Manual main page
  - Or ‘Help >> NetLogo Dictionary’
- Most experienced NetLogo programmers work with this open all the time, referring back and forth to it as they program

# Questions about model outcomes

What do you notice about the segregation model – can you answer any of these?

- What happens if there are no **spaces free**?
- What happens if there are only a very few **spaces free**?
- What happens if there are a lot of **spaces free**?
- What happens with very low “**%-similar-wanted**”?
- What happens with very high “**%-similar-wanted**”?
- What happens if you gradually increase “**%-similar-wanted**” (0% then “go”, 5% then “go”, 10% then “go” etc.)?

# Discussion

- Outcomes, even from very simple rules, are difficult to anticipate...
- ...until one has spent time playing with the model, then it may seem obvious
- Small changes in the rules or parameters can cause big changes in outcome – qualitatively as well as quantitatively
- But one can test these quite easily!
- The behavioural rules can be anything, and do not have to be restricted to any particular theory
- However the space of possible models and settings is HUGE and can not all be explored

# Using NetLogo commands, changing code, adding to the interface

# A very simple model to get an idea of how such simulations work

- Goto <http://cfpm.org/eaepe>, download the file “[commands.nlogo](#)” model and run it
- This is a very simple model to illustrate how commands are run in simulations – how NetLogo works



# Typing in Commands

Press "setup" to initialise world

World with different colour patches

An agent!

Type commands in here as follows...

The screenshot shows the NetLogo interface for a simulation. The title bar reads "1-commands-start - NetLogo {C:\Users\999005\OneDrive\2-day intro ABM}". The menu bar includes "File", "Edit", "Tools", "Zoom", "Tabs", and "Help". Below the menu bar are tabs for "Interface", "Info", and "Code". The interface contains several controls: "Edit", "Delete", and "Add" buttons; a "Button" dropdown menu; a "normal speed" slider; a "view updates" checkbox; and a "continuous" dropdown menu. A "Settings..." button is also present. The main display area shows a 3D view of a world with a black and white checkerboard pattern. A red agent is visible in the bottom right corner. The top right of the display area shows "ticks: 0" and a "3D" button. Below the display area is a "Command Center" with a "Clear" button and a text input field containing "observer>".



# The command centre...

- “show” means show the result in the command centre

Try:

- `show timer` (and then try this again)
- `show count agents`
- `show agents`
- `show sort agents`
- `show count patches`
- `show count patches with [pcolor = white]`

Anything typed into the command centre is from the “observer” point of view (yours!)

# Inspecting Patches and Agents

Right-click (or ctrl click) on a patch, then “inspect” that patch

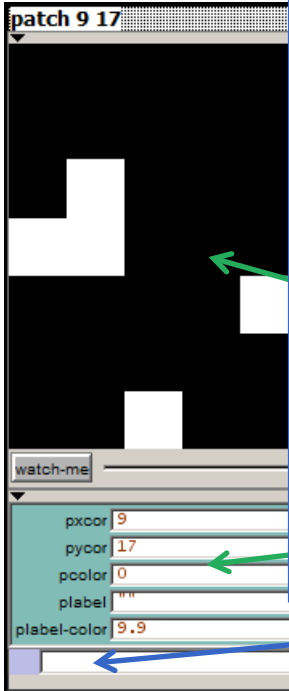
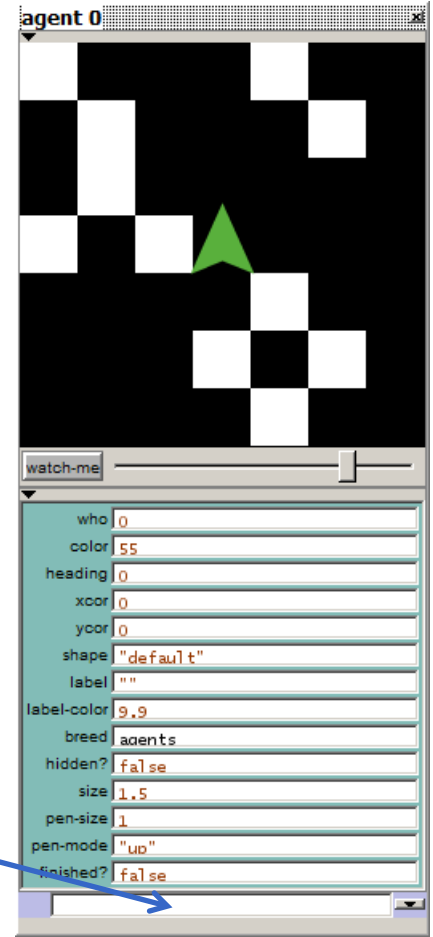
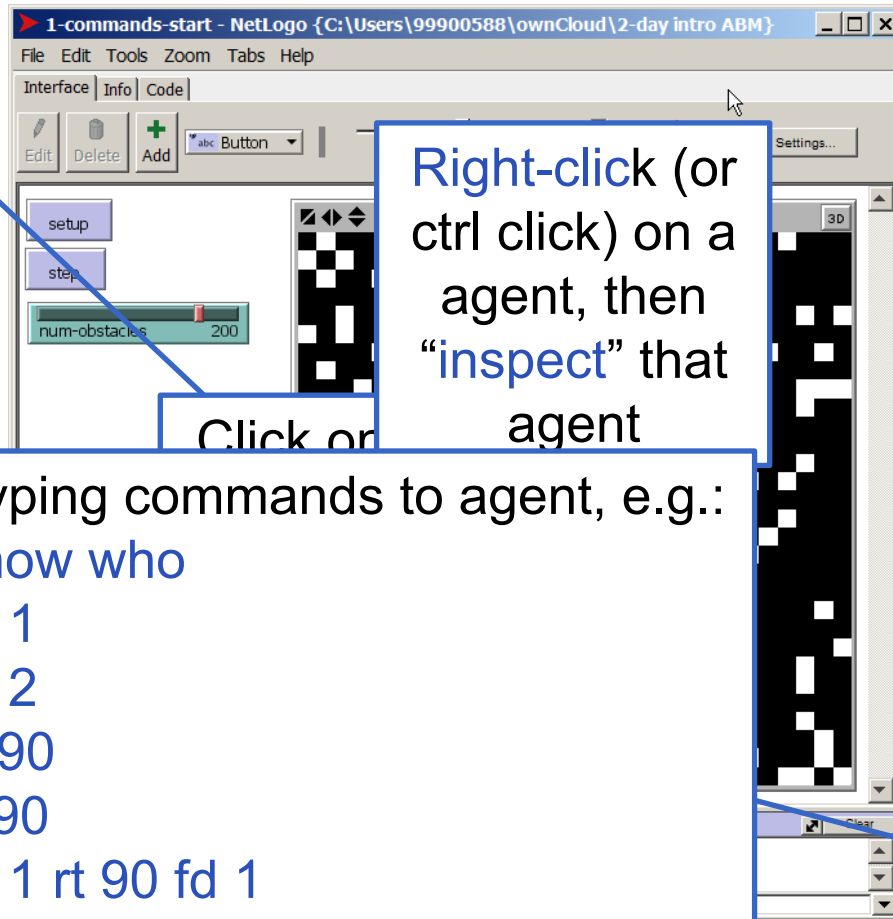
Right-click (or ctrl click) on a agent, then “inspect” that agent

