

Conducting experiments, recording output and analysing results of agent-based modelling for social scientists

The webinar will begin at 3pm

You now have a menu in the top right corner of your screen.

The red button with a white arrow allows you to expand and contract the webinar menu, in which you can write questions/comments.

Feel free to type questions as we go, we will answer as many as we can at the end

We can't hear you.

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Conducting experiments, recording output and analysing results of agent-based modelling for social scientists

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UK Data Service



13 February 2020

UK Data Service







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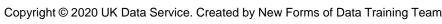




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If not:

- Check your volume, and that your speaker/headset is plugged in
- Click on audio to change to listening via phone.
 - We are recording this webinar we plan to put it on our website









ABM for social scientists – webinar series

- ABM: An Intro
 - Jan 16, 2020, recording available
- ABM: Adding Data
 - - Jan 30, 2020
- ABM: Experiments and Output
 - Feb 13, 2020

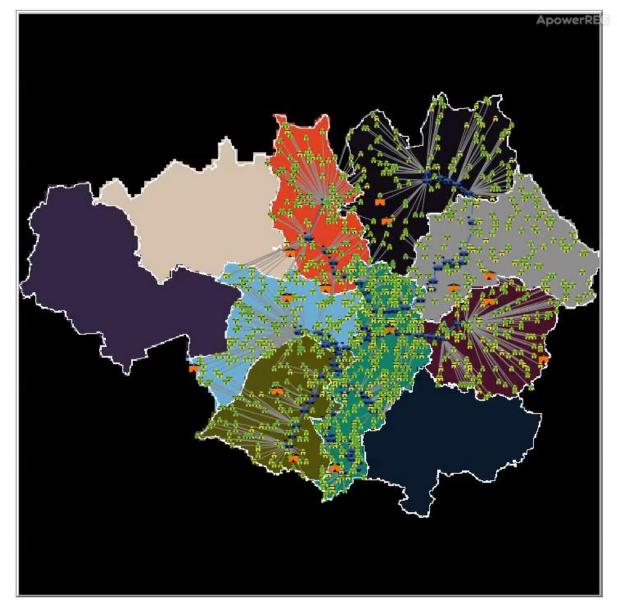


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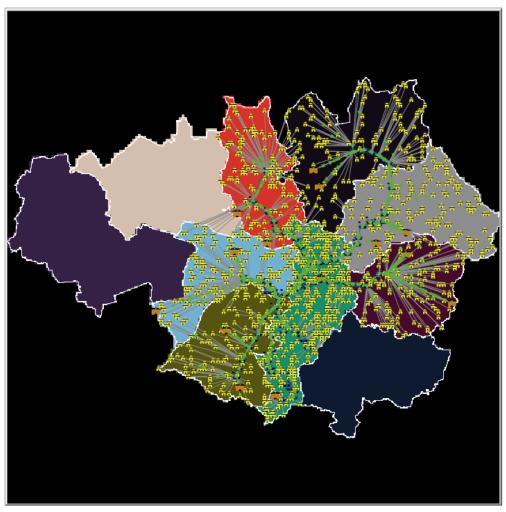
A moment to revisit the "Tram commute" model





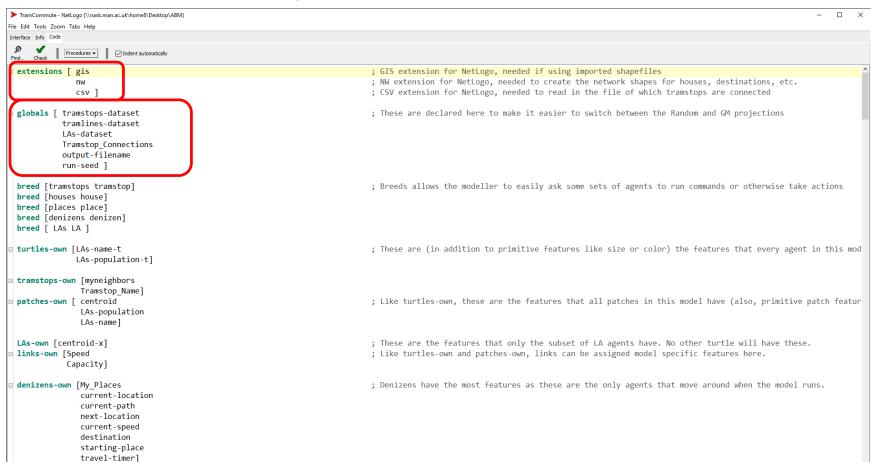
Revisit the "Tram commute model"







A couple of changes ...





