



# Reproducible Research

Alex Singleton

*Professor of Geographic Information Science  
Department of Geography and Planning*



Northern  
Regional  
Data Facility



UNIVERSITY OF  
LIVERPOOL



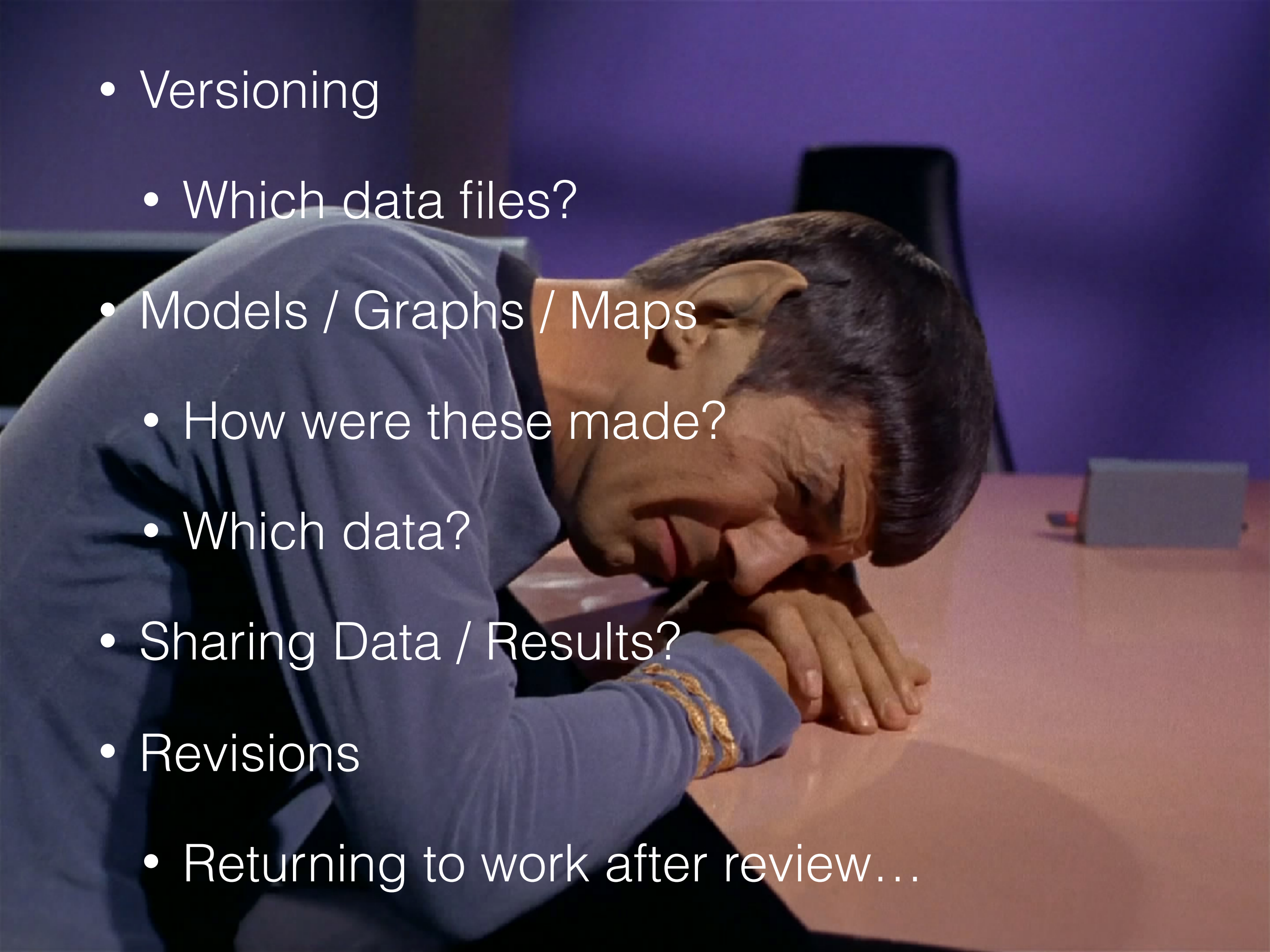
Consumer  
Data  
Research  
Centre



[www.cdrc.ac.uk](http://www.cdrc.ac.uk)  
[www.geographicdatascience.com](http://www.geographicdatascience.com)  
[www.alex-singleton.com](http://www.alex-singleton.com)  
[@alexsingleton](https://twitter.com/alexsingleton)

LIFE CHANGING  
World Shaping



- 
- A man in a blue long-sleeved shirt is leaning forward with his head resting on his hands on a light-colored desk. He appears to be tired or stressed. The background is a dark blue wall with a black office chair and a laptop on the desk.
- Versioning
    - Which data files?
  - Models / Graphs / Maps
    - How were these made?
    - Which data?
  - Sharing Data / Results?
  - Revisions
    - Returning to work after review...



Does High Public Debt Consistently Stifle Economic Growth? A Critique of Reinhart and Rogoff

Thomas Herndon, Michael Ash and Robert Pollin

April 2013

WORKINGPAPER SERIES

Number 322

POLITICAL RESEARCH

American Economic Review: Papers & Proceedings 103 (May 2013): 573-578  
http://www.aeaweb.org/articles.php?doi=10.1257/aer.100.2.573

Growth in a Time of Debt

By CARMEN M. REINHART AND KENNETH S. ROGOFF\*

In this paper, we exploit a new multi-country historical dataset on public (government) debt to search for a systemic relationship between high public debt levels, growth and inflation. Our

especially against the backdrop of graying populations and rising social insurance costs? Are sharply elevated public debts ultimately a manageable policy challenge?

Does High Public Debt Consistently Stifle Economic Growth? A Critique of Reinhart and Rogoff

Thomas Herndon\* Michael Ash Robert Pollin

April 15, 2013

JEL CODES: E60, E62, E65

Abstract

We replicate Reinhart and Rogoff (2010a and 2010b) and find that coding errors, selective exclusion of available data, and unconventional weighting of summary statistics lead to serious errors that inaccurately represent the relationship between public debt and GDP growth among 20 advanced economies in the post-war period. Our finding is that when properly calculated, the average real GDP growth rate for countries carrying a public-debt-to-GDP ratio of over 90 percent is actually 2.2 percent, not -0.1 percent as published in Reinhart and Rogoff. That is, contrary to RR, average GDP growth at public debt/GDP ratios over 90 percent is not dramatically different than when debt/GDP ratios are lower.

We also show how the relationship between public debt and GDP growth varies significantly by time period and country. Overall, the evidence we review contradicts Reinhart and Rogoff's claim to have identified an important stylized fact, that public debt loads greater than 90 percent of GDP consistently reduce GDP growth.

empirical, historical, central, armen M. 8, 2009b), y difficult s of pub- itrics, and e markets. countries ether, the servations ms, insti- arrange-

n external ervices markets, ntly more rnal debt ost exclu- icy—than lly issued ominated rnal debt d growth levels of t of GDP. We are not tal exte- ublic debt the avail- ng only in rnal debt igs nearly ebt levels

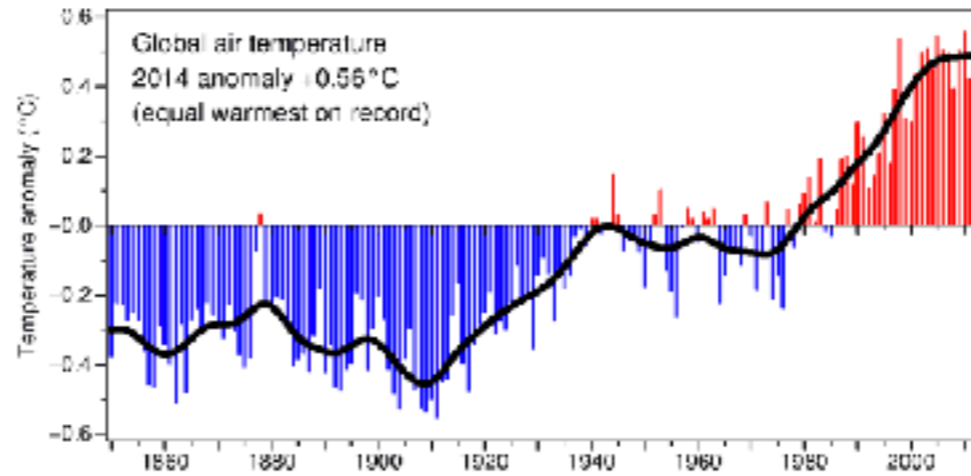
nger term ch higher tion, how- rience of ate sector



## Home

The aim of the Climatic Research Unit (CRU) is to improve scientific understanding in

- past climate history and its impact on humanity
- the course and causes of climate change during the present century
- prospects for the future



### Latest News (Read More) :

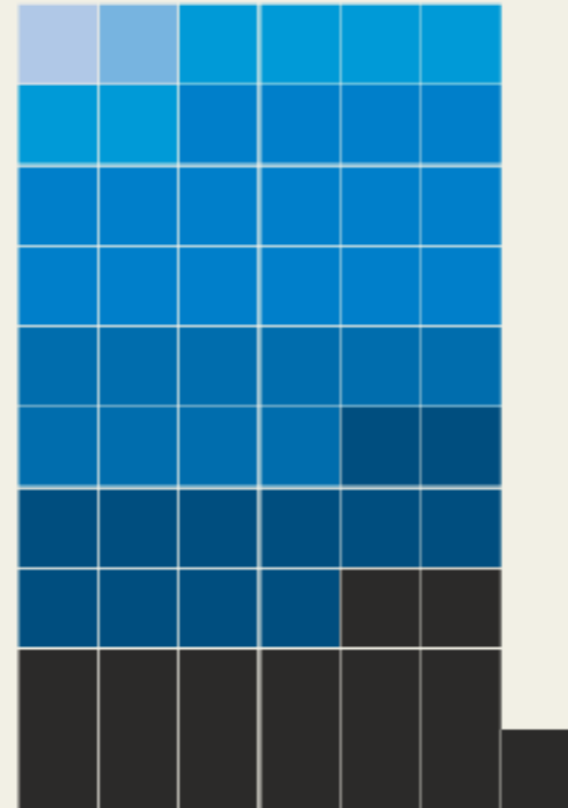
- [Winter is coming: British weather set to become more unsettled](#)
- [Avoiding overconfidence in climate projections](#)
- [Mora Lamb](#)

## RELIABILITY TEST

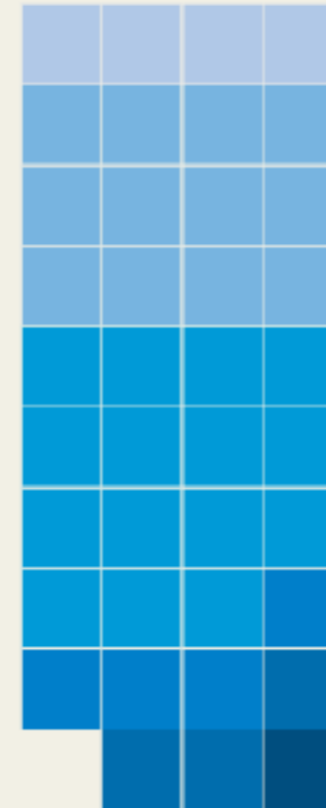
An effort to reproduce 100 psychology findings found that only 39 held up.\* But some of the 61 non-replications reported similar findings to those of their original papers.

Did replicate match original's results?