Click on

Try typing commands to agent, e.g.:

- show who
- fd 1
- fd 2
- rt 90
- lt 90
- fd 1 rt 90 fd 1
- set color purple
- set size 4

Type commands to patch here, e.g. set pcolor red



# Some important ideas

- The whole world, the turtles, the patches (and later the links) are “agents”
- That is, they:
  - have their own properties
  - can be given commands
  - can detect things about the world around them, other agents etc.
- But these are all ultimately controlled from the world (from the view of the observer)
- It is the world that is given the list of instructions as to the simulation, which then sends commands to patches, agents (and links) using the “ask” command

# Using “ask”

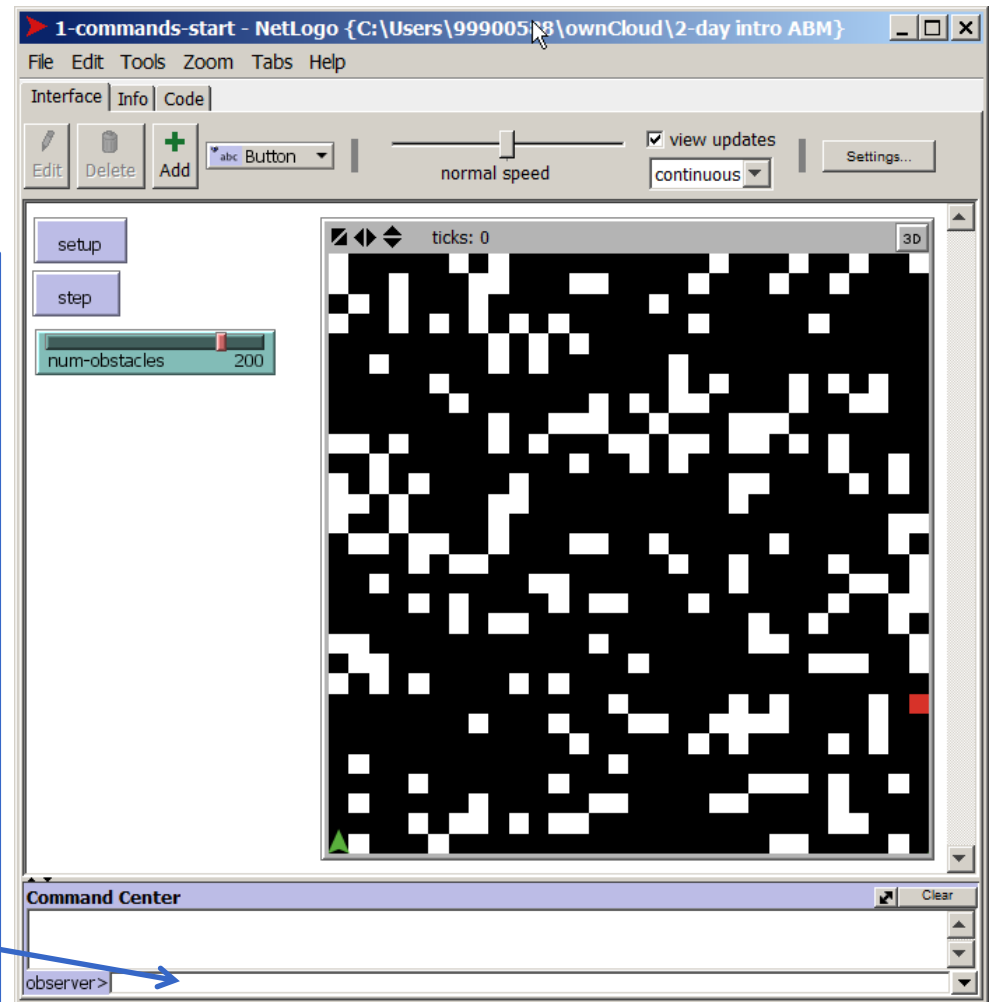
“ask” sends commands to a whole set of agents (one at a time in a random order)

Try typing commands to agents via the world, e.g.:

- ask agents [fd 1]
- ask agents [set color grey]
- ask agents [set shape “person”]
- ask agents [fd 1 rt 90 fd 1]
- ask agents [show patch-here]
- etc.

Can also ask patches:

- ask patches [show self]
- ask patches [set pcolor black]
- ask patch 0 0 [show agents-here]