Import a .csv file ...

```
* TramCommute - NetLogo {\\nask.man.ac.uk\home$\Desktop\ABM}
File Edit Tools Zoom Tabs Help
Interface Info Code
                                                                                         ; The non-random projection also has several steps, many are similar to those in the random set up.
 to setup-input
      gis:load-coordinate-system (word "Model Data/" projection ".pri")
                                                                                         : 1- Set the coordinate system or 'projection'. This is optional as long as all of the datasets use
      set tramstops-dataset gis:load-dataset "Model Data/GM Tramstops.shp"
                                                                                         ; - Load all of your non-random datasets (as many as you need), assigning them to the globals crea
      set tramlines-dataset gis:load-dataset "Model Data/GM Tramlines.shp"
      set LAs-dataset gis:load-dataset "Model Data/GM LAs R.shp"
      gis:set-world-envelope (gis:envelope-union-of (gis:envelope-of tramstops-dataset); 2- Set the world envelope to the union of all of the datasets' envelopes. This ensures they line
                                                     (gis:envelope-of tramlines-dataset)
    set Tramstop Connections (csv:from-file "Model Data/Tramstop Connections.csv" "," ); Load the .csv file of which tramstops are connected
   ask LAs [ die ]
                                                                                         ; 3- As with the Random projection, clear any agents that may be around.
   gis:set-drawing-color white
                                                                                         ; 4- Set the drawing color to white.
   gis:draw LAs-dataset 1
                                                                                         ; - Draw the polygon data from the shapefile.
                                                                                         ; 5- Technical processes of identifing features from the shapefile and loading them into temporary
    foreach gis:feature-list-of LAs-dataset [ vector-feature ->
       let centroid-y gis:location-of gis:centroid-of vector-feature
                                                                                         ; - The middle of each polygon is identified and added to a list (but not if it lies outside the w
       if not empty? centroid-y
                                                                                         ; 6- If the centroid list is not empty,
       create-LAs 1
                                                                                         ; - Then create an LA agent and ...
         [ set xcor item 0 centroid-y
                                                                                         ; - Move it to the right position (right/left)
           set ycor item 1 centroid-y
                                                                                         : - Move it to the right position (up/down)
           set size 0
                                                                                         ; - Set their size to 0 so as to be invisible ...
           set label-color vellow
                                                                                         ; - Set their label color to yellow to increase visibility ...
           if Label LAs? [set label gis:property-value vector-feature "name"]
                                                                                         ; - Set their label color to yellow to increase visibility ...
           set LAs-population-t gis:property-value vector-feature "population"
                                                                                         ; - Set their label to be their name, which is drawn from the imported shapefile ...
           set LAs-name-t gis:property-value vector-feature "name"
                                                                                         : - And copy that name to turtles-own feature.
           ask patch-here [set LAs-population [LAs-population-t] of LAs-here
                                                                                         ; 7- Then the LA agents talks to the patch underneath themselves.
                           set LAs-name [LAs-name-t] of LAs-here
                                                                                         : - The LA agent asks the patch to copy details like population and name from the LA agent to itse
           set pcolor red] ] ]
                                                                                         ; - And also asks the patches to set their color to red.
           set i i + 1
    gis:apply-coverage LAs-dataset "POPULATION" LAs-population
                                                                                                     ; 8- Pass the population feature from the LA to the patches within the LA
    gis:apply-coverage LAs-dataset "NAME" LAs-name
                                                                                                     ; - Also pass the name feature from LA to patches.
    let min-pop min [read-from-string LAs-population ] of patches with [is-string? LAs-population]; 9- The patches then set their color relative to their population to improve visibilit
    ask patches with [is-string? LAs-population] [
    set pcolor red + ((read-from-string LAs-population - min-pop) * .1 )
    if pcolor = black [set pcolor pcolor + 5 ]]
                                                                                                     ; - Ask any LA patches that are black to recolor themselves, just for clarity.
```



With a list of tram stops and their next stops...

```
Tramstop Connections - Notepad
"Abraham Moss", "Crumpsall", "Queen's Road"
"Manchester Airport","Shadowmoss"
"Altrincham", "Navigation Road"
"Ashton Moss", "Ashton West", "Audenshaw"
"Anchorage", "Habour City", "Salford Quay"
"Audenshaw", "Droylsden", "Ashton Moss"
"Ashton-Under-Lyne", "Ashton West"
"Ashton West", "Ashton Moss", "Ashton-Under-Lyne"
"Baguley", "Roundthorn", "Moor Road"
"Barlow Moor Road", "St Werburgh's Road", "Sale Water Park"
"Brooklands", "Timperley", "Sale"
"Benchill", "Crossacres", "Martinscroft"
"Burton Road", "West Didsbury", "Withington"
"Besses o'th'Barn", "Prestwich", "Whitefield"
"Bowker Vale", "Crumpsall", "Heaton Park"
"Bury", "Radcliffe"
"Broadway", "Langworthy", "MediaCityUK", "Harbour City"
"Cemetery Road", "Edge Lane", "Droylsden"
"Chorlton", "St Werburgh's Road", "Firswood"
"Cornbrook", "Pomona", "Trafford Bar", "Deansgate-Castlefield"
 Crumpsall","Bowker Vale","Abranam Moss
"Crossacres", "Wythenshawe Town Centre", "Benchill"
"Central Park", "Monsall", "Newton Heath and Moston"
"Derker", "Oldham Mumps", "Shaw and Compton"
"Didsbury Village", "East Didsbury", "West Didsbury"
"Dane Road", "Sale", "Stretford"
"Droylsden", "Cemetery Road", "Audenshaw"
"Eccles", "Ladywell"
"Etihad Campus", "Holt Town", "Velopark"
"East Didsbury", "Didsbury Village"
"Edge Lane", "Cemetery Road", "Clayton Hall"
"Exchange Quay", "Salford Quays", "Pomona"
"Exchange Square", "St Peter's Square", "Victoria"
"Firswood", "Trafford Bar", "Chorlton"
"Freehold", "South Chadderton", "Westwood"
"Failsworth", "Hollinwood", "Newton Heath and Moston"
"Deansgate - Castlefield", "St Peter's Square", "Cornbrook"
"Harbour City", "Anchorage", "MediaCityUK", "Broadway"
"Heaton Park", "Bowker Vale", "Prestwich"
"Hollinwood", "Failsworth", "South Chadderton"
"Holt Town" "Now Tolington" "Etihad Compus"
```