NO: 61



YES: 39



Replicator's opinion: How closely did findings resemble the original study:

- Virtually identical
- Extremely similar
- Very similar
- Moderately similar
- Somewhat similar
- Slightly similar
- Not at all similar

\* based on criteria set at the start of each study

# Reproducible Research



Data → Methods → Results → Findings / Conclusions

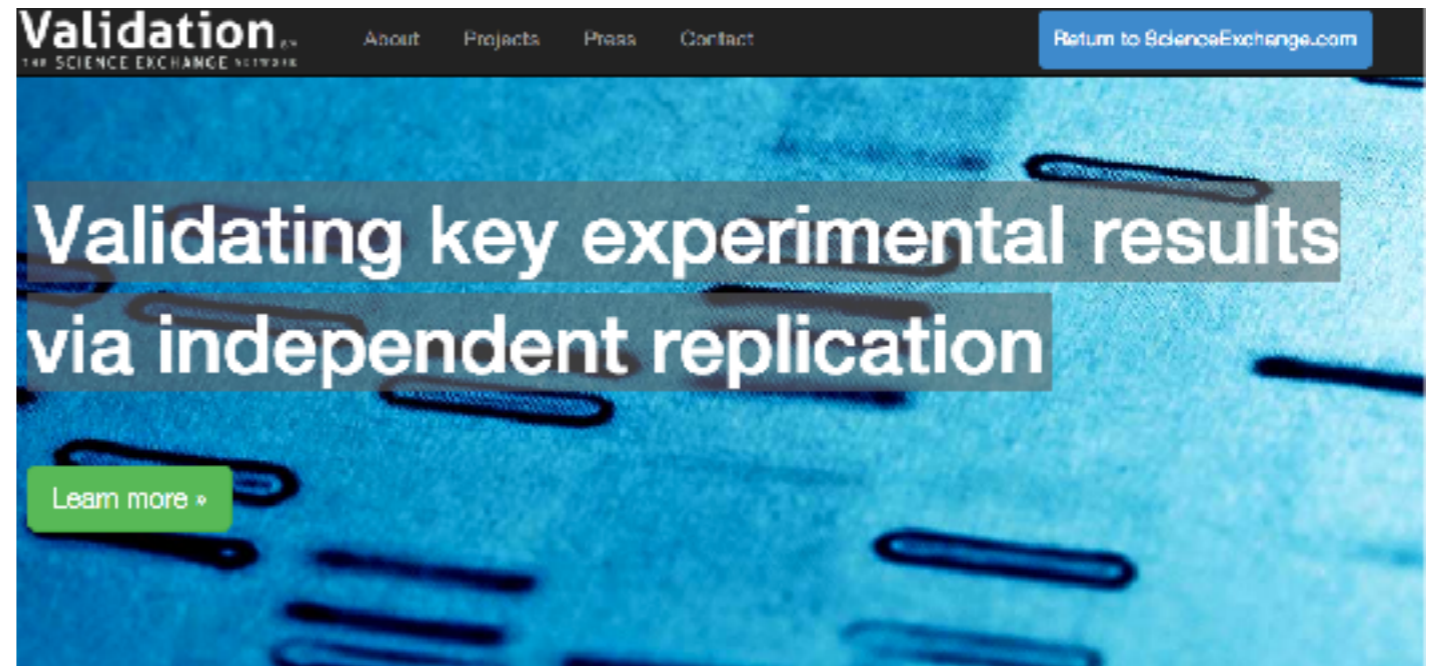
# Reproducible Research

- Help mitigate potentially erroneous conclusions
- Give public greater assurance
- Publicly funded should mean public
- It is happening already...



# Reproducible Research

Number of initiatives to test reproducible research



As seen in



## Major projects





Dato

# Showcasing innovation and excellence in open data around the world.

Join us, 3 November, BFI Southbank

A graphic for the ODI Summit 2015. The word 'SUMMIT' is written in a bold, black, sans-serif font, with each letter contained within a white shape that resembles a stylized speech bubble or a rounded square. The '2015' is written in a similar font to the right of 'SUMMIT'. The entire graphic is set against a blue background with orange circles of various sizes.

Click the banner to find out more

A graphic with the text 'WHAT IS OPEN DATA' in white, bold, sans-serif font. The text is centered over a background of colorful, overlapping geometric shapes in shades of purple, blue, green, and yellow.

## 5 reasons to come to the ODI Summit 2015

Open Data Institute



23 September 2015

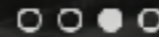
BLOG

ODI and Future Cities  
Catapult share joint vision for

# Taxis, Taxis, Everywhere

This data set contains information on the millions of trips taken by New York City's taxis on an annual basis. Records include pick-up and drop-off dates/times, pick-up and drop-off locations, trip distances, itemized fares, rate types, payment types, and driver-reported passenger counts. [Click here to view Taxi Trip Data.](#)

 View
  More Stories




[Click here for the official list of NYC datasets](#)



Business



City Government



Education



Environment



Health



Housing & Development



Public Safety



Recreation



Social Services



Transportation



NYC BigApps



## Using data intelligently – creating better knowledge for a better society



The Administrative Data Research Network is a UK-wide **partnership** between universities, government departments and agencies, national statistics authorities, the third sector, funders and researchers.

We provide a **bespoke** service for researchers so they can carry out **social and economic research** using **administrative data** – research which has the potential to **benefit society**.

**We do not hold administrative data.** We work closely with government departments to make administrative data available to researchers, but we negotiate this with them on a case-by-case basis.

Our **catalogue** gives you some information about administrative data that have been used for research in the past.



Browse the catalogue

How to apply



Tools & Help

Latest news

Upcoming courses

Twitter

# OS OPENDATA



## Get started with free digital map data

We offer a range of quality assured, regularly updated products that enable you to analyse your data, build interactive websites and create stunning visuals – and they're all free. [All we ask is an acknowledgement.](#)

OS OpenData can be combined with other open datasets available from a variety of sources. Many organisations and individuals have already done just that to create a [diverse range of innovative applications](#) – could yours be next?

## View our products



From a map of Britain, OS OpenData products take you right down to street level. They include [backdrop maps](#), [boundaries](#), [postcodes](#) and more.

[Learn more](#)

## See our maps in action



Look at maps of Great Britain using OS OpenData products; you can zoom right in to street level and see [electoral boundaries](#).

[Open viewer](#)

## Try our data



If you want to try Open Data today as either a download or DVD, please use our [online ordering portal](#).

[Order now](#)

## OS OpenSpace



# NYC RAT MAP

MARKERS

HEATMAP

DEPARTMENT OF  
ENVIRONMENTAL PROTECTION  
(DEP)

Rat Sightings

From 3/23/2015 to present. This  
information is automatically updated  
daily.

Zoom and click markers to explore.

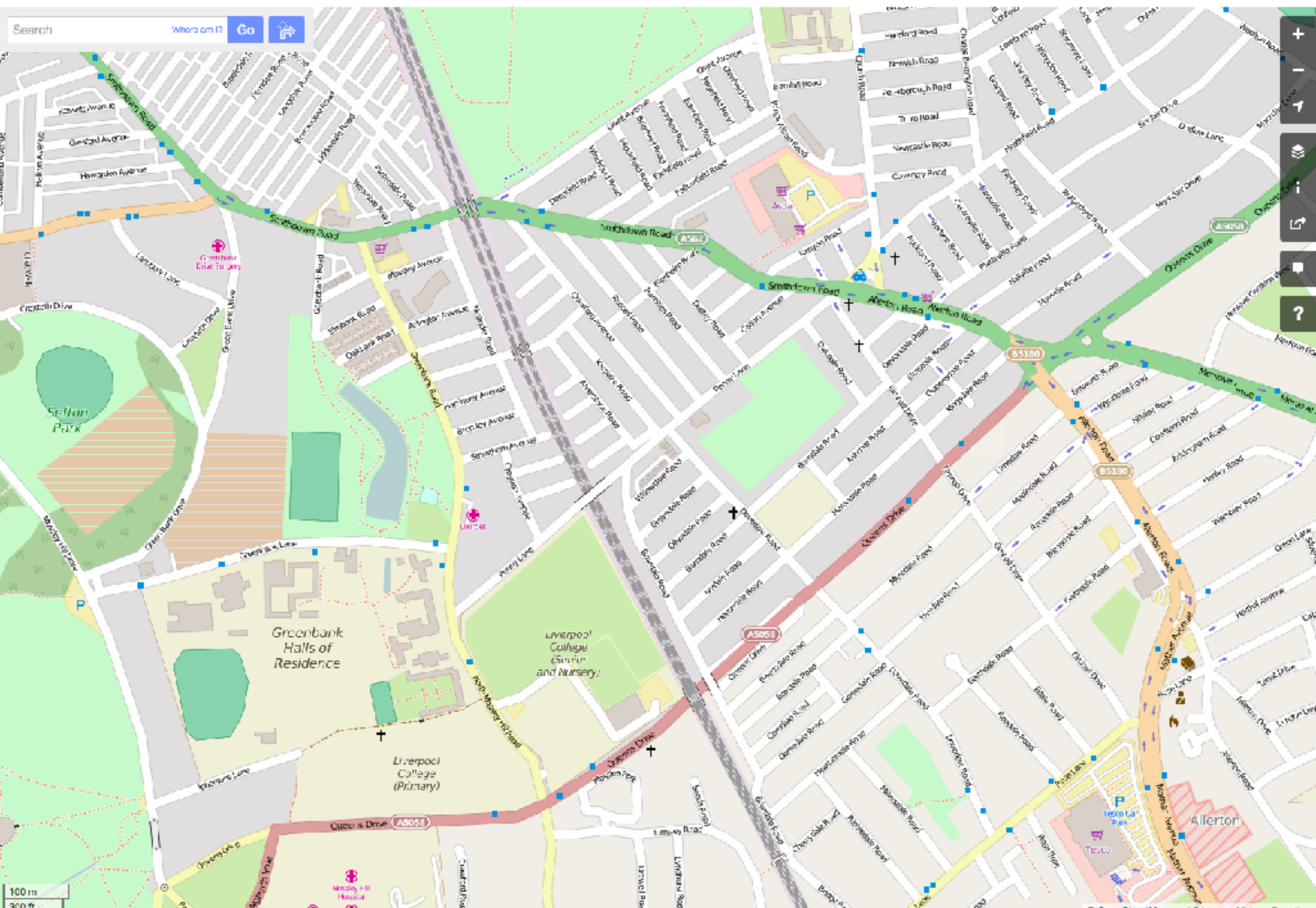


<http://meredithmmyers.com/ratmap/#/>

An open source project.

Created by @meredithmmyers, 2014.