# Running a simulation (the hard way!)

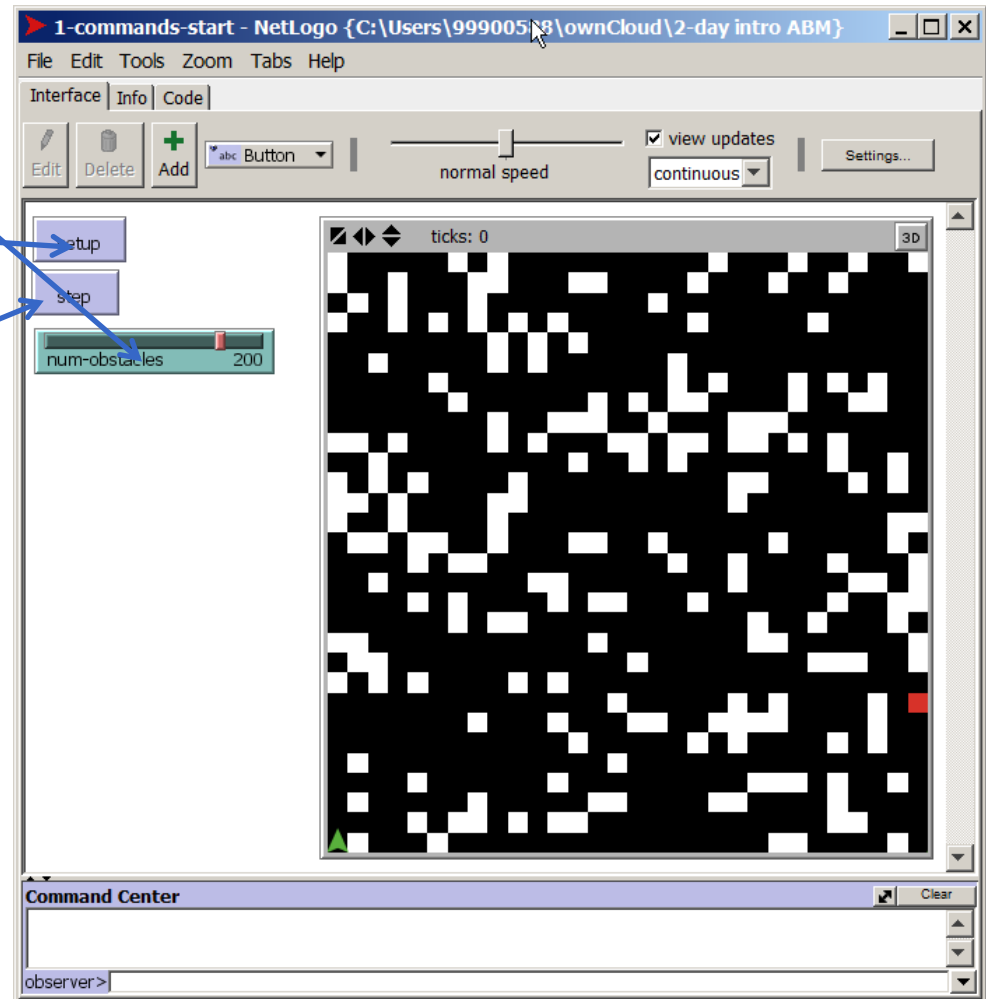
1. Move the slider to change parameter

2. Press “setup” to initialise world

3. Press “step” to make the program run one time step

4. Press “step” lots of times!!

- Each time “step” is pressed the procedure called “step” is caused to run – this is a list of commands, a **program**.
- We will now look at this.



# The Program Code

Click on the “Code” tab to see the program

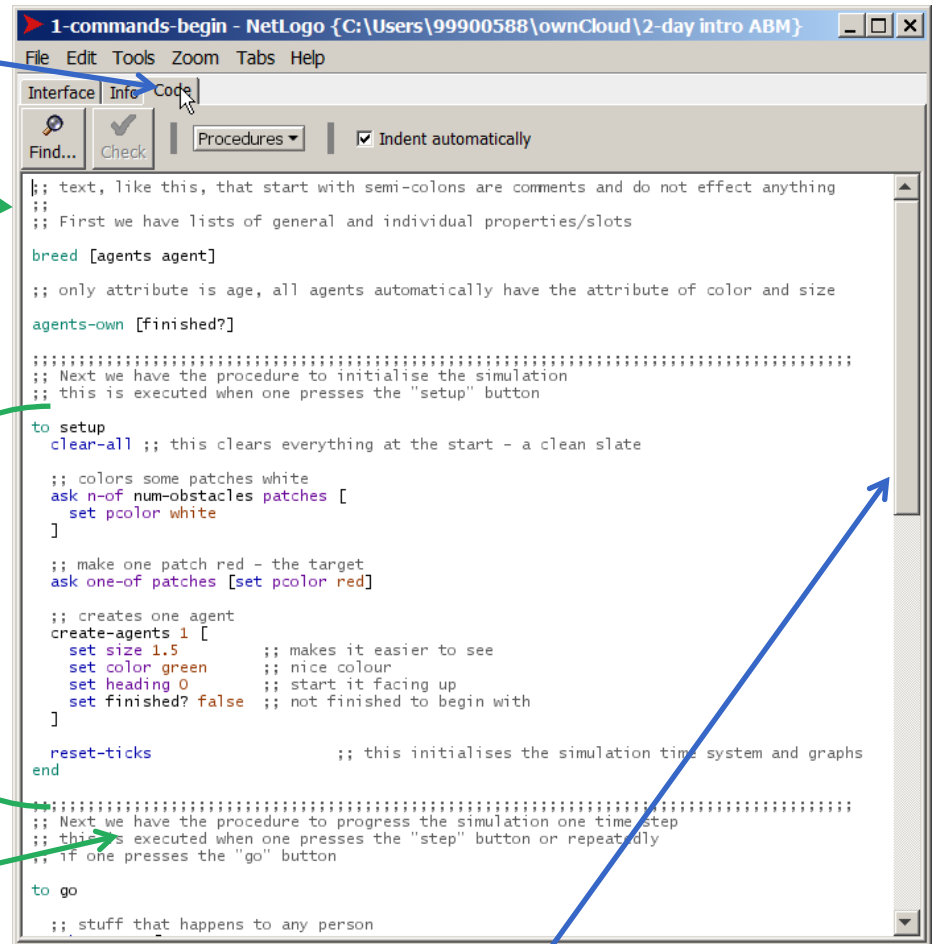
This text is the program

It has different parts

This chunk of code (from “to” to “end”) is the “setup” procedure – what happens when you press the setup button

Text that if after a semi-colon “;” are comments and have no effect

Scroll down to look at the “go” procedure – this is what the “step” button does



The screenshot shows the NetLogo interface with the 'Code' tab selected. The code is as follows:

```
File Edit Tools Zoom Tabs Help
Interface Info Code
Find... Check Procedures Indent automatically

;; text, like this, that start with semi-colons are comments and do not effect anything
;;
;; First we have lists of general and individual properties/slots
breed [agents agent]

;; only attribute is age, all agents automatically have the attribute of color and size
agents-own [finished?]

::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::
;; Next we have the procedure to initialise the simulation
;; this is executed when one presses the "setup" button

to setup
  clear-all ;; this clears everything at the start - a clean slate

  ;; colors some patches white
  ask n-of num-obstacles patches [
    set pcolor white
  ]

  ;; make one patch red - the target
  ask one-of patches [set pcolor red]

  ;; creates one agent
  create-agents 1 [
    set size 1.5 ;; makes it easier to see
    set color green ;; nice colour
    set heading 0 ;; start it facing up
    set finished? false ;; not finished to begin with
  ]

  reset-ticks ;; this initialises the simulation time system and graphs
end

::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::::
;; Next we have the procedure to progress the simulation one time step
;; this is executed when one presses the "step" button or repeatedly
;; if one presses the "go" button

to go

  ;; stuff that happens to any person
```