Model now opens .csv to link tram stop-agents

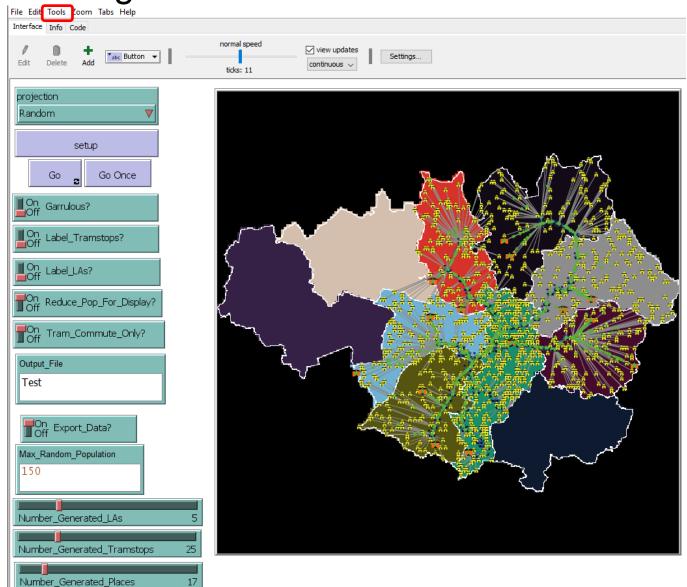
```
* TramCommute - NetLogo {\\nask.man.ac.uk\home$\Desktop\ABM}
                                                                                                                                                                                     П
File Edit Tools Zoom Tabs Help
Interface Info Code
            to setup-trams
     ask tramstops [ die ]
                                                                                                    : - Start by ensuring that there are no tramstops already present
     set-default-shape tramstops "building store"
                                                                                                      - Set the default shape for a tram stop to the building shape that looks most approp
     ifelse projection = "Random"
                                                                                                       - Set up locations for tramstops (and create links between them) based on random gen
     [ nw:generate-preferential-attachment tramstops links Number Generated Tramstops 1 [
                                                                                                      - Create tramstops in a random preferential attachment network for the random projec
     move-to one-of patches with [pcolor != black]
                                                                                                      - The newly created tramstops move to coloured areas (just in case there are any non
     if Label Tramstops? [set label (word LAs-name-t who) ] ]
                                                                                                       - Label the tramstops if modeller input says to do so (in a random model, this will
                                                                                                       - This pushes the tramstops away from each other to spread out the network and is th
     [gis:set-drawing-color blue
                                                                                                       - The GIS set up begins by setting the color with which to draw the tramlines
      gis:draw tramlines-dataset 1
                                                                                                       - Draw in all the tramlines according to the tramlines dataset
      gis:set-drawing-color cvan
                                                                                                    ; - Reset drawing color for the tramstops
       foreach gis:feature-list-of tramstops-dataset [ vector-feature ->
                                                                                                    ; - This step looks into the tramstop dataset and pulls out the features of each trams
       let centroid-stops gis:location-of gis:centroid-of vector-feature
                                                                                                    ; - Centroid will be an empty list if not within the current NetLogo world, as defined
                                                                                                    ; - If centroid is NOT an empty list
       if not empty? centroid-stops
       [ create-tramstops 1
                                                                                                       - Create one tramstop for each tramstop on the Centroid list (all tramstops from the
         [ set xcor item 0 centroid-stops
                                                                                                      - Position the newly created tramstop agent on the X coordinates
           set your item 1 centroid-stops
                                                                                                    ; - Position the newly created tramstop agent on the Y coordinates
           set Tramstop Name gis:property-value vector-feature "RSTNAM"
                                                                                                    ; - Copy the tramstop name from the tramstop dataset
           if Label Tramstops? [set label gis:property-value vector-feature "RSTNAM" ] ] ] ]
                                                                                                    ; - Show the tramstop name as a label if the modeller input says to do so
   ask tramstops [
                                                                                                    ; - Set of commands for the newly created tramstops to perform
       set LAs-name-t [LAs-name] of patch-here
                                                                                                      - Copy the LAs-name from the patch on which it now finds itself
       set LAs-population-t [LAs-population] of patch-here
                                                                                                    ; - Also copy the LAs-population from the patch
       set color blue
                                                                                                      - Become blue
       set size 3

    And also become a visible size

     if projection != "Random" [
                                                                                                      - These steps are needed to create the correct non-random tram network
       foreach Tramstop Connections [
                                                                                                       - For each tramstop listed in the imported .csv file of which tramstops are connecte
         [ LinkedStops ] -> ask tramstops with [Tramstop Name = (item 0 LinkedStops)]
                                                                                                    ; - Create a temporary row and ask the tramstop whose name matches the first name list
         [set myneighbors but-first LinkedStops] ]
                                                                                                    ; - to copy the rest of the tramstops in that temporary row to a tramstop variable cal
     foreach myneighbors [
                                                                                                    : - Then, ask the tramstop to review the items stored in its "myneighbors" variable ..
         [ next_stop] -> ask tramstops with [Tramstop_Name = next_stop]
                                                                                                    ; - Asking the tramstop that matches those names, each in turn, ...
         [create-link-with myself] ] ]
                                                                                                      - to create a link back to the original tramstop agent that is doing the asking.
       tramstons [
                                                                                                    : - With all tramstops correctly linked, tramstops overwrite "myneighbors" with the se
    ask links [set Speed 10
                                                                                                    ; - Now, the model asks all the links (which so far are only between tramstops) to set
                  set Capacity 100]
                                                                                                    ; - and their capacity. As of now, capacity is not used for anything.
```