Leaflet | Map data © OpenStreetMap contributors, Imagery © Mapbox





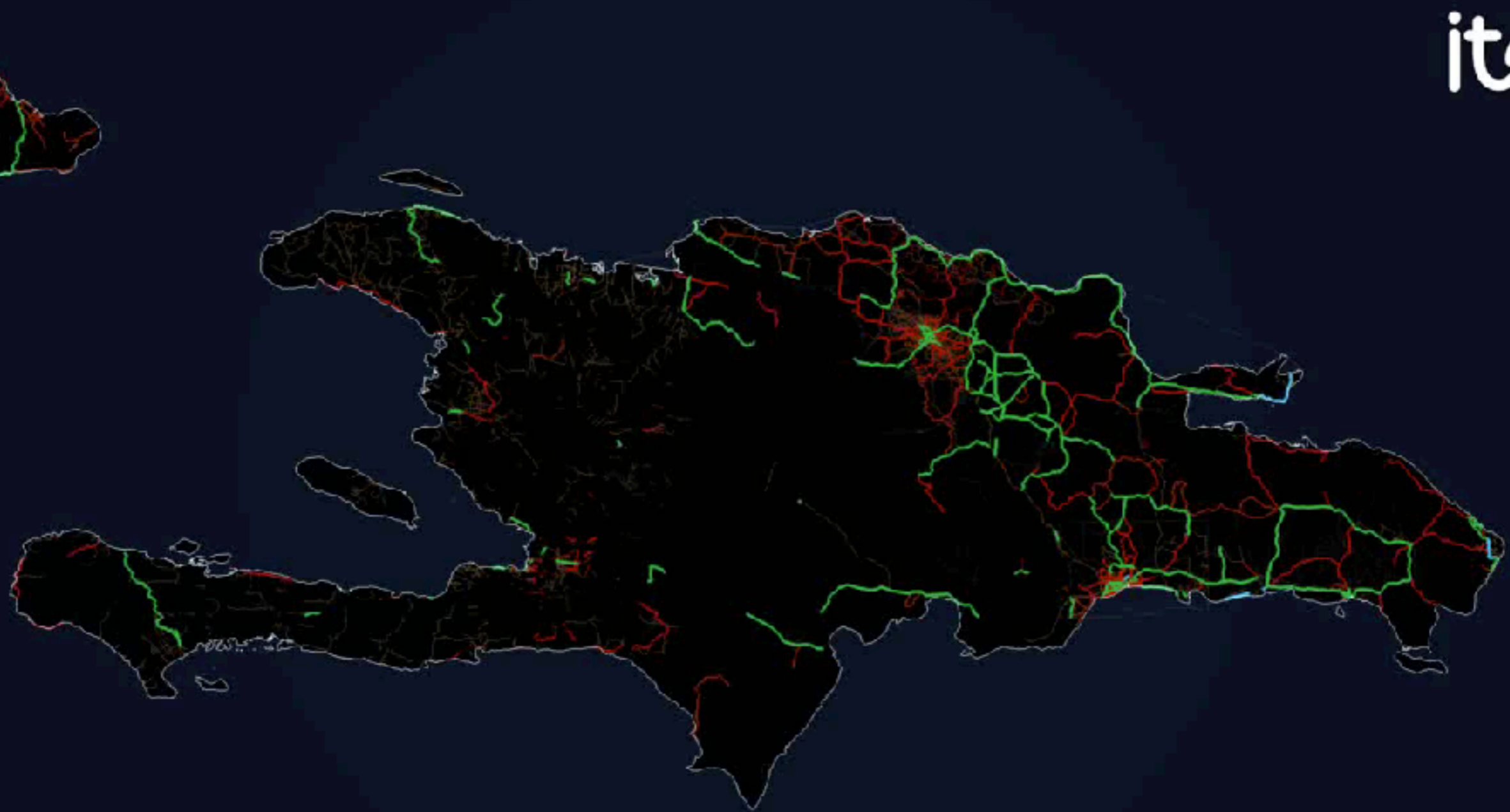
Search



Map navigation controls including zoom in (+), zoom out (-), home (house icon), full screen (square icon), and help (?).

<https://www.openstreetmap.org/#map=19/53.38631/-2.91964>

10 m  
50 m



9 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24 25 January 2010

OpenStreetMap  
CC-by-SA www.itoworld.com  
Map data www.openstreetmap.org 31 Jan 2010



You are encouraged to use and re-use the information that is available under this licence freely and flexibly, with only a few conditions.




## Using Information under this licence

Use of copyright and database right material expressly made available under this licence (the 'Information') indicates your acceptance of the terms and conditions below.


The Licensor grants you a worldwide, royalty-free, perpetual, non-exclusive licence to use the Information subject to the conditions below.

This licence does not affect your freedom under fair dealing or fair use or any other copyright or database right exceptions and limitations.

### You are free to:

-  copy, publish, distribute and transmit the Information;
-  adapt the Information;
-  exploit the Information commercially and non-commercially for example, by combining it with other Information, or by including it in your own product or application.

### You must (where you do any of the above):

-  acknowledge the source of the Information in your product or application by including or linking to any attribution statement specified by the Information Provider(s) and, where possible, provide a link to this licence;

If the Information Provider does not provide a specific attribution statement, you must use the following:

Contains public sector information licensed under the Open Government Licence v3.0.

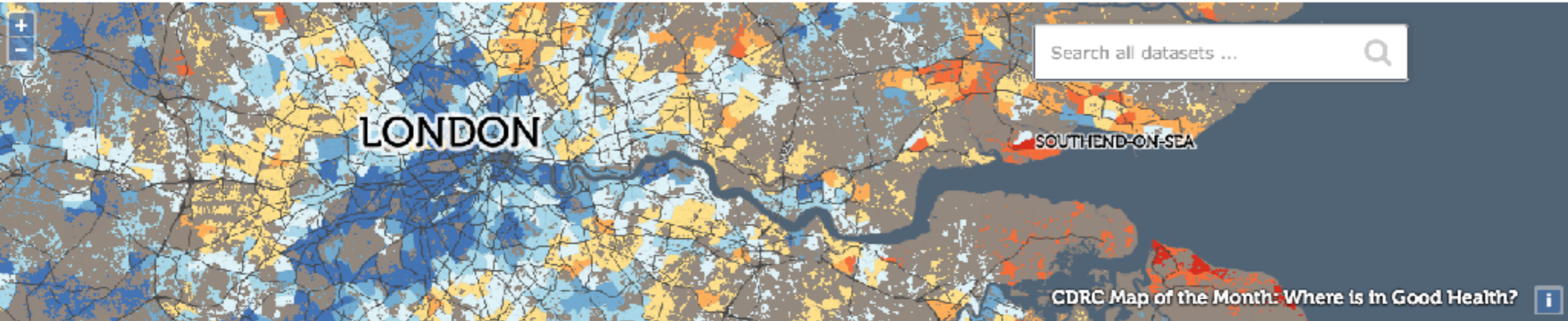
If you are using Information from several Information Providers and listing multiple attributions is not practical in your product or application, you may include a URL or hyperlink to a resource that contains the required attribution statements.

These are important conditions of this licence and if you fail to comply with them the rights granted to you under this licence, or any similar licence granted by the Licensor, will end automatically.

## Exemptions

This licence does not cover:

- personal data in the Information;
- Information that has not been accessed by way of publication or disclosure under information access legislation (including the Freedom of Information Act for the UK and Scotland) or with the consent of the Information Provider.



### CDRC Data statistics

**11** topics  
**30** products  
**27.6GB** data  
**3.9k** downloaded

## Welcome to CDRC Data

We are an academic led, multi-institution laboratory which discovers, mines, analyses and synthesises consumer-related datasets from around the UK. The CDRC is an ESRC Data Investment.



## Popular Datasets

### CDRC 2011 Census Data Packs for Local Authority District: Liverpool (E08000012) [Open](#) 🔥

This census data pack provides 2011 Census estimates for the 'Key Statistic' and 'Quick Statistic' tables within the Local Authority District: Liverpool (E08000012) at the...

[ZIP](#)

### CDRC 2015 OS Geodata Pack - Liverpool (E08000012) [Open](#) 🔥

This CDRC 2015 OS Geodata Pack provides Ordnance Survey Open Map Shapefiles for the Local Authority District: Liverpool (E08000012) Contents: RoadTunnel...

[ZIP](#)

### CDRC Maps Retail Centre Locations [Open](#) 🔥

These data represent the retail centre centroids used on the CDRC Maps website. They were created as centroid locations taken from those definitions of retail cores defined as...

[ZIP](#)

# Methods

```
23
24 var requestUrl = app.baseUrl + "/w/api.php";
25 $.ajax({
26   type: 'GET',
27   url: requestUrl,
28   data: {
29     action: 'opensearch',
30     search: term,
31     format: 'json'
32   },
33   success: function(data) {
34     renderResults(data);
35   }
36 });
37 } else {
38   chrome.showNoConnectionMessage();
39   chrome.showContent();
40 }
41
42
43
44
45
46
47
48
49
50
51
52
53
54
55
56
57
58
59
60
61
62
63
64
65
66
67
68
69
70
71
72
73
74
75
76
77
78
79
80
81
82
83
84
85
86
87
88
89
90
91
92
93
94
95
96
97
98
99
100
101
102
103
104
```

```
<script type="text/html" id="search-results-template">
  {{/pages}}
  <div class="listItemContainer" data-page-url="{{(key)}}" data-page-title="{{(title)}}">
    <a class="listItem searchItem">
      <span class="iconSearchResult"></span>
      <span class="text deleteable">{{(title)}}</span>
    </a>
  </div>
  {{/pages}}
  {{/pages}}
  <div class="listItemContainer">
    <a class="listItem searchItem">
      <span class="iconSearchResult"></span>
      <span class="text deleteable">40 results found</span>
    </a>
  </div>
  {{/pages}}
  <div class="listItemContainer classSearch">
```



# The R Project for Statistical Computing

```
[Home]
R Console
[Mac OS X dock icons: stop, R, bar chart, lock, R logo, color wheel, document, printer]
[Search bar: Help Search]
[User: alex]
[ms]

R version 3.2.1 (2015-06-18) -- "World-Famous Astronaut"
Copyright (C) 2015 The R Foundation for Statistical Computing
Platform: x86_64-apple-darwin13.4.0 (64-bit)

R is free software and comes with ABSOLUTELY NO WARRANTY.
You are welcome to redistribute it under certain conditions.
Type 'license()' or 'licence()' for distribution details.

  Natural language support but running in an English locale

R is a collaborative project with many contributors.
Type 'contributors()' for more information and
'citation()' on how to cite R or R packages in publications.

Type 'demo()' for some demos, 'help()' for on-line help, or
'help.start()' for an HTML browser interface to help.
Type 'q()' to quit R.

[R.app GUI 1.66 (6356) x86_64-apple-darwin13.4.0]
[History restored from /Users/alex/.Rapp.history]
>
```

[Other](#)

**Links**

[Bioconductor](#)

[Related Projects](#)





# as a GIS

```
breaks <- classIntervals(variable_to_map, n = 6,  
style = "fisher")
```

```
[1] 6 5 4 3 3 3 5 4 3 3 3 3 3 4 3 3 3 3 3 3 3 3 5 3 3 3 3 2 3 3 3  
[36] 3 3 3 4 4 4 4 4 3 3 4 3 2 1 3 1 3 3 3 3 3 4 3 3 3 3 3 3 4 4 3 3  
[71] 3 3 4 3 3 4 4 3 3 3 3 3 3 3 3 3 2 2 3 2 1 3 3 3 3 4 3 3 3 3 3 3  
[106] 3 3 3 3 3 3 2 3 3 3 3 3 4 3 3 3 3 5 3 3 4 2 3 4 5 2 3 4 3 4 3 4 6 6  
[141] 4 3 3 4 4 3 3 3 4 3 3 4 2 4 4 3 3 4 4 3 3 4 4 4 3 4 2 4 4 3 3 3 3 5 3  
[176] 3 4 3 3 3 3 3 3 4 4 4 3 3 3 3 3 3 2 3 3 3 4 3 3 3 3 3 3 3 4 3 3 3 5  
[211] 4 3 3 2 3 4 2 3 4 3 3 3 4 3 3 3 3 3 3 2 3 3 5 3 4 3 6 3 1 2 6 2 3 3 3  
[246] 4 3 3 2 4 3 4 3 3 3 3 4 3 3 2 3 3 3 3 3 4 2 3 3 3 4 3 3 3 4 4 3 4 3 3  
[281] 3 3 4 3 3 3 3 3 4 2 3
```