# Parts of the Code

“ask agents” means to ask (all) agents to do some

All the square brackets inside each other can be confusing, if you double-click *just outside* a bracket, it shows what is inside between it and the matching bracket

conditionals they have a condition and an action

```
to go
;; stuff that happens to any person
ask agent [
;; only do anything if you aren't finished yet
if not finished? [
;; if patch ahead is white, turn 90 degrees right
if [pcolor] of patch-ahead 1 = white [
rt 90
]
;; if patch ahead is not white go forward 1
if [pcolor] of patch-ahead 1 != white [
fd 1
]
;; if the patch you are on is red you are finished
if [pcolor] of patch-here = red [
set finished? true
]
]
]

;; if everyone has finished then stop
if all? agents [finished?] [stop]

tick
end
;; this progresses the
```



# To change the program...

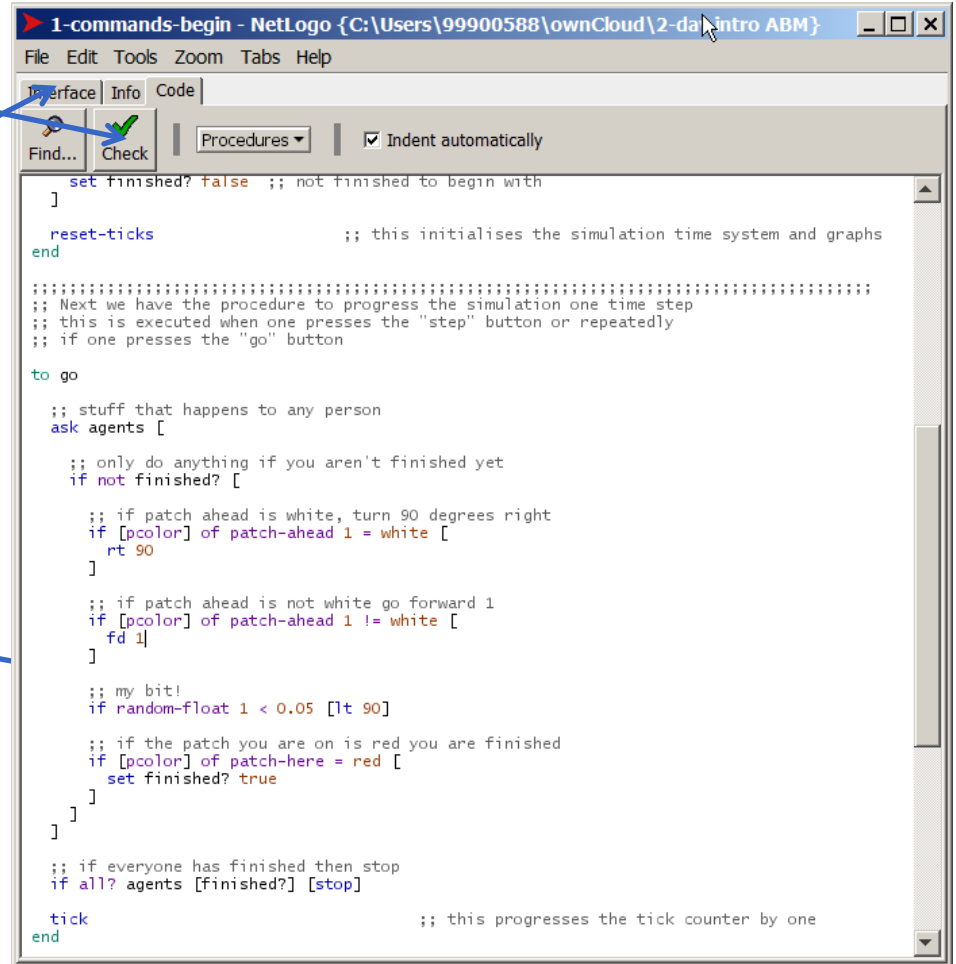
If all is well you can then click on “**Interface**” to go back and try the effect of your change when running the code (pressing the “**step**” button)

see if  
thing

Click within the text  
and type!

*type the following:*

```
;; my bit!  
if random-float 1 < 0.05 [lt 90]
```



```
set finished? false ;; not finished to begin with  
]  
reset-ticks ;; this initialises the simulation time system and graphs  
end  
:  
;; Next we have the procedure to progress the simulation one time step  
;; this is executed when one presses the "step" button or repeatedly  
;; if one presses the "go" button  
to go  
;; stuff that happens to any person  
ask agents [  
  ;; only do anything if you aren't finished yet  
  if not finished? [  
    ;; if patch ahead is white, turn 90 degrees right  
    if [pcolor] of patch-ahead 1 = white [  
      rt 90  
    ]  
    ;; if patch ahead is not white go forward 1  
    if [pcolor] of patch-ahead 1 != white [  
      fd 1  
    ]  
    ;; my bit!  
    if random-float 1 < 0.05 [lt 90]  
    ;; if the patch you are on is red you are finished  
    if [pcolor] of patch-here = red [  
      set finished? true  
    ]  
  ]  
]  
;; if everyone has finished then stop  
if all? agents [finished?] [stop]  
tick ;; this progresses the tick counter by one  
end
```