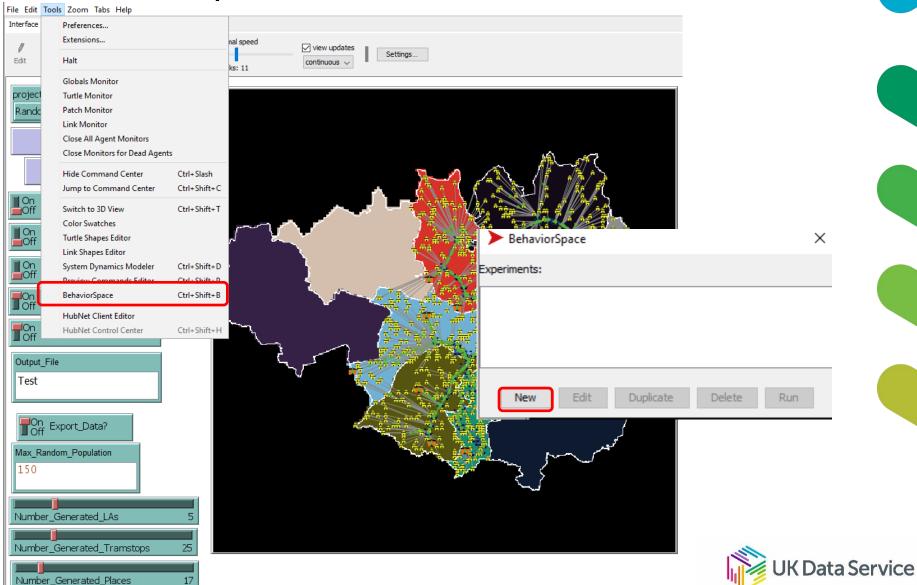


Moving on!





Behaviour Space



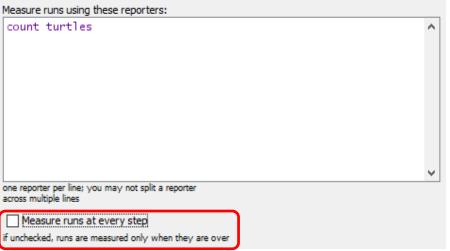
Behaviour Space

➤ Experiment	×
Experiment name Tram_Commute_Random_Initial_	
Vary variables as follows (note brackets and quotal Export_Data?" true] ["Number_Generated_LAs" [4 1 10]] ["Garrulous?" false] ["Number_Generated_Places" [25 25 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2	250]] 10000]] Isel
Either list values to use, for example: ["my-silder" 1 2 7 8] or specify start, increment, and end, for example: ["my-silder" [0 1 10]] (note additional brackets) to go from 0, 1 at a time, to 10. You may also vary max-pxcor, min-pxcor, max-pycor, min-px	oycor, random-seed.
Repetitions 10 run each combination this many times	
Run combinations in sequential order For example, having ["var" 1 2 3] with 2 repetitions, the ex- sequential order: 1, 1, 2, 2, 3, 3 alternating order: 1, 2, 3, 1, 2, 3	periments" "var" values will be:
Measure runs using these reporters: count turtles	^
one reporter per line; you may not split a reporter	
across multiple lines Measure runs at every step if unchecked, runs are measured only when they are over	,
Setup commands:	Go commands:
► Stop condition: the run stops if this reporter becomes true	Final commands:



Basic Behaviour Space output

Output options are built-in to the behaviour space interface.



- BUT!
 - Choice to measure selected commands at every step or
 - Measure selected commands at end of run.
 - Swap out the above "if" command for a very basic "count tramstop-agents"



Behaviour Space

➤ Experiment			×	(
Experiment name Tram_Commute_Ra	ndom_Initia	l_Parameter_Sweep		
Vary variables as follows (note bracket	s and quota	ation marks):		
["Export_Data?" true] ["Number_Generated_LAs" [4 ["Garrulous?" false] ["Number_Generated_Places" ["Label_Tramstops?" false] ["projection" "Random"] ["Tram_Commute_Only?" true ["Label_LAs?" false] ["Output_File" "Random_Tes ["Max_Random_Population" [["Reduce_Pop_For_Display?" ["Number_Generated_Tramsto	[25 25 	10000]]	^	
Either list values to use, for example:			~]
["my-slider" 1 2 7 8] or specify start, increment, and end, for exam	nple:			
["my-slider" [0 1 10]] (note additional bracket to go from 0, 1 at a time, to 10.				
You may also vary max-pxcor, min-pxcor, ma	ax-pycor, min	-pycor, random-seed.		1
Repetitions 10				
✓ Run combinations in sequential ord For example, having ["var" 1 2 3] with 2 rep sequential order: 1, 1, 2, 2, 3, 3 alternating order: 1, 2, 3, 1, 2, 3 Measure runs using these reporters:	ler etitions, the e	experiments' "var" values	will be:	
count turtles			^	
			•	
one reporter per line; you may not split a re across multiple lines	porter			
Measure runs at every steps if unchecked, runs are measured only when	they are ove	er		
Setup commands:		Go commands:		
setup	^	go	^	
▶ Stop condition:		▶ Final commands:		1
the run stops if this reporter becomes true		run at the end of each ru	in	



Experiments on random projection



First experiments will be parameter sweeps:

- All parameters vary
- Wide ranges, big increments
- Fewer repetitions

Then, use the results to run targeted sweeps with:

- Maybe not all parameters
- Narrower ranges and/or smaller increments
- More repetitions

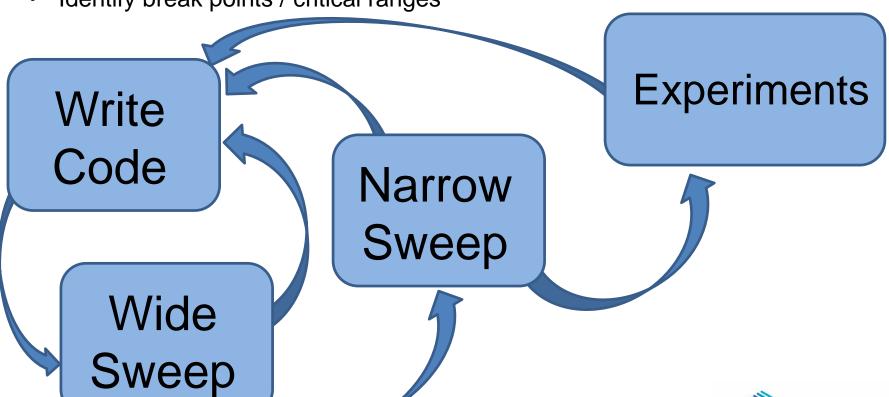
Or experiments

- MANY repetitions on single/few settings
- · Changes to model code
 - Generate more tram stops, houses, or places
 - Generate more commuters
 - After some trigger or at a fixed point in time
- Etc.