# as a GIS

```
my_colours <- c("#FFFFB2", "#FED976", "#FEB24C",  
"#FD8D3C", "#F03B20", "#BD0026")
```



# as a GIS

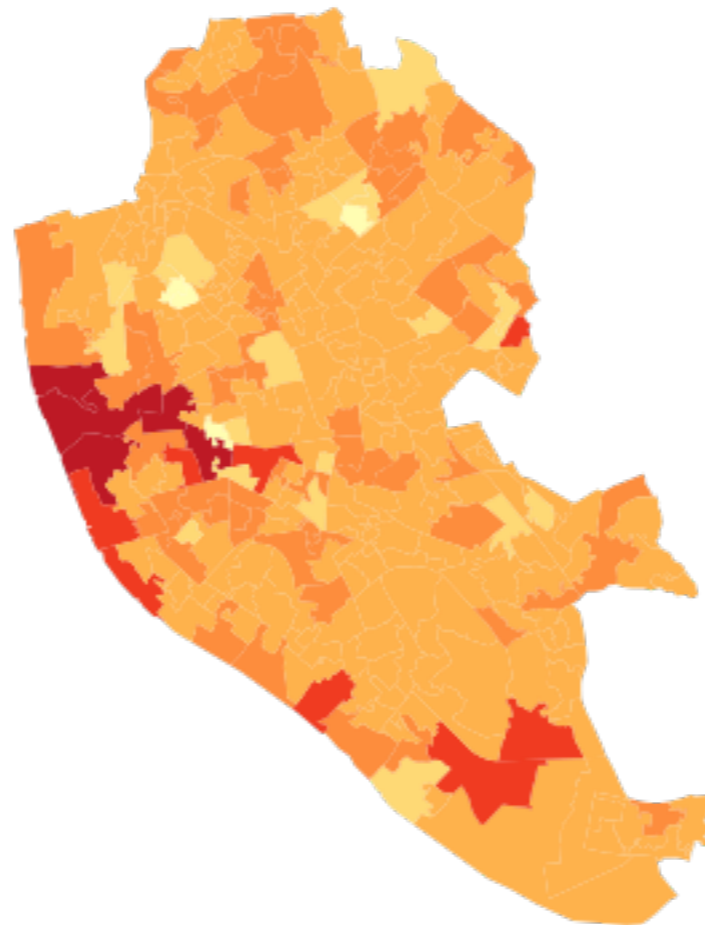
```
my_colours[findInterval(variable_to_map, breaks)]
```

```
[1] "#BD0026" "#F03B20" "#FD8D3C" "#FEB24C" "#FEB24C" "#FEB24C" "#F03B20"
[8] "#FD8D3C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FD8D3C"
[15] "#FEB24C" "#FEB24C" "#FEB24C" "#FD8D3C" "#FEB24C" "#FEB24C" "#FEB24C"
[22] "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#F03B20" "#FEB24C"
[29] "#FEB24C" "#FEB24C" "#FEB24C" "#FED976" "#FEB24C" "#FEB24C" "#FEB24C"
[36] "#FEB24C" "#FEB24C" "#FEB24C" "#FD8D3C" "#FD8D3C" "#FD8D3C" "#FD8D3C"
[43] "#FD8D3C" "#FEB24C" "#FEB24C" "#FD8D3C" "#FEB24C" "#FED976" "#FFFFB2"
[50] "#FEB24C" "#FFFFB2" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C"
[57] "#FEB24C" "#FD8D3C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C"
[64] "#FEB24C" "#FEB24C" "#FEB24C" "#FD8D3C" "#FD8D3C" "#FEB24C" "#FEB24C"
[71] "#FEB24C" "#FEB24C" "#FD8D3C" "#FEB24C" "#FEB24C" "#FD8D3C" "#FD8D3C"
[78] "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C"
[85] "#FEB24C" "#FEB24C" "#FEB24C" "#FED976" "#FED976" "#FEB24C" "#FED976"
[92] "#FFFFB2" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FD8D3C" "#FEB24C"
[99] "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C"
[106] "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FED976"
[113] "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FD8D3C" "#FEB24C"
[120] "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#F03B20" "#FEB24C" "#FEB24C"
[127] "#FD8D3C" "#FED976" "#FEB24C" "#FD8D3C" "#F03B20" "#FED976" "#FEB24C"
[134] "#FD8D3C" "#FEB24C" "#FD8D3C" "#FEB24C" "#FD8D3C" "#BD0026" "#BD0026"
[141] "#FD8D3C" "#FEB24C" "#FEB24C" "#FD8D3C" "#FD8D3C" "#FEB24C" "#FEB24C" "#FEB24C"
[148] "#FEB24C" "#FD8D3C" "#FEB24C" "#FEB24C" "#FEB24C" "#FD8D3C" "#FED976" "#FD8D3C"
[155] "#FD8D3C" "#FEB24C" "#FEB24C" "#FD8D3C" "#FD8D3C" "#FEB24C" "#FEB24C"
[162] "#FD8D3C" "#FD8D3C" "#FD8D3C" "#FEB24C" "#FD8D3C" "#FED976" "#FD8D3C"
[169] "#FD8D3C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#F03B20" "#FEB24C"
[176] "#FEB24C" "#FD8D3C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C"
[183] "#FEB24C" "#FD8D3C" "#FD8D3C" "#FD8D3C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C"
[190] "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FED976" "#FEB24C" "#FEB24C"
[197] "#FEB24C" "#FD8D3C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C"
[204] "#FEB24C" "#FEB24C" "#FD8D3C" "#FEB24C" "#FEB24C" "#FEB24C" "#F03B20"
[211] "#FD8D3C" "#FEB24C" "#FEB24C" "#FED976" "#FEB24C" "#FD8D3C" "#FED976"
[218] "#FEB24C" "#FD8D3C" "#FEB24C" "#FEB24C" "#FEB24C" "#FD8D3C" "#FEB24C"
[225] "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FED976" "#FEB24C"
[232] "#FEB24C" "#F03B20" "#FEB24C" "#FD8D3C" "#FEB24C" "#FEB24C" "#BD0026" "#FEB24C"
[239] "#FFFFB2" "#FED976" "#BD0026" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C"
[246] "#FD8D3C" "#FEB24C" "#FEB24C" "#FED976" "#FD8D3C" "#FEB24C" "#FD8D3C"
[253] "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FD8D3C" "#FEB24C" "#FEB24C"
[260] "#FED976" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FD8D3C"
[267] "#FED976" "#FEB24C" "#FEB24C" "#FEB24C" "#FD8D3C" "#FEB24C" "#FEB24C"
[274] "#FEB24C" "#FD8D3C" "#FD8D3C" "#FEB24C" "#FD8D3C" "#FEB24C" "#FEB24C" "#FEB24C"
[281] "#FEB24C" "#FEB24C" "#FD8D3C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C" "#FEB24C"
[288] "#FEB24C" "#FD8D3C" "#FED976" "#FEB24C"
```

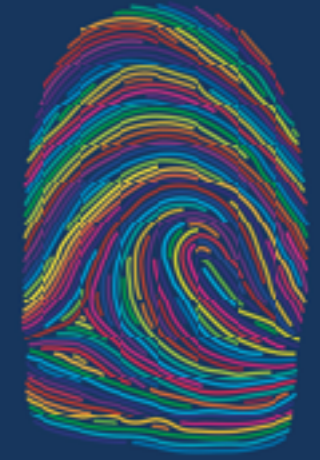


# as a GIS

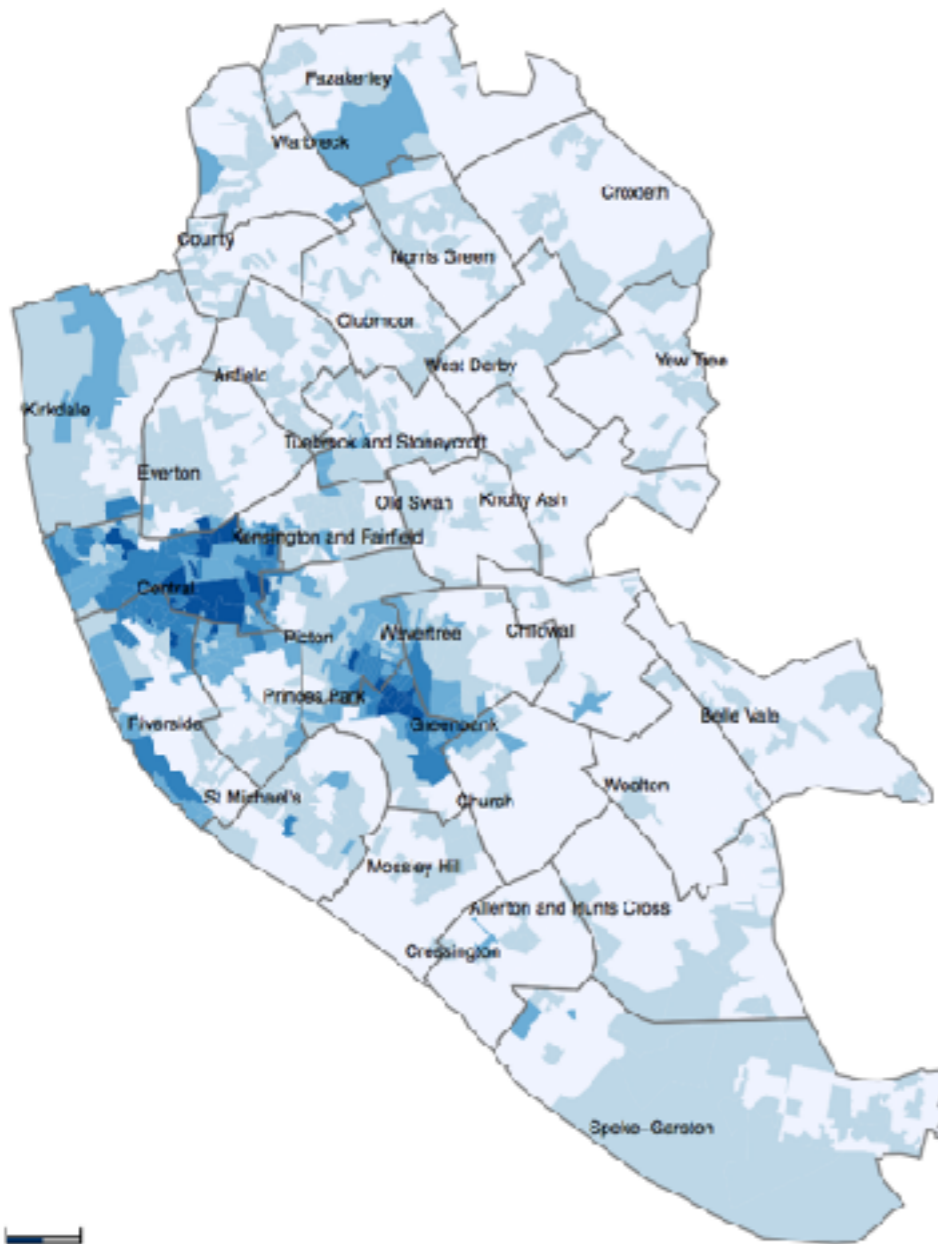
```
plot(LSOA, col = my_colours[findInterval(variable_to_map,  
breaks)], axes = FALSE, border = NA)
```