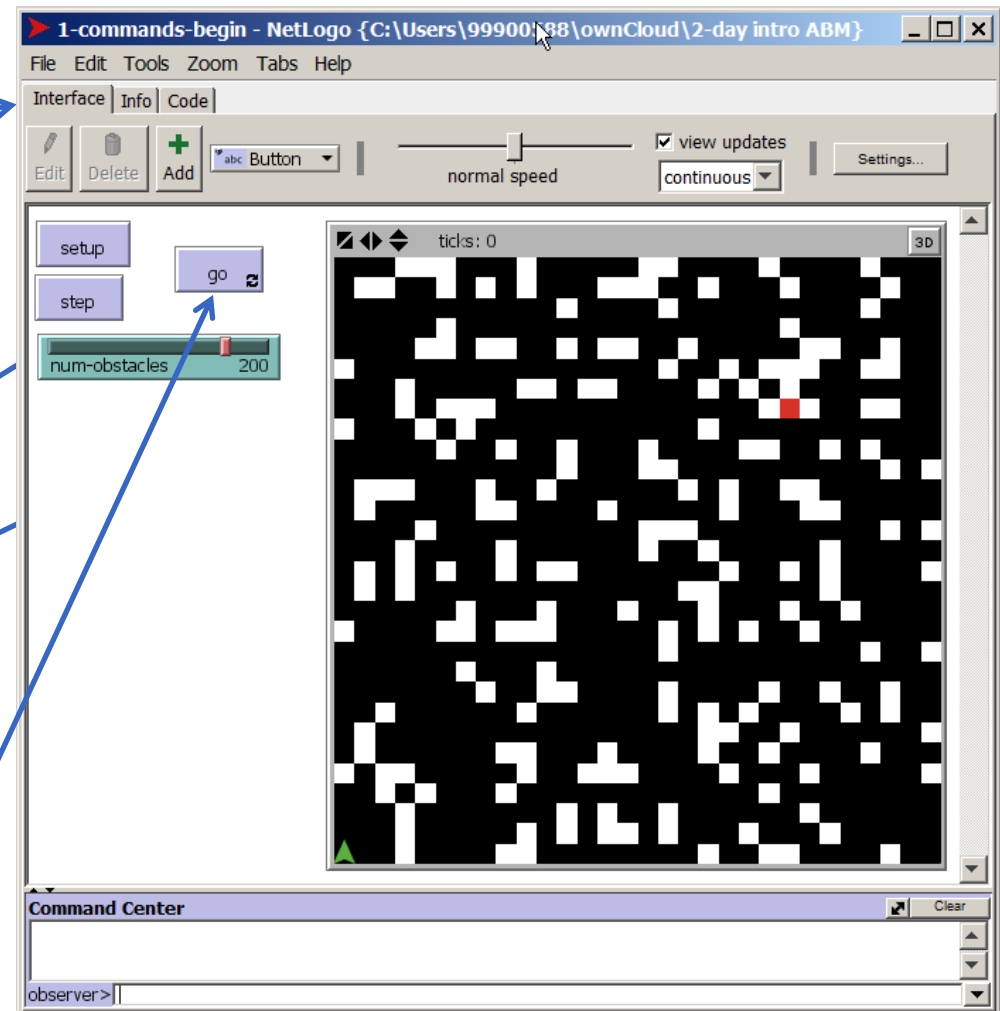
# Adding a button and running the code (the fast way!)

Click on the “**Interface**” tab to get back to the main view

Right-Click some empty space and choose “**button**”

Type the text “go” here and then check (to on) the “forever” switch then “**OK**”

Now when you press the “go” button it will keep doing doing the “go” procedure forever (until you “unpress” it)

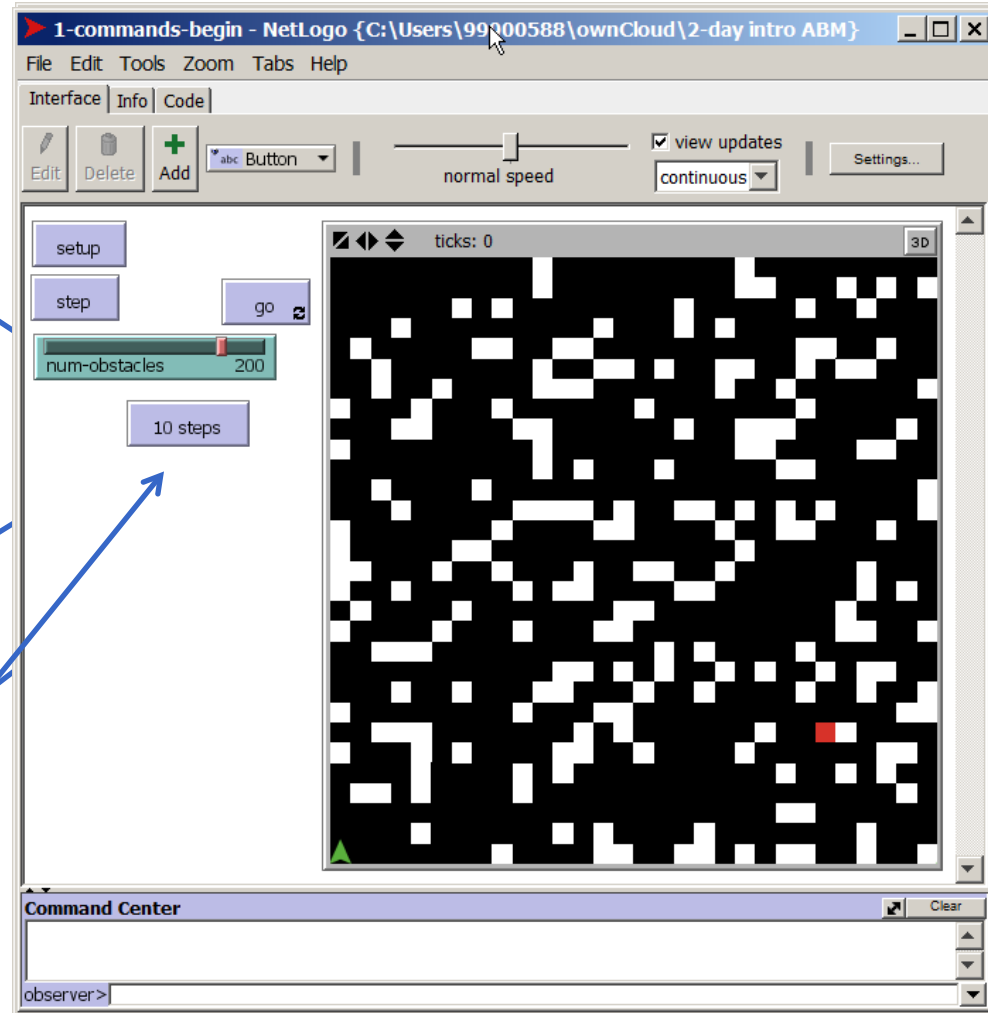


# Adding a button and running the code for only 10 steps

Right-Click some different empty space and choose “button”

Type the text “repeat 10 [go]” here

Type the text “**10 steps**” here  
Now when you press the “10 steps” button it will do the “go” procedure only 10 times



# Key facts

- Programs are lists of commands, in this case done one after another
- In NetLogo, there are different kinds of active 'agent' that can execute code, e.g. the 'turtles', patches, the observer context
- Some commands (e.g. 'ask') can pass control to other agents, so they can execute commands
- So in NetLogo (and many other languages) you have to remember who is doing it

# The Experimentation Cycle

Often programming, especially in the exploratory phase, involves a cycle of:

- Writing some code
- Trying it out (as part of a program or as a direct command)
- Finding errors
- Reading the NetLogo documentation (more on this next session)
- Correcting Errors
- Until it works as you want it to (if ever!)

# Heterogeneous Adaptive Agents

– *a model of voting for parties*

# Fixed vs. Reactive vs. Adaptive vs. Reflective Agents vs. ...

How agents control behaviour is a matter of simulator choice, e.g...