Random projection experiments needed to:

- Verify model logic
- Test model changes
- Identify interactions of various parameters
- Identify break points / critical ranges

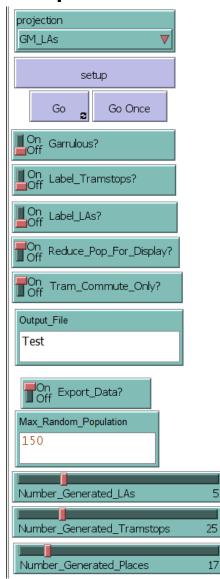


Behaviour Space

▶ Experiment	×
Experiment name	
Way variables as follows (vote brackets and quotation mucks). [Export_Data?" true] ["Number_Generated_LAs" 5] ["Sarrulous?" false] ["Number_Generated_Places" 5] ["Label_Tramstops?" false] ["projection" "GM_LAs"] ["Tram_Commute_Only?" true false] ["Label_LAs?" false] ["Output_File" "GM_LAs_Test"] ["Max_Random_Population" 5] ["Reduce_Pop_For_Display?" true false] ["Number_Generated_Tramstops" 5]	^
Either list values to use, for example: ["my-slider" 1 2 7 8] or specify start, increment, and end, for example: ["my-slider" [0 1 10]] (note additional brackets) to go from 0, 1 at a time, to 10. You may also vary max-pxcor, min-pxcor, max-pycor, min-pycor, random-seed.	
Repetitions 10 run each combination this many times	
Run combinations in sequential order For example, having ["var" 1 2 3] with 2 repetitions, the experiments' "var" values will be: sequential order: 1, 1, 2, 2, 3, 3 alternating order: 1, 2, 3, 1, 2, 3 Measure runs using these reporters:	
<pre>if current-location = destination [print who print starting-place print [LAs-name-t] of starting-place print destination print [LAs-name-t] of destination print travel-timer]</pre>	٨
one reporter per line; you may not split a reporter	~
across multiple lines Measure runs at every step if unchecked, runs are measured only when they are over Setup commands: Go commands:	
setup a go	٨
► Stop condition: ► Final commands:	
the run stops if this reporter becomes true run at the end of each run	
Time limit 10000	



Experiments on GM_LAs projection



First experiments are still parameter sweeps:

- Still important to check model function
- May not need as many rounds

Experiments

- Can still repeat on large scale
- Can change projection and/or model code
 - Start with oldest tramlines and add extensions at specified points in model run
 - Include currently agreed extensions (from beginning or at specified point in model run)
 - Include currently considered lines, rejected lines, totally imaginary lines, etc.
- Others?

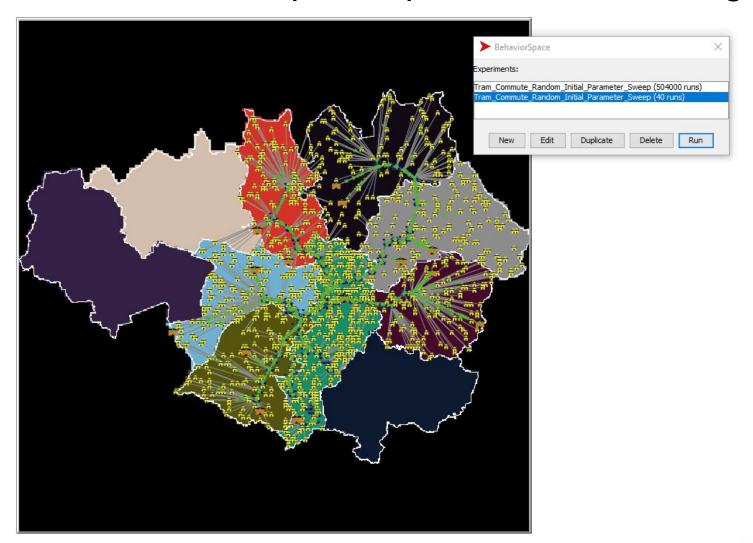


GM_LAs projection experiments needed to:

- Compare model behaviour to real-world observations
- Test projection-specific model changes
- Identify interactions of various parameters under realistic layout
- Identify break points / critical ranges
- Model possible outcomes of making changes
- Answer specific research questions



Parameter sweeps are part of model testing



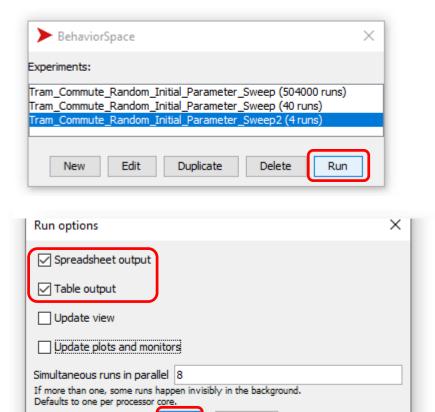


But first...

- Ideal output is well-motivated by:
 - Research questions
 - Model design
 - Iterative developments
- In this model, as it stands, I decided to look at output related to:
 - How long does it take to travel between one LA and another?
 - How common are trips within each LA and between Las?
- With fairly minor changes we could also get output related to:
 - Most popular places to visit
 - Most used tram stops
 - More?