# 2011 Census Open Atlas

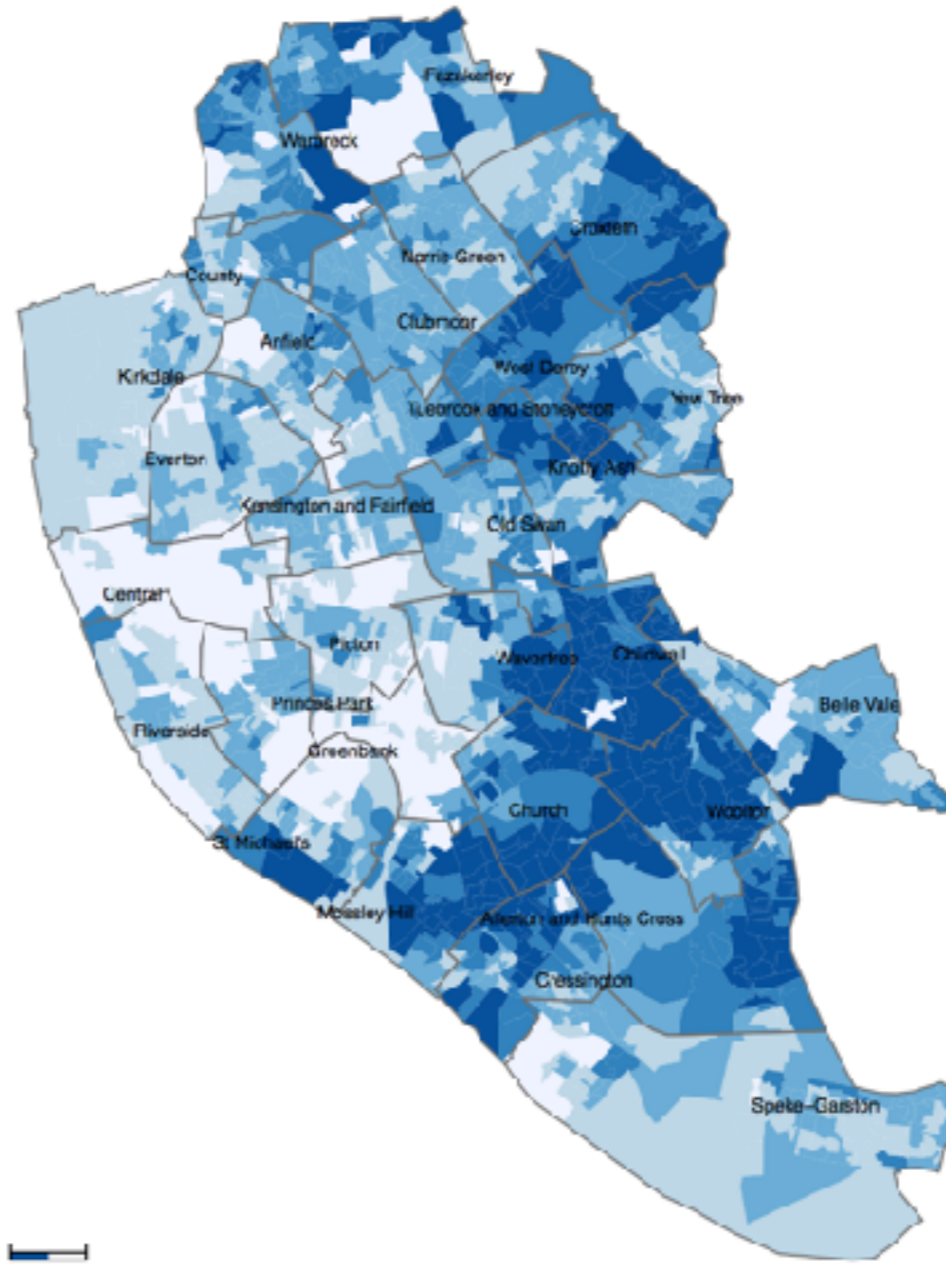


UNIVERSITY OF LIVERPOOL  
 Alex Singleton (www.alex-singleton.com) Version 2.1



Percentage  
 under 7.7  
 7.7 to 15  
 15 to 28.7  
 28.7 to 46.8  
 over 46.8

Figure 15: Age structure (Age 20 to 24)

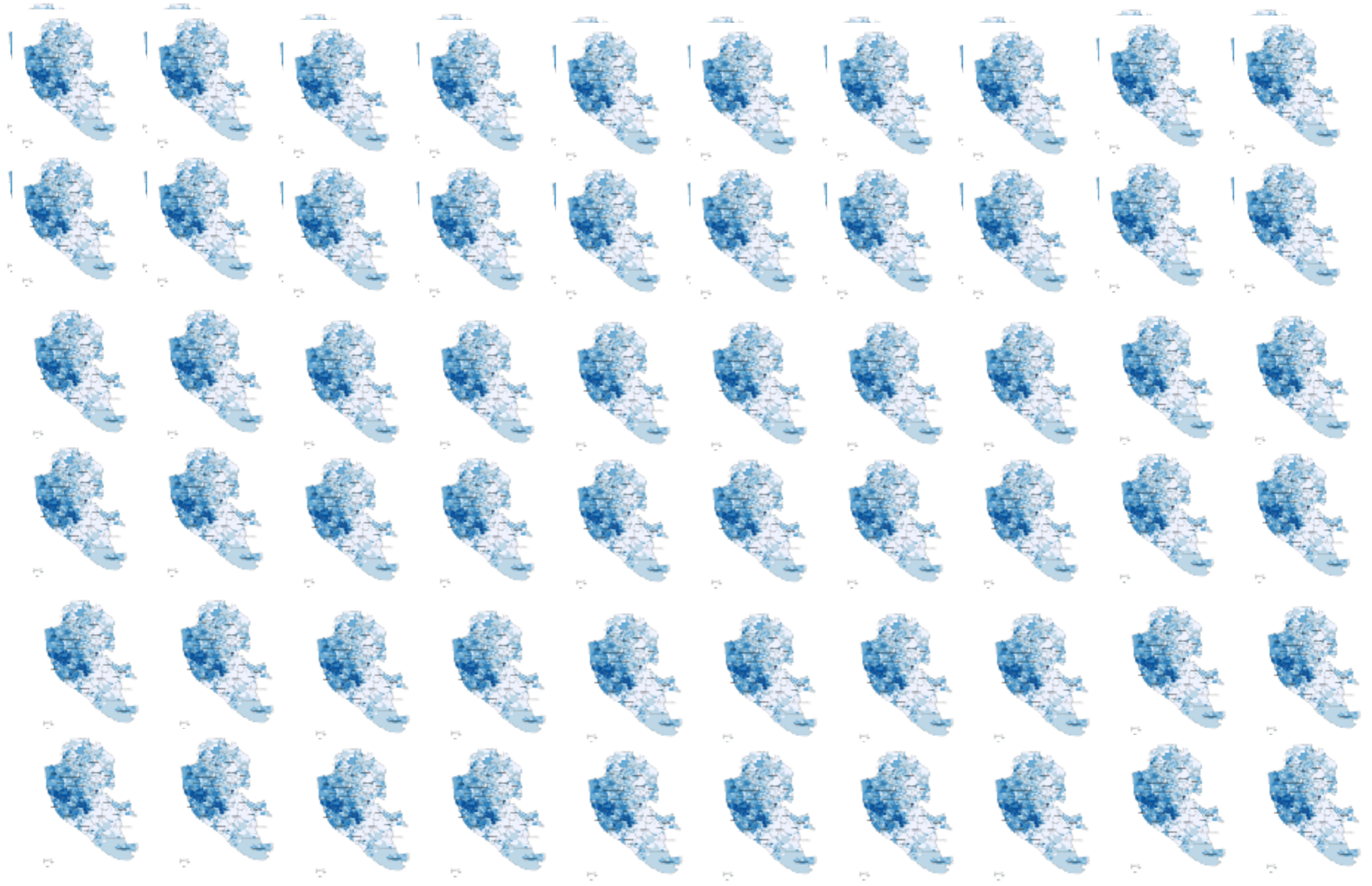


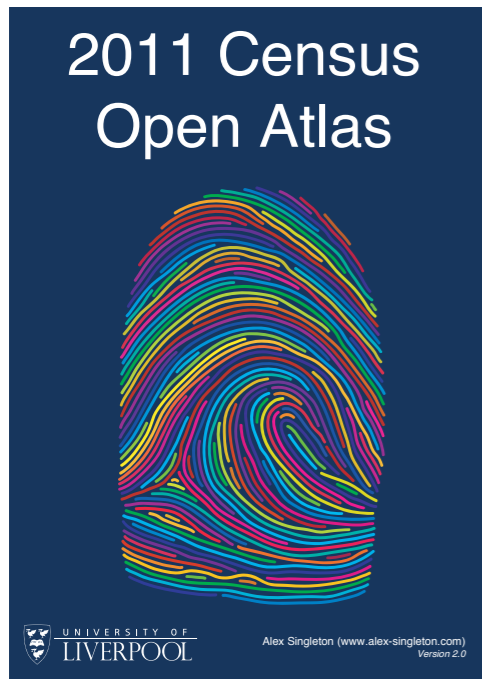
Percentage  
 under 17.1  
 17.1 to 27.7  
 27.7 to 36.2  
 36.2 to 50.3  
 over 50.3

Figure 25: Marital and civil partnership status (Married)

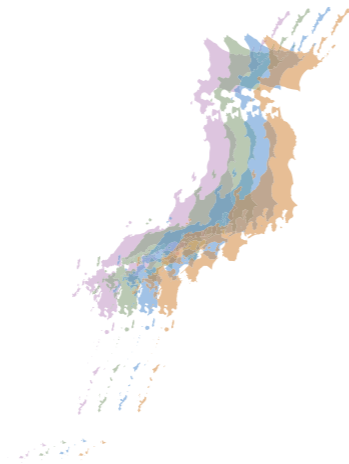


UNIVERSITY OF  
**LIVERPOOL**





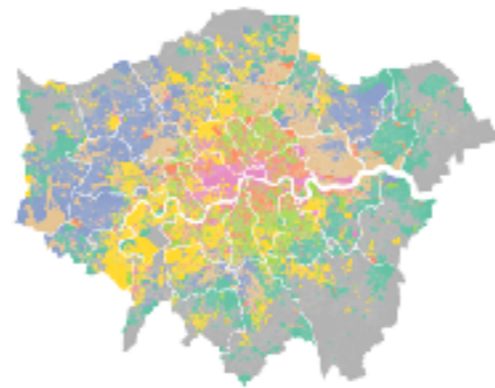
2010 Census of Japan Open Atlas



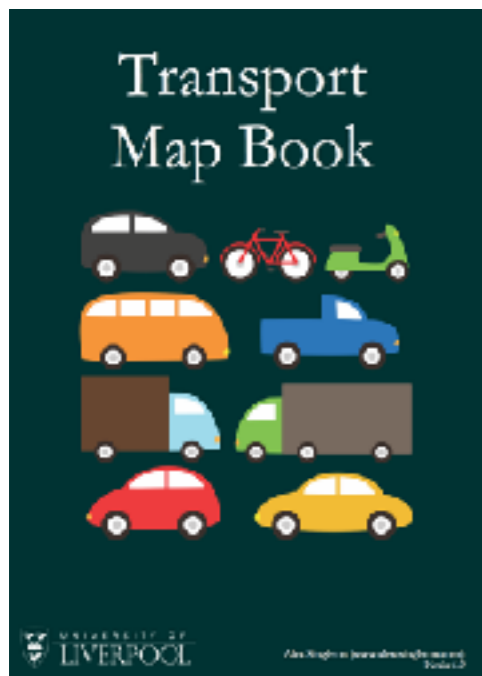
Alex Singleton (www.alex-singleton.com)  
Chris Brunsdon, Tomoki Nakaya, Keiji Yano  
Version 1.0



London Output Area Classification



Paul Longley  
Alex Singleton



theguardian

News Sport Comment Culture Business Money Life & style Travel Environment

News > Show and Tell

## DATA STORE SHOW AND TELL

In association with Google™

Previous Blog home Next

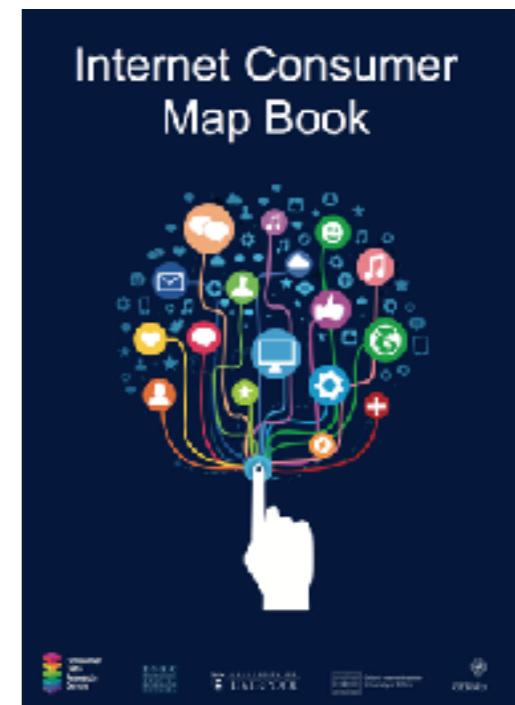
### Mapping the census: how one man produced a library for all

Alex Singleton downloaded every single census dataset for every local authority in England - and then produced a free library of downloadable PDFs. Find out what he did

[More data journalism and data visualisations from the Guardian](#)

Share 0  
Tweet 1  
+1 4  
Print  
in Share 0  
Email

Posted by Simon Rogers  
Friday 8 February 2013 07:30 GMT  
theguardian.com  
[Jump to comments \(2\)](#)





Atlassian  
**Bitbucket**



This repository ▾

Search or type a command



Explore Gist Blog Help



alexsingleton + ▾



PUBLIC



alexsingleton / Open-Atlas

Unwatch ▾ 1

★ Star 0

Fork 0

### Description

Short description of this repository

### Website

Website for this repository (optional)

Save or cancel

3 commits

2 branches

0 releases

1 contributor



branch: master ▾

Open-Atlas / +

minor change



alexsingleton authored 3 days ago

latest commit b78e3d93bb

Code

Minor changes

3 days ago

atlas

Initial Commit

3 days ago

README.md

minor change

3 days ago

README.md

# 2011 Census Open Atlas

## Aim

The code contained in this repository was used to create version two of the [England and Wales 2011 Open](#)

### Code

Issues 0

Pull Requests 0

Wiki

Pulse

Graphs

Network

Settings

HTTPS clone URL

https://github.com

You can clone with [HTTPS](#), [SSH](#), or [Subversion](#).