- Behaviour might be *fixed* – an engrained habit, procedure, or built-in reflex
- It might be *reactive* – a certain response is ‘triggered’ under certain circumstances
- The agent might have internal memory/states that are changed by interaction and upon which future behaviour depends – this is *adaptive* behaviour
- The agent might do something more complicated... weighing up future alternatives, solving a puzzle, reasoning about possibilities etc. – these *reflective* actions are quite complex to program

# The “voter” simulation

- This is a very simple simulation where votes and parties are spread over a political spectrum – voters vote for the party nearest in position to them, parties shift position if they do not win
- Load the simulation “[voting.nlogo](#)”
- Choose the number of voters and number of parties you want
- Initialise the simulation (“setup”)
- Then experiment with pressing the “[vote](#)” and “[shift](#)” buttons (the later causes all parties who did not win to shift their political position randomly)

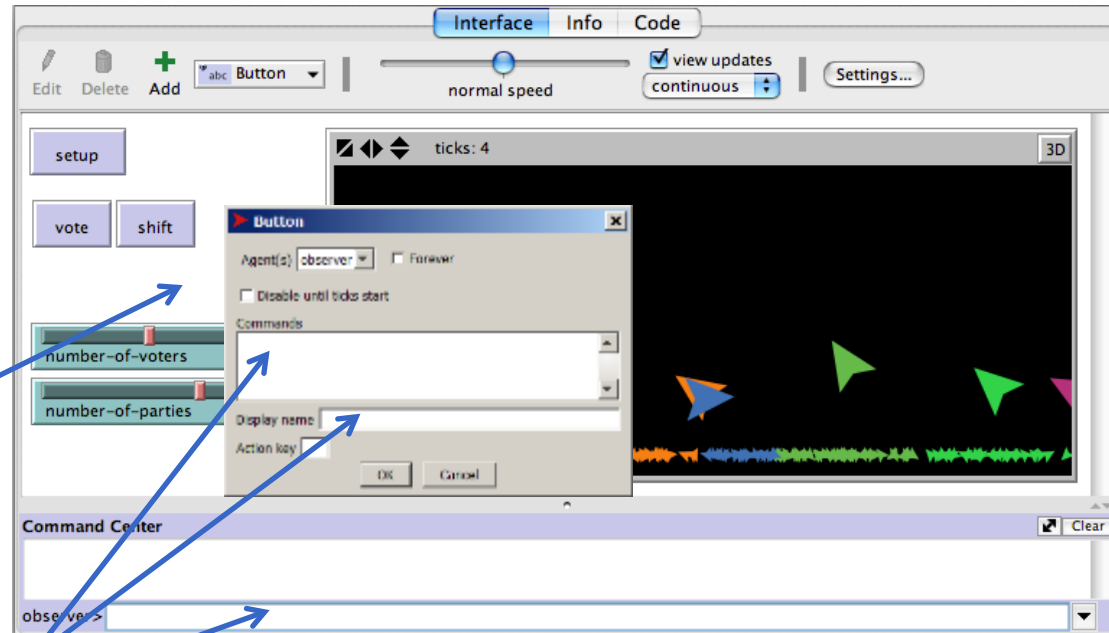


# Commands and Buttons

All buttons do is cause a given command to be executed when they are pressed – same as typing them in.

Right-Click (Mac: ctrl+click) on some empty space and choose “Button”

Type in the commands you want, in this case “**vote shift**” and the button name you want “**Vote+Shift**” then “**OK**”



“**vote shift**” (followed by “**shift**” here

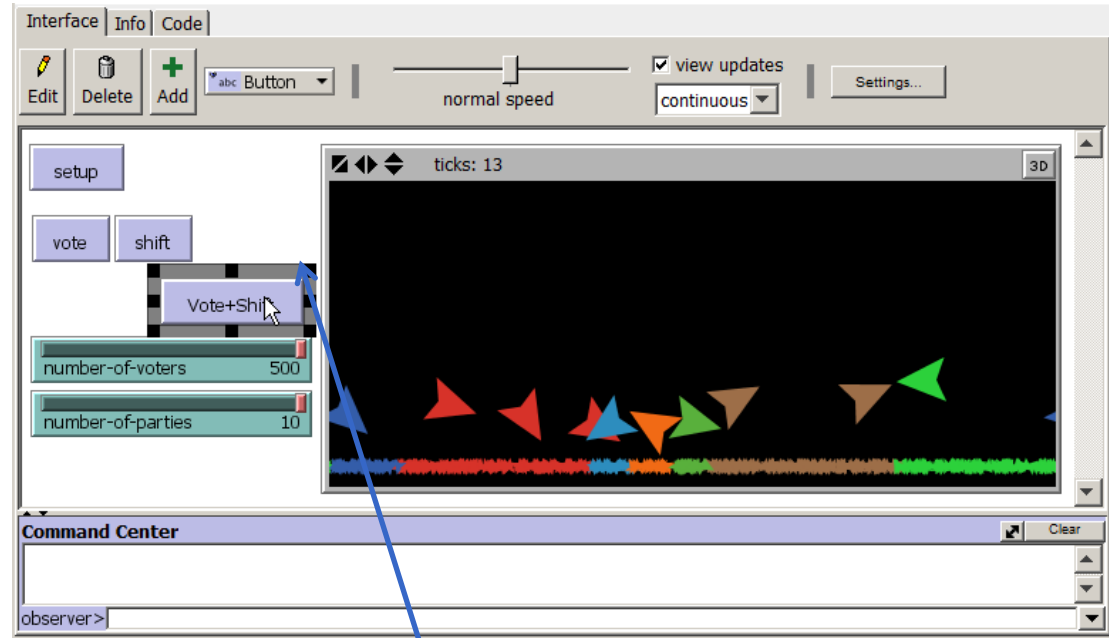


# Commands and Buttons

Now try your new button.