Hitting the Run button



Cancel



Experiments need output!

```
Running Experiment: Tram_Commute_Random_Initial_Parameter_Sw...

Run #1 of 4, step #0
Total elapsed time: 0:00:09
Export_Data? = true
Number_Generated_LAs = 5
Garrulous? = false
Number_Generated_Places = 5
Label_Tramstops? = false
projection = GM_LAs
Tram_Commute_Only? = true
Label_LAs? = false

Update view

Update plots and monitors
```



Behaviour Space standard output - spreadsheet

TramCommute.nlogo				
Tram_Commute_Initial_Parameter	Sweep			
02/11/2020 17:05:56:445 +0000				
min-pxcor	max-pxcor	min-pycor		max-pycor
-90	90		-90	90
[ran number]	1		2	
Export_Data?	TRUE	TRUE		
Number_Generated_LAs	5		5	
Garrulous?	FALSE	FALSE		
Number_Generated_Places	17		17	
Label_Tramstops?	FALSE	FALSE		
projection	GM_LAs	GM_LAs		
Tram_Commute_Only?	TRUE	FALSE		
Label_LAs?	FALSE	FALSE		
Output_File	Test	Test		
Max_Random_Population	150		150	
Reduce_Pop_For_Display?	TRUE	TRUE		
Number_Generated_Tramstops	25		25	
[teps]	1000		1000	
[initial & final values]	count tramstops	count tramstops		
	93		93	



Behaviour Space standard output - table

RehaviorSpace r	esults (NetLogo 6.1.1)																		\neg
FramCommute.r																			
ram_Commute	_Initial_Parameter_Sw	eep																	
02/11/2020 17:05	5:26:223 +0000																		
min-pxcor	max-pxcor	min-pycor	max-pycor																
-90	90)	-90	90															
		Number_Gene	erat	Nui	mber_Genera	t			Tram_Commute_			Max_Random_	Po Re	educe_Pop_For_	Number_Gener	at			
run number]	Export_Data?	ed_LAs	Garrulous?	ed	Places	Labe	I_Tramstops?	projection	Only?	Label_LAs?	Output_File	pulation	Di	isplay?	ed_Tramstops	[step]		count tramstops	i
1	TRUE		5 FALSE		1	L 7	FALSE	GM_LAs	TRUE	FALSE	Test		150	TRUE		25	1000	!	93
2	TRUE		5 FALSE		1	L 7	FALSE	GM_LAs	FALSE	FALSE	Test		150	TRUE		25	1000	!	93



Alternate output

- Output options are built-in to the behaviour space interface.
 - Choice to measure selected commands at every step or
 - Measure selected commands at end of run.
 - Spreadsheet or table options
- Other output options can be built directly into the model code.



Exports in setup



- ; GIS extension for NetLogo, needed if using imported shapefiles
- ; NW extension for NetLogo, needed to create the network shapes for houses, destinations, etc.
- ; CSV extension for NetLogo, needed to read in the file of which tramstops are connected



Exports in setup

```
clear-all
                                                                              ; Always start by clearing everything.
                                                                              ; Creates a "seed" to use as a unique identifier for the run (also, allows the run to be re-run &
  set run-seed new-seed
  random-seed run-seed
                                                                              ; Initiates this run using the just created seed
  set output-filename (word projection " " Output File " " run-seed )
                                                                              ; Creates an output file to record the model run based on the projection selected, a user input v
                                                                              ; The model diverges significantly depending on whether you want to use randomly generated or imp
  ifelse projection = "Random"
    [ setup-random ]
                                                                              ; This initiates the procedures to set up a random world, drawing on the various "Random Generate
    [ setup-input ]
                                                                              ; This initiates the procedures to set up a world based on imported shapefiles. This too draws or
  setup-trams
                                                                              ; the Random projection models, such as "Random Generated Tramstops".
  if Garrulous? [ask links [print end1]]
  setup-houses-and-places
  setup-denizens
  initial-exports
     if Export Data?
        [file-open (word output-filename ".csv" )
                                                                                                 ; Creates a file named with the output-filename created earlier. Wrapping it
         file-print (word "Commuter, Origen, Origin LA, Destination, Destination LA, Travel time")
                                                                                                 ; Set up the headers that should appear in the output file
         file-print (word " , , , , ,")
                                                                                                 ; Currently not needed - but you could use row (or more like it) to write ou
         file-closel
                                                                                                  ; Closes the file - necessary to save the input just added and also prepare
to when-at-destination
     set current-location next-location
                                                                                         ; They copy over their next proximal destination to their current location
    if Export Data?
                                                                                         : Check to see if the modeller wants data exports
    [file-open (word output-filename ".csv" )
                                                                                         ; If so, they open the appropriate file. The "," enables it to be formatted for ..
                                                                                          ; Adds their who number, origen, origen LA, destination, destination LA, and travo
    file-print
    (word who "," starting-place "," [LAs-name-t] of starting-place "," destination "," [LAs-name-t] of starting-place "," travel-timer)
    file-close
                                                                                         ; And closes the file - still important.
    set starting-place destination
                                                                                         ; They copy over their current destination to be the starting-place for the next
    set destination one-of My Places
                                                                                         ; Pick a new destination is head to...
    set travel-timer 0
                                                                                         ; Reset the counter that tracks time elapsed for travel back to zero
                                                                                         ; Checks to see if they are currently at a Place and...
    if any? places-here
       [create-link-with one-of places-here]
                                                                                         : If so, creates a link with that place.
     if any? houses-here
                                                                                                             they are currently at a House and...
                                                                                          Time for a micro-break?
                                                                                                            a link with that house.
      [create-link-with one-of houses-here]
     set current-path []
                                                                                                            ent-path to their new destination back to an empty list
     set current-path nw:turtles-on-path-to destination
                                                                                                         <del>ne </del>bath to that new destination and fills in the recently reset cur
     set next-location first current-path
                                                                                            Sets next proximal destination
     face next-location
                                                                                            Turns to face that proximal destination
     set current-path but-first current-path
                                                                                         ; And removes the proximal destination from the current-path
end
```