Clone in Desktop

Download ZIP



# 2011 Census Open Atlas - England and Wales

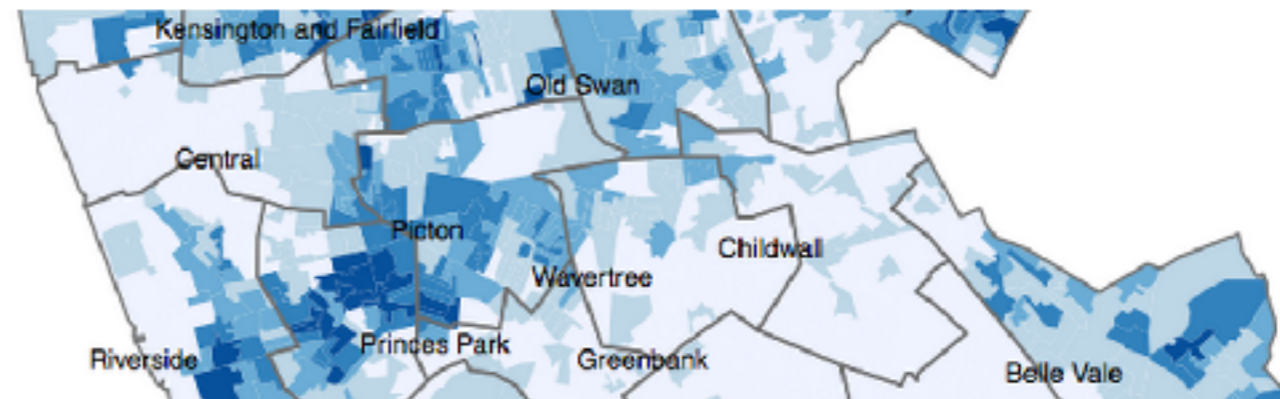
Output Area level census atlases by local authority district

[View the Project on GitHub](#)  
alexsingleton/Open-Atlas

Download  
**ZIP File**

Download  
**TAR Ball**

View On  
**GitHub**



For further details about the open atlas project see the [blog](#) post; or for the R code, click the link on the left.

## Atlas Downloads

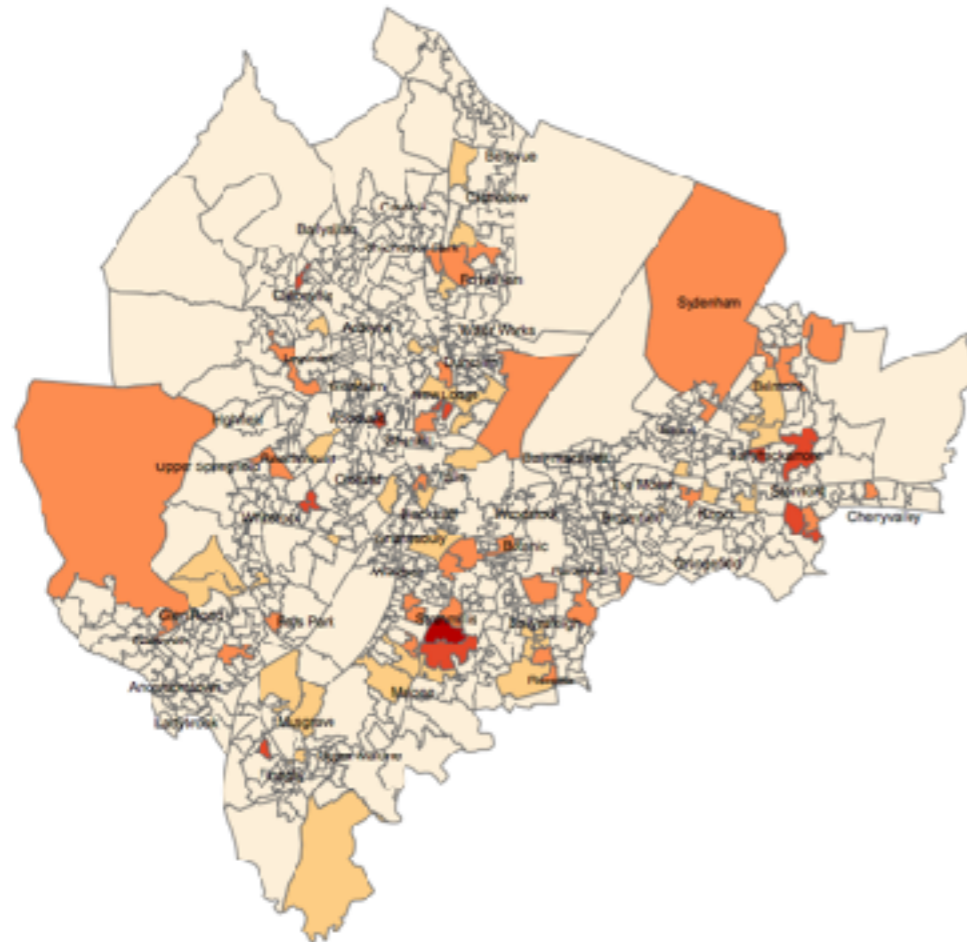
- [E07000223](#) : Adur
- [E07000026](#) : Allerdale
- [E07000032](#) : Amber Valley
- [E07000224](#) : Arun
- [E07000170](#) : Ashfield
- [E07000105](#) : Ashford
- [E07000004](#) : Aylesbury Vale
- [E07000200](#) : Babergh
- [E09000002](#) : Barking and Dagenham
- [E09000003](#) : Barnet
- [E08000016](#) : Barnsley
- [E07000027](#) : Barrow-in-Furness
- [E07000066](#) : Basildon
- [E07000084](#) : Basingstoke and Deane
- [E07000171](#) : Bassetlaw
- [E06000022](#) : Bath and North East Somerset
- [E06000055](#) : Bedford
- [E09000004](#) : Bexley
- [E08000025](#) : Birmingham

This project is maintained by [alexsingleton](#)

Hosted on GitHub Pages — Theme by [ordredlist](#)

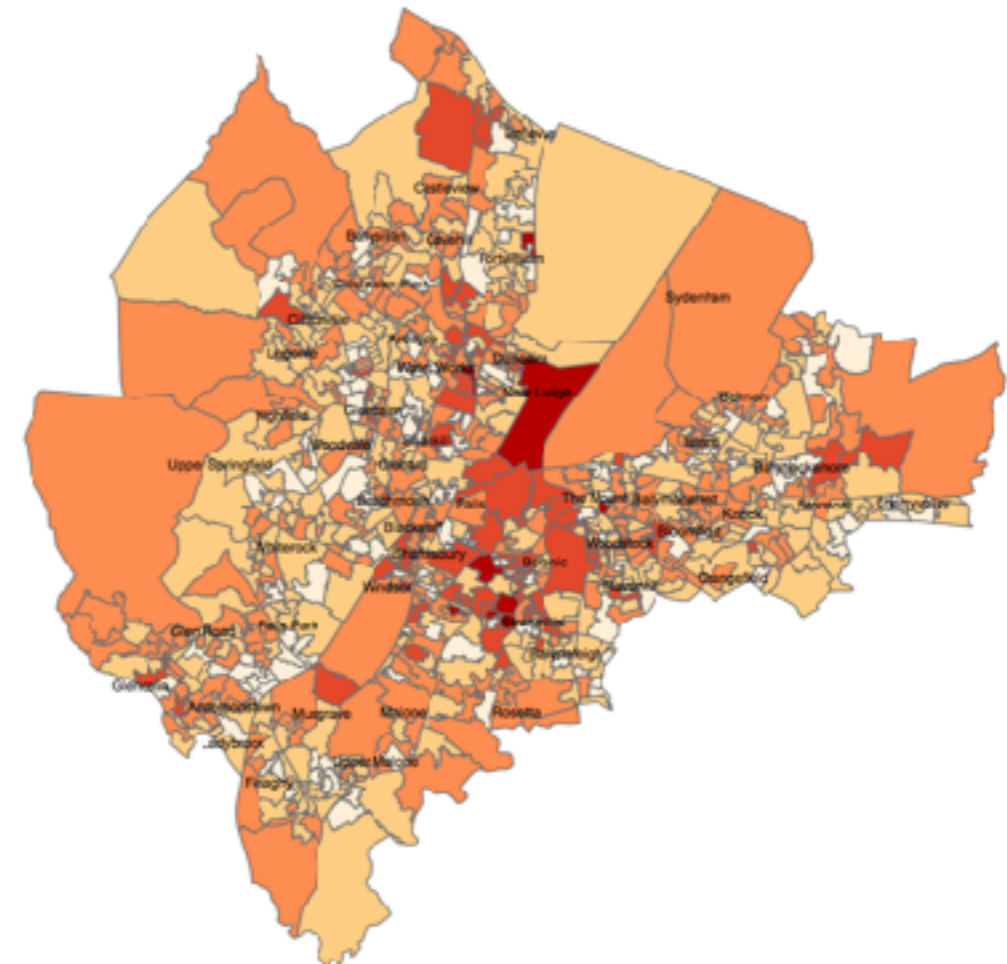
2011 Census Maps for Belfast  
 Table: KS101NI  
 Variable:KS101NI0009 (Usual residents: Lives in a communal establishment)  
 Geography:Statistical Areas

2011 Census Maps for Belfast  
 Table: KS101NI  
 Variable:KS101NI0006 (Usual residents: Males)  
 Geography:Statistical Areas



Percentage [ PERSONS ]

- under 3
- 3 to 9
- 9 to 18
- 18 to 58
- over 58



Percentage [ PERSONS ]

- under 45
- 45 to 48
- 48 to 52
- 52 to 59
- over 60

Map created by James Reid (james.reid@ed.ac.uk) derived from original code created by A. Singleton as part of Open Census Atlas (<http://www.alex-singleton.com/2011-census-open-atlas-project/>)  
 Source: NSRA - <http://www.nra.gov.uk> NSRA Digital boundaries are supplied under the Open Government License.  
 This work is licensed under a Creative Commons Attribution 3.0 Unported License.

Map created by James Reid (james.reid@ed.ac.uk) derived from original code created by A. Singleton as part of Open Census Atlas (<http://www.alex-singleton.com/2011-census-open-atlas-project/>)  
 Source: NSRA - <http://www.nra.gov.uk> NSRA Digital boundaries are supplied under the Open Government License.  
 This work is licensed under a Creative Commons Attribution 3.0 Unported License.



Results

The image shows the RStudio interface with an R Markdown document being knitted into HTML. The document content is as follows:

```

1 ---
2 title: "Untitled"
3 output: html_document
4 ---
5
6 This is an R Markdown
7 details on using R Mar
8
9 When you click the **
10 code chunks within the
11
12 ```{r}
13 summary(cars)
14 ```
15
16 You can also embed plo
17
18 ```{r, echo=FALSE}
19 plot(cars)
20 ```
21 Note that the `echo =

```

The knitted HTML output shows the following summary table:

	speed	dist
##	Min. : 4.0	Min. : 2.00
##	1st Qu.:12.0	1st Qu.: 26.00
##	Median :15.0	Median : 36.00
##	Mean :15.4	Mean : 42.98
##	3rd Qu.:19.0	3rd Qu.: 55.00
##	Max. : 25.0	Max. : 120.00

The plot shows a positive correlation between speed and distance. The x-axis is labeled 'speed' and ranges from 0 to 25. The y-axis is labeled 'dist' and ranges from 0 to 120. The data points are represented by open circles.