Create a new button called “10xVote+Shift” that does the command “repeat 10 [vote shift]”

Now create a button called “go” that does the command “vote shift” but with the “forever” option selected



If you need to move/resize the button right-click and “Select” it then drag/adjust it

# Improving the look

- Add the command `set shape "person"` within the **update-voter-appearance** procedure
- Add the command `set color [color] of chosen-party` within the `ask voters [...]` within the **vote** procedure. after the `set chosen-party...` command
- go back and try the simulation now
- within setup within create-parties add the line `set won? false` just after the line `set political-position...`
- within the **update-party-appearance** procedure add the command:
  - `ifelse won?`
    - `[set shape "face happy"]`
    - `[set shape "face sad"]`
- go back and try the simulation again
- experiment with changing the code so that the size of parties depends on how many votes they got

# “AgentSets” in NetLogo

One powerful facility in NetLogo is the ability to deal with sets of agents. Examples include:

- `turtles` – all agents
- `parties` – all agents of the breed “party”
- `parties with [not won?]` – the set of parties with the `won?` property set to false
- `[color] of chosen-party` – extracts the value(s) from a set of agents
- `one-of voters` – a random one from all in voters
- `max-one-of parties [votes]` – the agent in parties with the most of property: votes
- `min-one-of parties [abs (political-position - [political-position] of myself)]` – the agent in parties with the minimum value of `abs (political-position - [political-position] of myself)` in other words, the closest to its own political position

**Look at the code again and see if you identify when sets of agents are used and how the code works**

The category called “**Agentset**” in the NetLogo dictionary shows some of the primitives that can be used with these

# An Investigation

- Set the number of voters to 100, the number of parties to 3
- Run it quite a few times
- Observed what tends to happen, e.g.
  - How do parties in the middle fare compared to parties on the wings
  - Under what sort of conditions does a party dominate for a period of time?
  - Under what sort of conditions does power switch rapidly between parties?

# The importance of visualisations

- Due to the fact that it is (relatively) easy to create a simulation you do not understand and that...
- ...You can not rely on your intuitions and classic outputs such as aggregate measures/graphs
- Making good visualisations of what is happening is very important
- I often spend as much time on getting the visualisations of a model right as I do the original “core” programming
- And this can allow a “step change” in my understanding
- The NetLogo “world view” is ideal for this

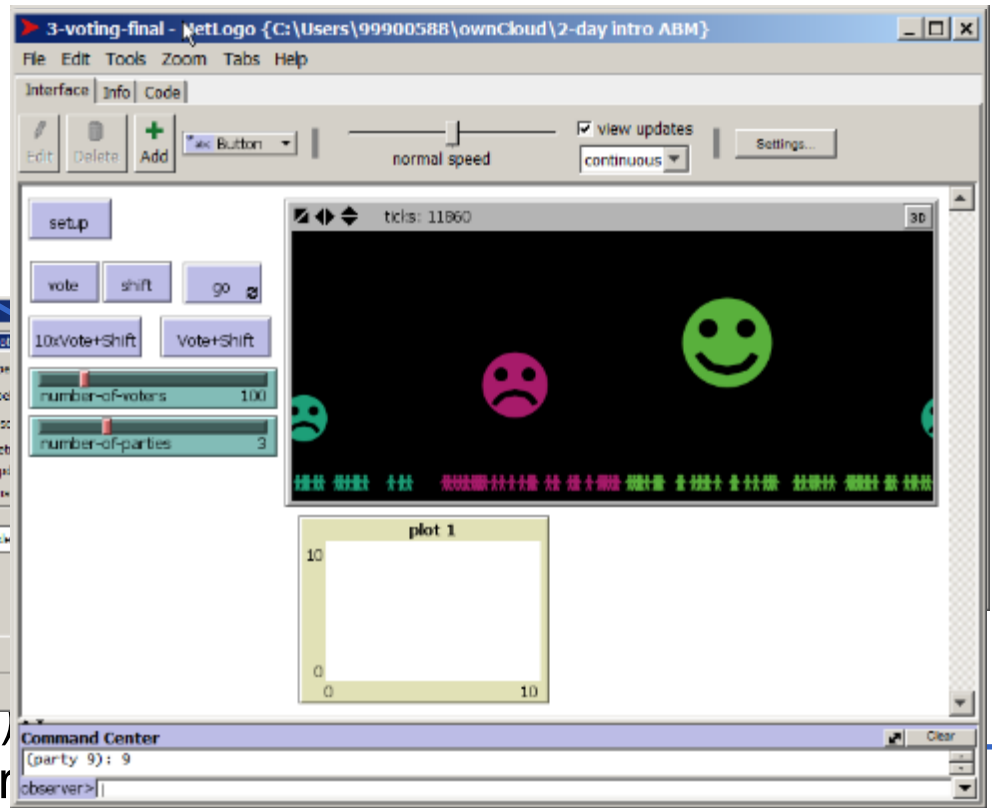
# Adding a graph

Replace the  
“plot count turtles”  
command there with:  
plot [political-position] of  
max-one-of parties [votes]  
then “OK”

In other words to plot the  
political position of the  
winning party

Right-Click (Mac: ctrl+click)  
on some empty space near  
the bottom and choose

If necessary, expand the  
NetLogo window to see the  
new plot window



Now re-run the simulation  
looking the political position  
of the ruling party

# Discussion – Interpreting an ABM

- Simulations (indeed any model) is meaningless without *some* interpretation of what things are meant to stand for to guide model development and investigation
- *How do **you** interpret your observations of the model with 100 voters and 3 parties?*
- The questions:
  - How meaningful is the simulation?
  - How empirically realistic is the simulation?
- Are not *quite* the same!



# A change to the simulation setup

- In the setup procedure, *where voters are created*, change the command `set political-position random-float 1` to: `set political-position random-normal 0.5 0.15`
- This changes the initial distribution of voters from a uniform one to a normal distribution
- Go back and re-investigate the behaviour of the simulation with this setup
- How much does it change the results? Just a bit? Qualitatively different?

# Other things to try

- Does changing the initial distribution of parties on the political spectrum change the behaviour of the simulation
- Can you try to change how the political parties adapt to losing?
- Can you add a rule so that voters change their political position as well?
- Can you change the simulation so that all parties somewhat adjust between elections but after an election there is a bigger or different shift?