One file per run

1 2 3 4 5 6 7 8	3305 2491 2218 2345	Origen (house 473) (house 201) (house 439) (house 556) (house 458)	Origin_LA Manchester Trafford Manchester Manchester	Destination (place 1229) (place 1237) (place 1229)	Destination_LA Manchester Trafford	Travel_time 3	
3 4 5 6 7 8	3305 2491 2218 2345	(house 201) (house 439) (house 556)	Trafford Manchester	(place 1237)			Ì
3 4 5 6 7 8	3305 2491 2218 2345	(house 201) (house 439) (house 556)	Trafford Manchester	(place 1237)		3	
4 5 6 7 8	2491 2218 2345	(house 439) (house 556)	Manchester		Hallolu	3	t
5 6 7 8	2218 2345	(house 556)		(place 1229)	NA	2	ł
6 7 8	2345		Manchester		Manchester	3	+
7		(house 458)		(place 1230)	Manchester	4	1
8	3361	,	Manchester	(place 1230)	Manchester	4	
		(house 146)	Trafford	(place 1233)	Trafford	4	
	2451	(house 697)	Manchester	(place 1229)	Manchester	4	İ
		(house 1195)	Oldham	(place 1235)	Oldham	4	t
							ł
10		(house 931)	Bury	(place 1225)	Bury	4	+
11	3043	(house 860)	Bury	(place 1225)	Bury	4	1
12	3234	(house 239)	Trafford	(place 1237)	Trafford	4	
13	2092	(house 1017)	Tameside	(place 1227)	Tameside	4	
14	2563	(house 458)	Manchester		Manchester	4	t
							t
						-	ł
						4	ŀ
17	2903	(house 860)	Bury	(place 1225)	Bury	4	1
18	3340	(house 116)	Trafford	(place 1229)	Trafford	4	
19	3385	(house 126)	Trafford	(place 1233)	Trafford	4	
20	1841	(house 977)	Tameside		Tameside	4	İ
		•					t
							H
							ŀ
	2525	(house 600)	Manchester	(place 1229)	Manchester	4	1
24	2546	(house 423)	Manchester	(place 1229)	Manchester	4	
25	1819	(house 960)	Tameside	(place 1227)	Tameside	4	
26	2783	(house 1144)	Oldham	(place 1235)	Oldham	4	Ţ
						1	t
							+
							+
29	1501	(house 835)	Rochdale	(place 1232)	Rochdale		+
30	3259	(house 218)	Trafford	(place 1237)	Trafford	5	
31	1891	(house 961)	Tameside	(place 1227)	Tameside	5	
32			Manchester		Manchester	5	t
							+
		•					+
							+
35	2021	(house 1047)	Tameside	(place 1227)	Tameside	5	
36	2009	(house 1047)	Tameside	(place 1227)	Tameside	5	
37	1925	(house 1086)	Tameside	(place 1227)	Tameside	5	ſ
50	3213	(110036 103)	Harroru	(blace 1230)	Harrord		ł
	13 14 15 16 17 18 19 20 21 22 23 24 25 26 27 28 29 30 31 32 33 34 35	13 2092 14 2563 15 2326 16 1707 17 2903 18 3340 19 3385 20 1841 21 1794 22 1650 23 2525 24 2546 25 1819 26 2783 27 3301 28 1945 29 1501 30 3259 31 1891 32 2169 33 2396 34 1916 35 2021 36 2009 37 1925	13 2092 (house 1017) 14 2563 (house 458) 15 2326 (house 614) 16 1707 (house 371) 17 2903 (house 860) 18 3340 (house 116) 19 3385 (house 126) 20 1841 (house 977) 21 1794 (house 346) 22 1650 (house 248) 23 2525 (house 600) 24 2546 (house 423) 25 1819 (house 423) 25 1819 (house 1144) 27 3301 (house 1144) 27 3301 (house 1144) 28 1945 (house 1036) 29 1501 (house 385) 30 3259 (house 961) 31 1891 (house 961) 32 2169 (house 389) 33 2396 (house 1047) 34 1916 (house 1047) 36 2009 (house 1047) 37 1925 (house 1086)	13 2092 (house 1017) Tameside 14 2563 (house 458) Manchester 15 2326 (house 614) Manchester 16 1707 (house 371) Salford 17 2903 (house 860) Bury 18 3340 (house 116) Trafford 19 3385 (house 126) Trafford 20 1841 (house 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```
↓ Source on Save Q  