Note that the `echo = FALSE` parameter was added to the code chunk to prevent printing of the R code that generated the plot.

Routledge  
Taylor & Francis Group

# RSRS

Regional Studies  
Regional Science



Regional  
Studies  
Association

ISSN 1234-5678



UNIVERSITY OF  
LIVERPOOL

<http://www.tandfonline.com/loi/rsrs20>



Example

# CO<sup>2</sup> Emissions

- ~7.5 million school trips
  - 2007-2012 - Usual Travel Mode
- Data Department for Education; Department for Transport (*DVLA*)
- Suite of open source software

# CO<sub>2</sub> Emissions

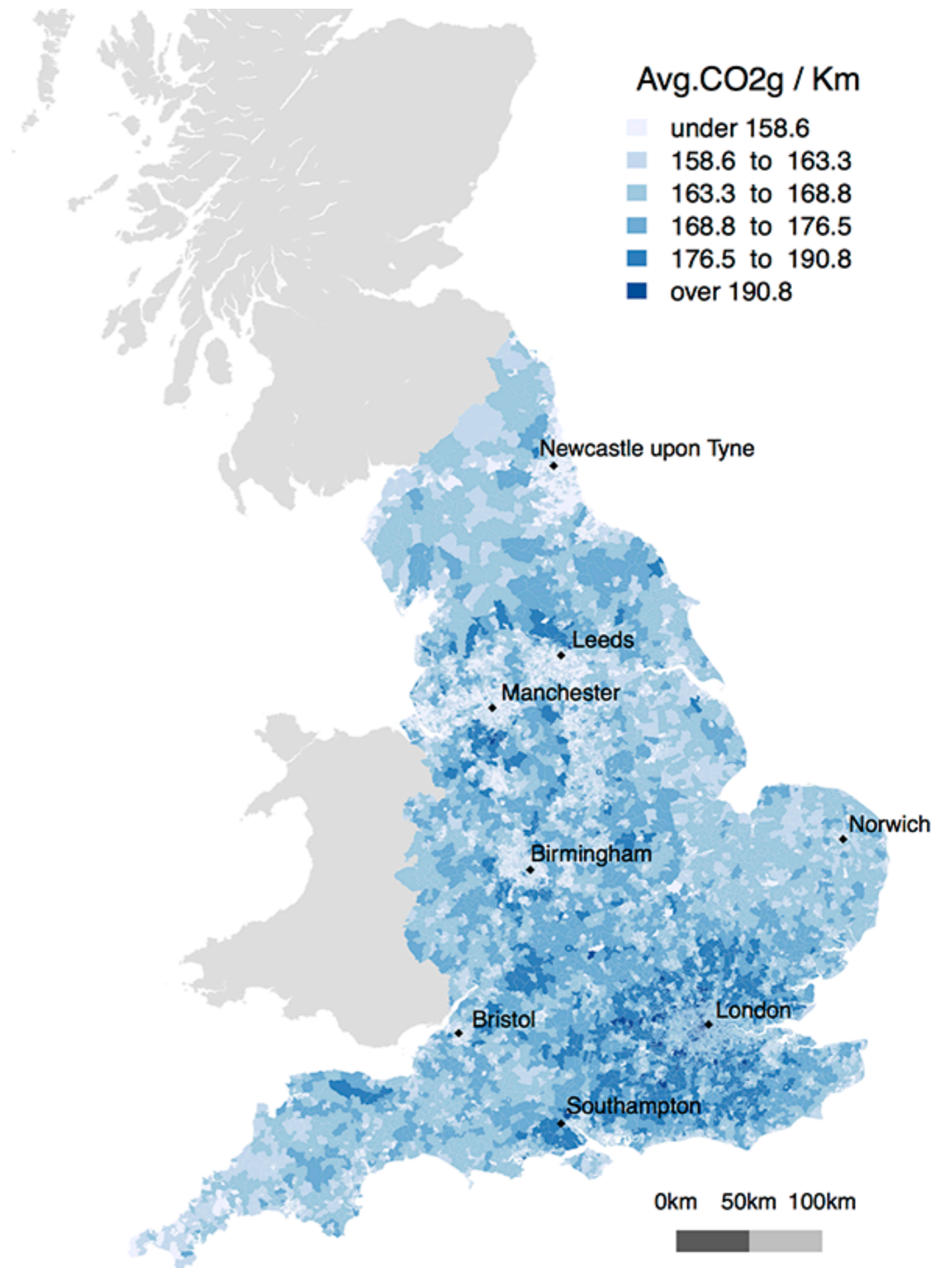
$$k_p = 2(d(i_p j_p t_p) e(t_p g_p) w(t_p))$$

- $d$  distance
- $p$  pupil
- $i$  pupil home postcode
- $j$  school postcode
- $e$  CO<sub>2</sub>g/km
- $t$  transport mode
- $g$  location

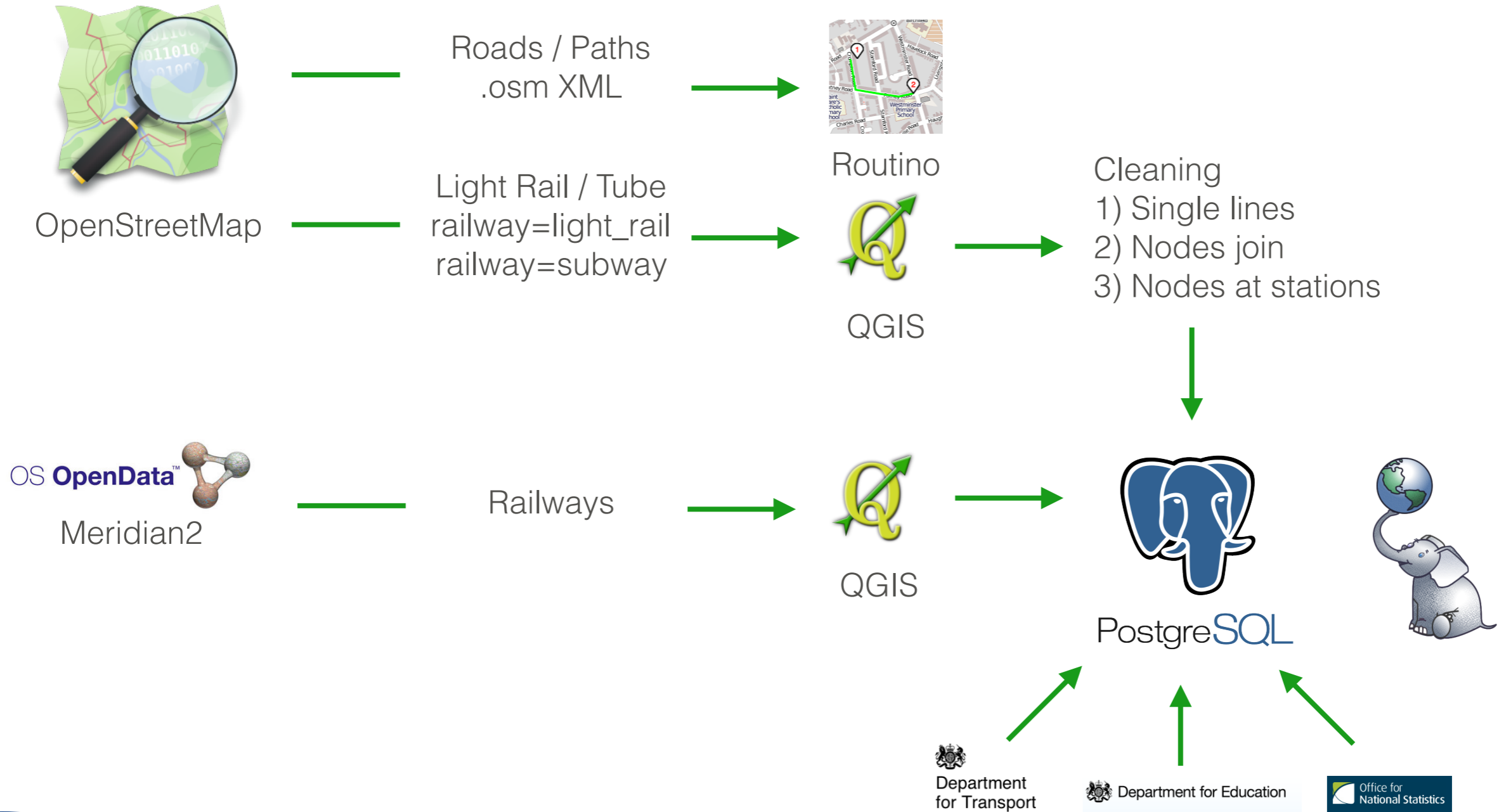




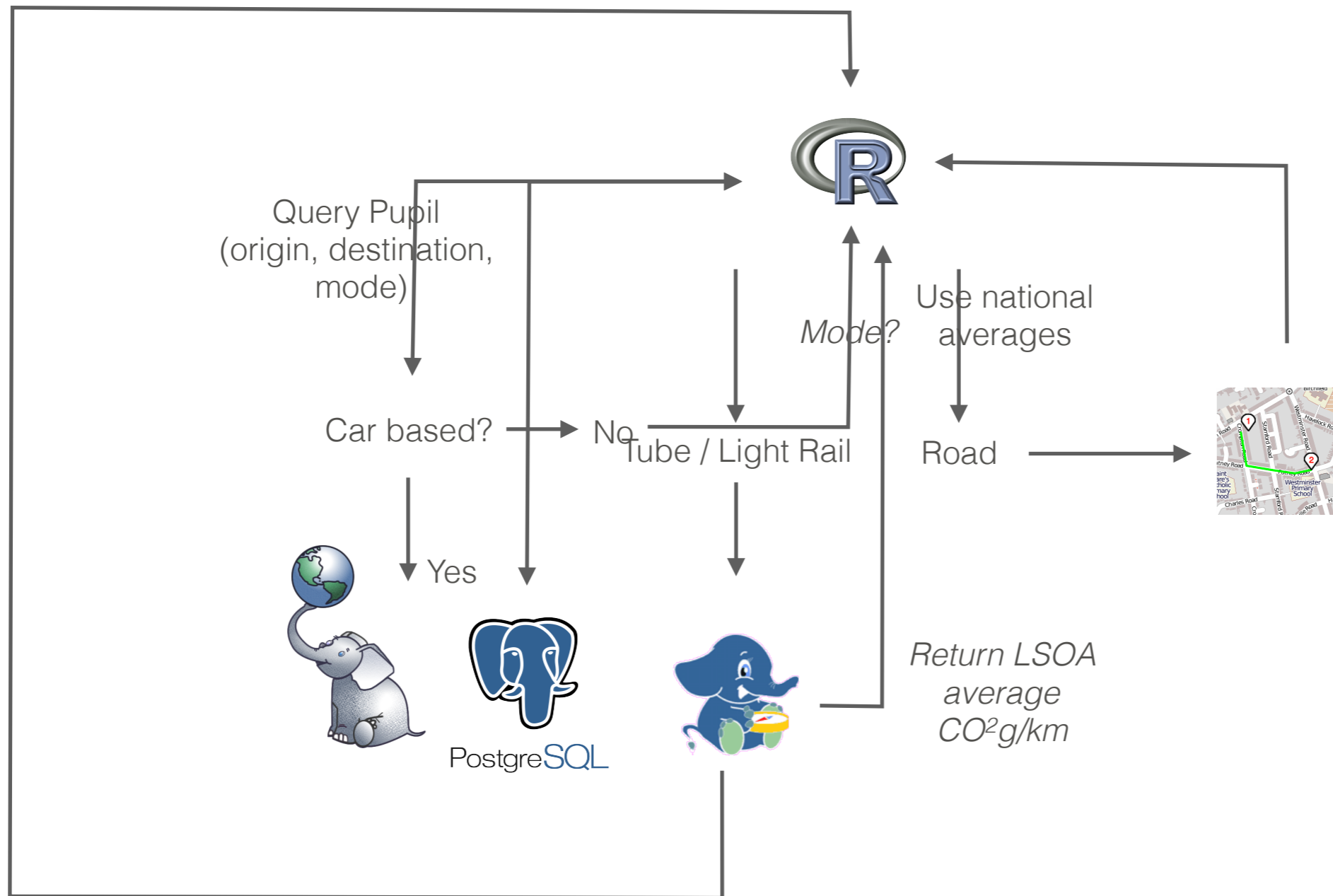
Transport Mode	Average
Taxi	150.3
Bus (London)	85.7
Bus (Non	184.3
Coach	30.0
Light Rail -	71
London (DLR)	68.3
Birmingham /	70.5
Newcastle	103.0
Croydon	44.3
Manchester	39.5
Nottingham	#
Sheffield	96.8
National Rail	53.4
London	73.1
Cycling	8.3
Walking	11.4