# Randomness!

- It is very tempting when some process is either complex or unknown to chuck in a random choice
- But this is as much a definite choice with consequences as any other and should be used with **caution!**
- It is OK when...
  - this is just a temporary ‘stub’ which will be replaced later (but then this needs to be declared if it is left in)
  - One just needs a variety of behaviours for exploratory/testing purposes (but then if you are publishing the results you have a different purpose)
  - One knows the behaviour IS random (check the evidence that this is so)
  - One is pretty sure that the behaviour is irrelevant to the outcome one is looking at (run the model with different kinds of behaviour and check it makes no difference)
- But otherwise it might be better to replace it with something more definite or more realistic

# Mutual Adaption and Emergence

– *a model of opinion change in a group setting*

# Mutual Adaption and Emergence

- Many interesting cases come about when agents are mutually adapting, so that the resultant organisation or social structure results from this mutual adaption
- However such a process can be difficult to predict from the initial conditions, this is called “emergence”
- Chance developments during the development of such organisation can determine which of several possible outcomes result
- Sometimes there are several, quite different, kinds of outcome that can occur from the same start
- In such situations, averaging the results from many runs is not helpful, indeed can be very misleading – better to try to characterise the different “phases”

# Simulation of Influence with a Group

- Model originated from an EU project looking at how information disseminated to farmers
- They noticed that during meetings opinions often diverged into contrasting groups
- They made an abstract simulation to try and capture this phenomena
- Now a great family of related models along these lines, called “opinion dynamic” models
- This is a simplified version of one of these

# Details of this Influence Simulation

- Agents all have different levels of:
  - agreement on an issue, represented by a number -1 to 1
  - uncertainty about their opinion, represented by a number from 0 to 2
- Each iteration one (randomly picked) agent is randomly paired with another
- That other influences their opinion and uncertainty, but only if the other's opinion is sufficiently close to their own (difference is less than their uncertainty)
- There are some “extremists” who are divided between those with opinion 1 and -1 initially
- And “moderates” who have a random opinion initially
- This is a simple version of an existing model (see Info)
- There are many, many variants of these!

# An example of what happens

The **COLOUR** of each is their level of uncertainty, from **blue** (maximally uncertain) to **red** (minimally uncertain)

Each line shows the “trajectory” of a single agent

The vertical scale represents the opinion of each, from -1 up to 1



In this case (roughly) two groupings with “extreme” certain views emerged

(Simulation) time is this axis



# The Consensus Simulation

- Load the “**opinion change.nlogo**” simulation
- “**prop-of-extremists**” is the proportion of extremists in the initial population
- “**uncert-of-moderates**” is the initial uncertainty of the moderates (initial uncertainty of extremists is fixed at 0.05)
- “**speed-uncertainty-change**” is how much an agent’s uncertainty is changed if influenced by another (opinion is always changed 5%)
- Play with the settings, run the simulations, see how many qualitatively different kinds of outcome there are and under what conditions they tend to occur

# Procedures

- To organise code better, you can ‘bunch’ a whole lot of commands and give them a label you decide upon
- So then you can use this label and NetLogo will know this means to do the whole lot of commands it was defined with
- You can progressively define such labels using other labels etc., building up your own vocabulary of powerful commands

# Go to the Code Tab and browse down to the bottom of the code

Between 'to' and 'end' there are sets of commands with a given label, each label can then be used elsewhere

```
to position-agent [tck]
  ;; move the turtle to the position corresponding to its opin
  ;; values need scaling to fit exactly on current world
  setxy
    (max-pxcor - min-pxcor) * (ceiling (tck / num-of-agents))
    0.5 * (opinion + 1) * (max-pycor - min-pycor) + min-pycor
end
```

```
to colour-agent
  ;; make the turtles (and hence their lines) a colour corresp
  ;; from 0 up to the max (the initial uncertainty of moderate
  ;; set up as a global variable
  let pos round (0.49 + 5 * uncertainty / uncert-of-moderates)
  if pos > length uncertainty-colours [set pos length uncertai
  set color item round (0.49 + 5 * uncertainty / uncert-of-mod
end
```

```
to plot-agent
  ;; once simulation is going, plotting involves (re)colouring
  colour-agent
  position-agent ticks
end
```

# Different kinds of procedure

- Since the context of commands matters, *whether the commands are being done **within the context** of an agent, the observer, a patch (or even a link) ...*
- ...it is useful to keep track of which procedure (or chunk of code) is within which kind of context
- Some primitives and variables can only be used within an agent (turtle) context, others only within a patch context and others only within the observer context, etc.

# Some Global Procedures in the code

```
;;;;;;;;;;;;;;  
;;; global procedures ;;;  
;;;;;;;;;;;;;;  
  
to setup  
  ;; note that parameter names have suffixes of the paramter name  
  
  clear-all  
  
  ;; later used in colouring the plots  
  set uncertainty-colours [red orange yellow green lime turquoise]  
  set uncert-of-extremists 0.05  
  
  ;; calculations as to the size of the various sub-populations  
  let num-extremists round num-of-agents * prop-of-extremists  
  let num-moderates num-of-agents - num-extremists  
  let num-upper-extremists num-extremists / 2  
  let num-lower-extremists num-extremists - num-upper-extremists  
  
  ;; create moderates with random opinions  
  create-turtles num-moderates [  
    set uncertainty uncert-of-moderates  
    set opinion (random-float 2) - 1  
  ]
```

The “**setup**” and “**go**” procedures are within the observer (the global) context

But some chunks of code are within the agent context

# Agent procedures

```
;;;;;;;;;;;;;;  
;;; agent procedures ;;;  
;;;;;;;;;;;;;;  
  
to be-influenced-from [oth]  
  ;; only influenced if difference between opinion and other's opinion i  
  ;; my uncertainty...  
  if abs (opinion - [opinion] of oth) < uncertainty [  
    ;; ...in which case shift my opinion and uncertainty towards other's  
    set opinion 0.95 * opinion + 0.05 * [opinion] of oth  
    set uncertainty (1 - speed-uncertainty-change) * uncertainty  
      + speed-uncertainty-change * [uncertainty] of oth  
  ]  
end  
  
to initialise-agent-display  
  ;; what each turtle does in setup  
  hide-turtle  
  penup  
  colour-agent  
  position-agent 0  
  pendown  
end
```

A lot of the other procedures are within the agent context

Local agent variables are only usable within the agent context

Some primitives are only usable within the agent context

# Things to try in this simulation

- Can you work out when one gets one, two or more groups out of the process?
- What might one add to help understand what is happening in the simulation?
- What happens if you change code in the procedure: “**be-influenced-from**”?
- What happens if everyone is only influenced by the nearest other?

# If you have finished...

- ... try playing with some of the other simulations
- Goto <http://cfpm.org/eaepe/>
- And read the document:  
“Other models to play with.pdf”
- And follow its instructions
- Each time: read the “Info Tab”, play with the simulation, look at the code (but only expect to understand small bits of the code as yet)



# Conclusions of Session I

I hope you have got a little bit of an idea concerning agent-based simulation :

- What it is
- How it is programmed
- Its flexibility
- That the outcomes can be surprising
- That it can be hard to understand how one's own model works
- The space of possible models is huge

What we have not talked about is how to apply this to policy issues, and how to check if a model is (in any sense) correct!

# The End



The Centre for Policy Modelling:  
<http://cfpm.org>



Introduction to ABS and Policy Modelling materials:  
<http://cfpm.org/eaepe>