✓ ✓ □

                                                                                           Run 💝 🖶 Source
  1 ## Global options, necessary libraries, etc.
    ## Take time to install if needed.
  4 options(stringsAsFactors = FALSE)
  5 library(ggplot2)
  6 library(sqldf)
  7 library(tidyverse)
    detach("package:RPostgreSQL", unload=TRUE)
  9
    ## Always good to start off by checking and/or setting your working directory
 10
 11
    setwd("//nask.man.ac.uk/home$/Desktop/ABM/Experimental_Results")
 12
 13
    ## Read in csv files
 14
    GM_Tram_Raw <- (read.csv("//nask.man.ac.uk/home$/Desktop/ABM/Experimental_Results/GM_LAs_CodeTest_-473979832.csv",
 15
                           header = TRUE))
 16
 17
```



Look at raw file

Analy	rse_Single_Run.R >	K GM_Tr	am_Raw × Q	TravelTime.heatm	ap × Tram_Jour	ney_Count ×							
\Leftrightarrow	↓ □ ▼ Filter												
_	Commuter [‡]	Origen [‡]	Origen_LA [‡]	Destination	Destination_LA	Travel_time							
1	1425	(house 165)	Salford	(place 1235)	Salford	3							
2	1609	(house 433)	Manchester	(place 1225)	Manchester	3							
3	2679	(house 356)	Trafford	(place 1235)	Salford	3							
4	1531	(house 138)	Salford	(place 1235)	Salford	4							
5	1508	(house 104)	Salford	(place 1227)	Bury	4							
6	1505	(house 122)	Salford	(place 1235)	Salford	4							
7	1785	(house 605)	Manchester	(place 1225)	Manchester	4							
8	3137	(house 772)	Oldham	(place 1232)	Oldham	4							
9	2537	(house 952)	Bury	(place 1228)	Bury	4							
10	2515	(house 918)	Bury	(place 1227)	Bury	4							
11	1425	(place 1235)	Salford	(place 1235)	Salford	2							
12	1537	(house 553)	Manchester	(place 1225)	Manchester	4							

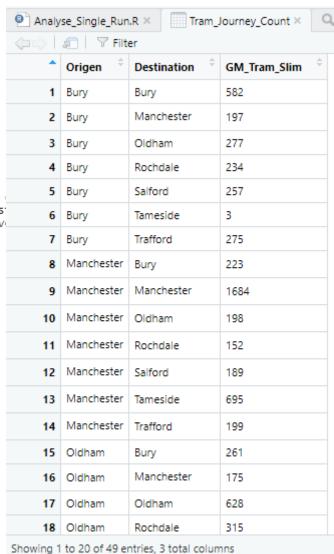


48

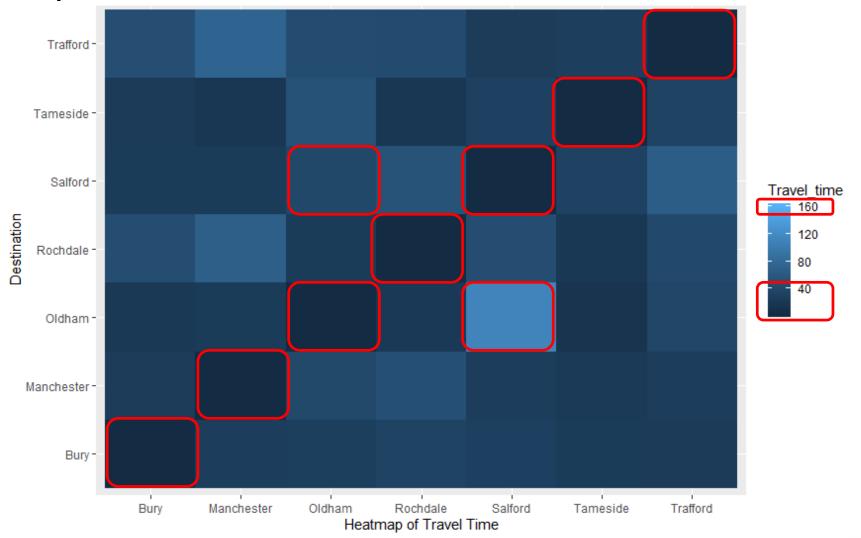
```
14 ## Read in csv files
15 GM_Tram_Raw <- (read.csv("//nask.man.ac.uk/home$/Desktop/ABM/Experimental_Results/GM_LAs_CodeTest_-473979832.csv",
16
                             header = TRUE))
17
18 ## Basic clean up
19 ## Remove parertheses
20 GM_Tram_Raw$Origen <- (gsub("[()]", "", GM_Tram_Raw$Origen))
21
22
    ## Split the Origen column into one that tracks the agent-type and another than has that agent's who number
23 GM_Tram_Adjusted <- GM_Tram_Raw %>%
     separate(Origen, c("Journey", "OSpecifics"), 6)
24
25
26
    ## Remove unneeded columns
27 GM_Tram_Slim <- GM_Tram_Adjusted[c("Commuter", "Journey", "Origen_LA", "Destination_LA", "Travel_time")]
28
29
    ## Rename some columns to streamline interpretation
30 GM_Tram_Slim <- GM_Tram_Slim %>%
31
      rename(
        Origen = Origen_LA,
32
        Destination = Destination_LA )
33
34
35 ## Shockingly basic analysis
36 ## Count the number of journeys taken between each pair of LAS
   Tram_Journey_Count <- GM_Tram_Slim %>%
37
      group_by (Origen, Destination) %>%
38
      summarize( GM_Tram_Slim = n())
39
40
41
42
    #Heat map of travel time between Origen LA and destination LA
    TravelTime.heatmap <- ggplot(data = GM_Tram_Slim, mapping = aes(x = Origen,
43
44
                                                               y = Destination,
45
                                                           fill = Travel_time)) +
46
      geom_tile() +
      xlab(label = "Heatmap of Travel Time")
47
```



```
## Shockingly basic analysis
   ## Count the number of journeys taken between each pair of LAS
36
   Tram_Journey_Count <- GM_Tram_Slim %>%
37
      group_by (Origen, Destination) %>%
38
      summarize( GM_Tram_Slim = n())
39
40
41
    #Heat map of travel time between Origen LA and destination LA
42
    TravelTime.heatmap <- ggplot(data = GM_Tram_Slim, mapping = aes(x =
43
                                                                y = Des
44
                                                            fill = Trav
45
      geom_tile() +
46
      xlab(label = "Heatmap of Travel Time")
47
48
```









Summary

- Revisit the "Tram commute model"
- Behaviour Space
- Consider what experiments to run
 - · parameter sweeps
 - targeted research questions
- Building output creation into your model code an optional extra
- Open output
 - Process
 - Analyze
 - Visualise
- https://www.comses.net/codebases/5ec74433-0536-4343-88fd-8385e7f5066c/releases/1.0.0/
- Or
- https://tinyurl.com/wagewt9



Questions

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