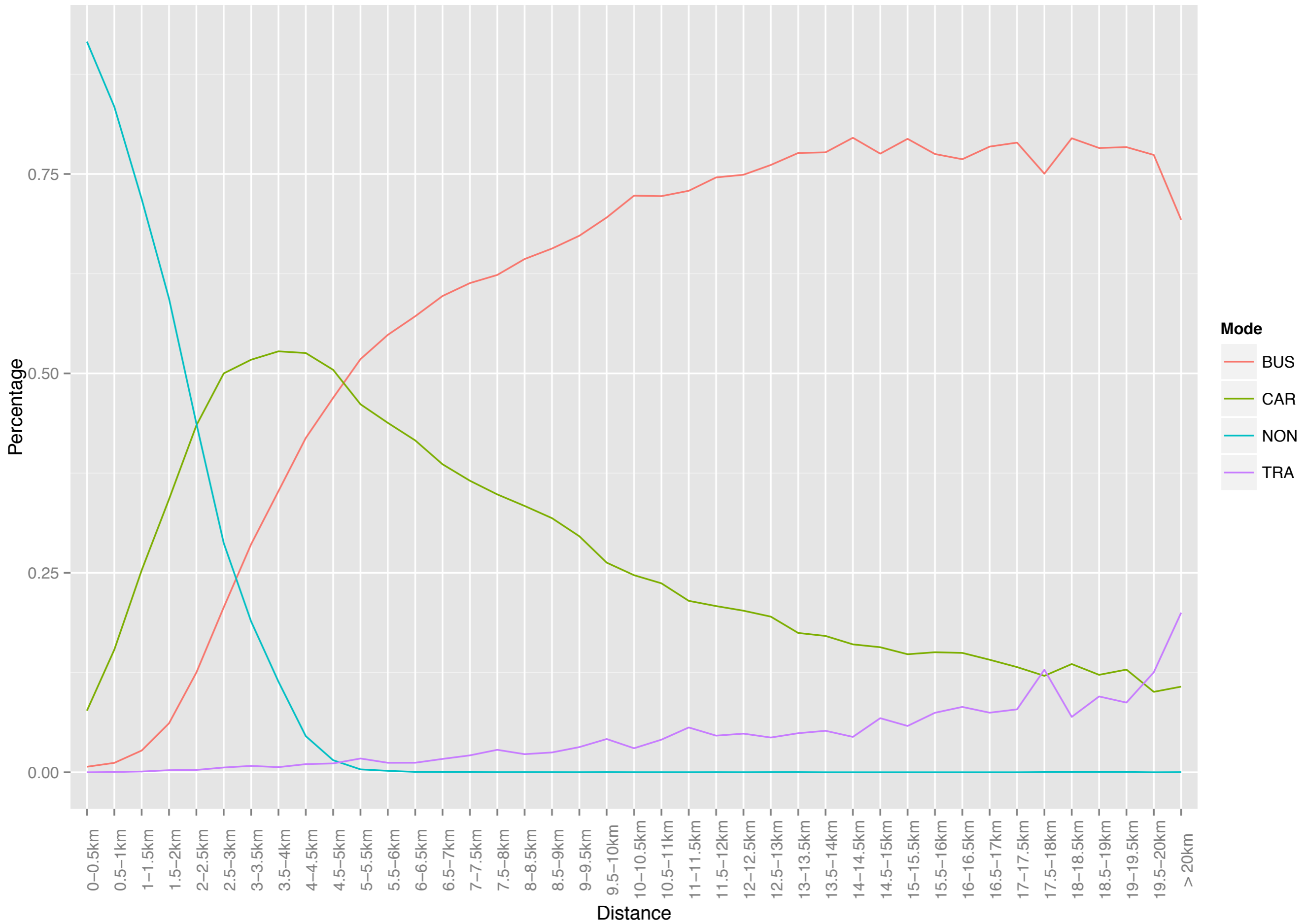


# Data Processing



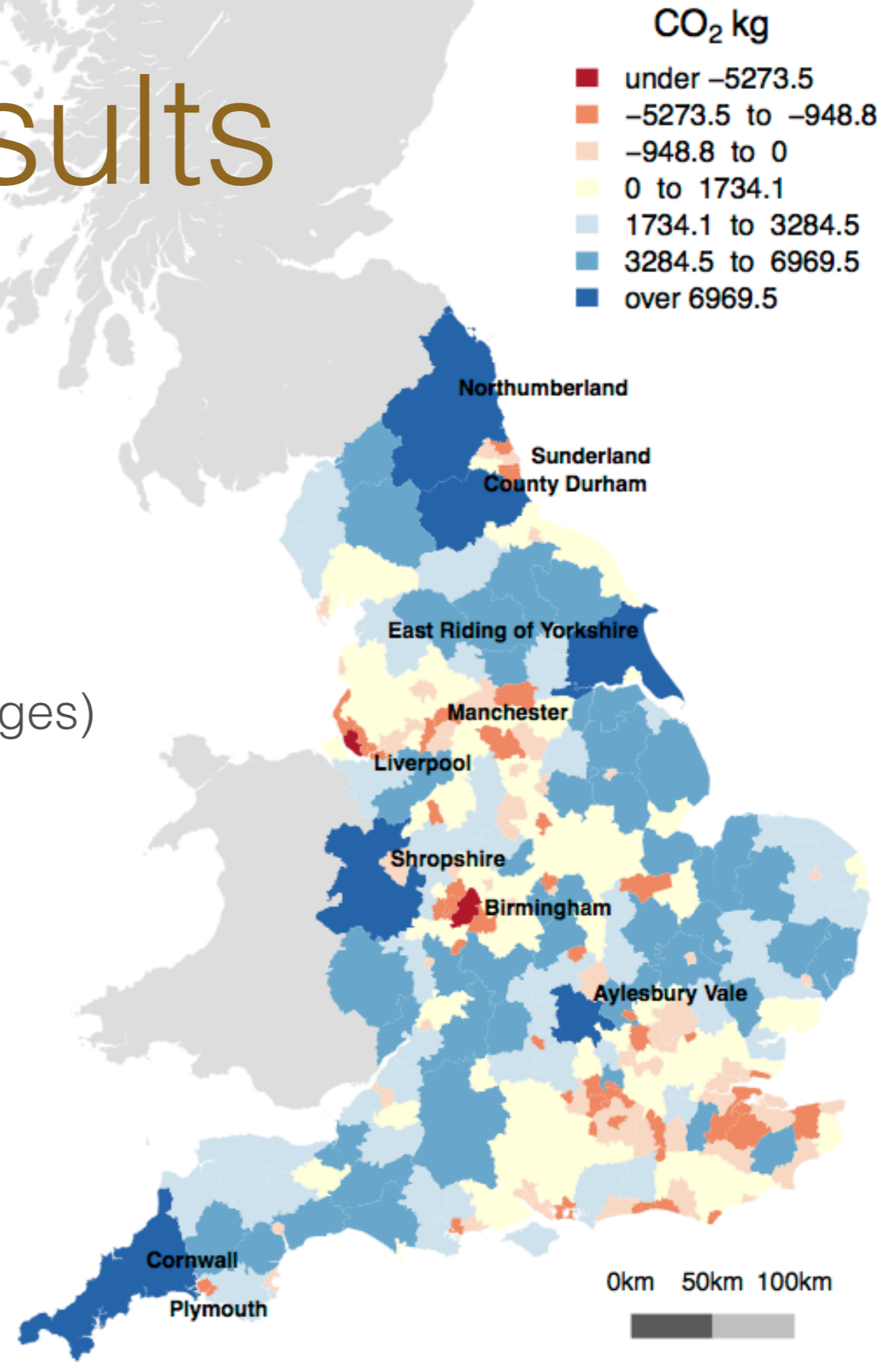
# Software Infrastructure





# Results

Versus a simple model  
(straight line, vehicle national averages)  
+ve = simple model overestimating



## A GIS approach to modelling CO<sub>2</sub> emissions associated with the pupil-school commute

Alex Singleton\*

Department of Geography and Planning, University of Liverpool, Liverpool, UK

(Received 12 November 2012; final version received 22 July 2013)

Concerns have been raised in numerous countries over the declining rates of active transport to school. In a UK context, the pupil-school commute is estimated to contribute around 658 kilotonnes of CO<sub>2</sub> per year; however, tackling this issue effectively requires an improved understanding of how emissions can be modelled and mapped over a variety of scales. This paper implements a new estimation technique for the modelling of CO<sub>2</sub> emissions linked with the school commute that integrates both transport network-level routing and geographically disaggregate vehicle emissions data. The model is then applied to a national cohort of pupils in England. Areas demonstrating the highest emissions were typically more rural and/or comprising more affluent resident populations. Emissions were also shown to increase with school year, with larger step changes between educational stages reflecting the different geography of school locations. Furthermore, where secondary school entry policies were selective or based on a religious denomination, average emissions were typically higher than in non-selective schools.

**Keywords:** GIS; CO<sub>2</sub> emissions; schools; vehicle routing

### Introduction

Internationally, the rates of travelling to school by active transport (e.g. cycling or walking) are in decline (Tudor-Lockie et al. 2001, Schlossberg et al. 2006, McMillan 2007, Trang et al. 2012), and the corollary switch to less sustainable modes of travel have been linked to negative effects on the environment in terms of increased emissions (Van Ristell et al. 2012), increasing traffic congestion around schools (Collins and Kearns 2001) and health impacts related to lower physical activity levels (Faulkner et al. 2009, Moran et al. 2011) or pollutant exposure (McConnell et al. 2010).

In a UK context, schools account for 15% of total public sector emissions (DfES 2010), which in England are estimated to be the equivalent of around 9.4 million tonnes of CO<sub>2</sub> per year (SDC 2006). Seven per cent (658 kilotonnes) of this total is associated with the pupil-school commute, and as such, there are significant environmental benefits for pupils to adopt more sustainable travel behaviour.

International research on commuting to school reveals that mode choice is impacted by multiple interacting factors including actual and perceived distance to the school (McDonald 2007, Miller et al. 2008, Lang et al. 2011), road infrastructure (Pwing et al. 2004, Bajleri et al. 2010), urban form (McMillan 2007, Miru et al. 2010, Punter et al.

\*Email: [alex.singleton@liverpool.ac.uk](mailto:alex.singleton@liverpool.ac.uk)

© 2013 The Author. Published by Taylor & Francis. This is an Open Access article distributed under the terms of the Creative Commons Attribution License (<http://creativecommons.org/licenses/by/3.0/>), which permits unrestricted use, distribution, and reproduction in any medium, provided the original work is properly cited. The moral rights of the named author(s) have been asserted.



Many thanks....

