

# New light on old problems

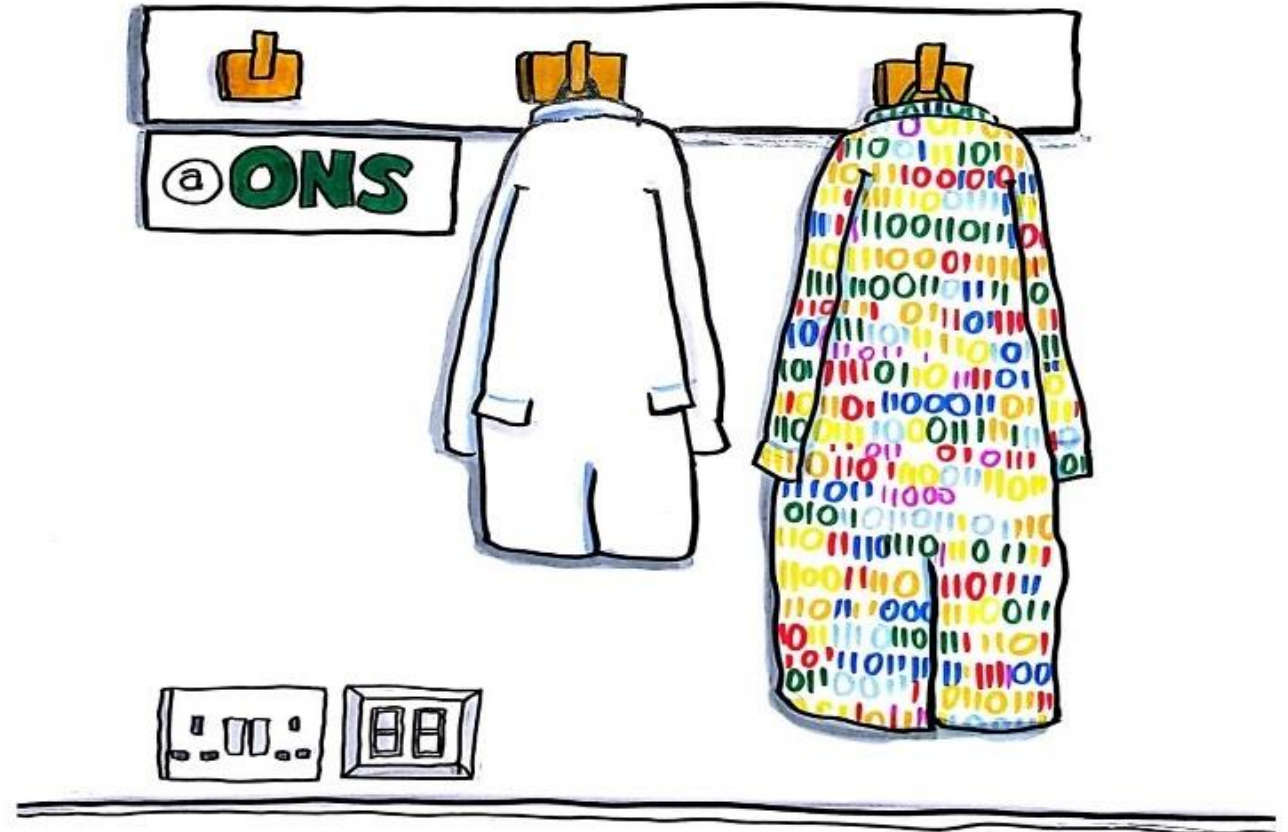
## Novel data sources and official statistics

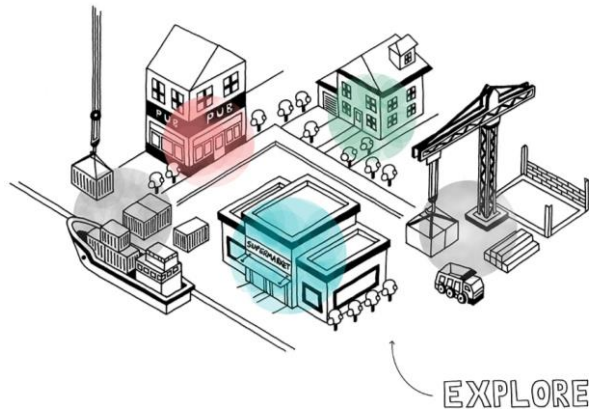
Tom Smith, @\_datasmith  
Director, ONS Data Science Campus



**Data Science  
Campus**

web: [datasciencecampus.ons.gov.uk](https://datasciencecampus.ons.gov.uk)  
email: [datasciencecampus@ons.gov.uk](mailto:datasciencecampus@ons.gov.uk)  
twitter: [@DataSciCampus](https://twitter.com/DataSciCampus)





## Economy

GDP  
Inflation  
Labour market  
+++



## People

Population  
Census  
Incomes  
+++



## World

Trade  
Sustainable  
Development Goals  
+++

# Data Science Campus creation

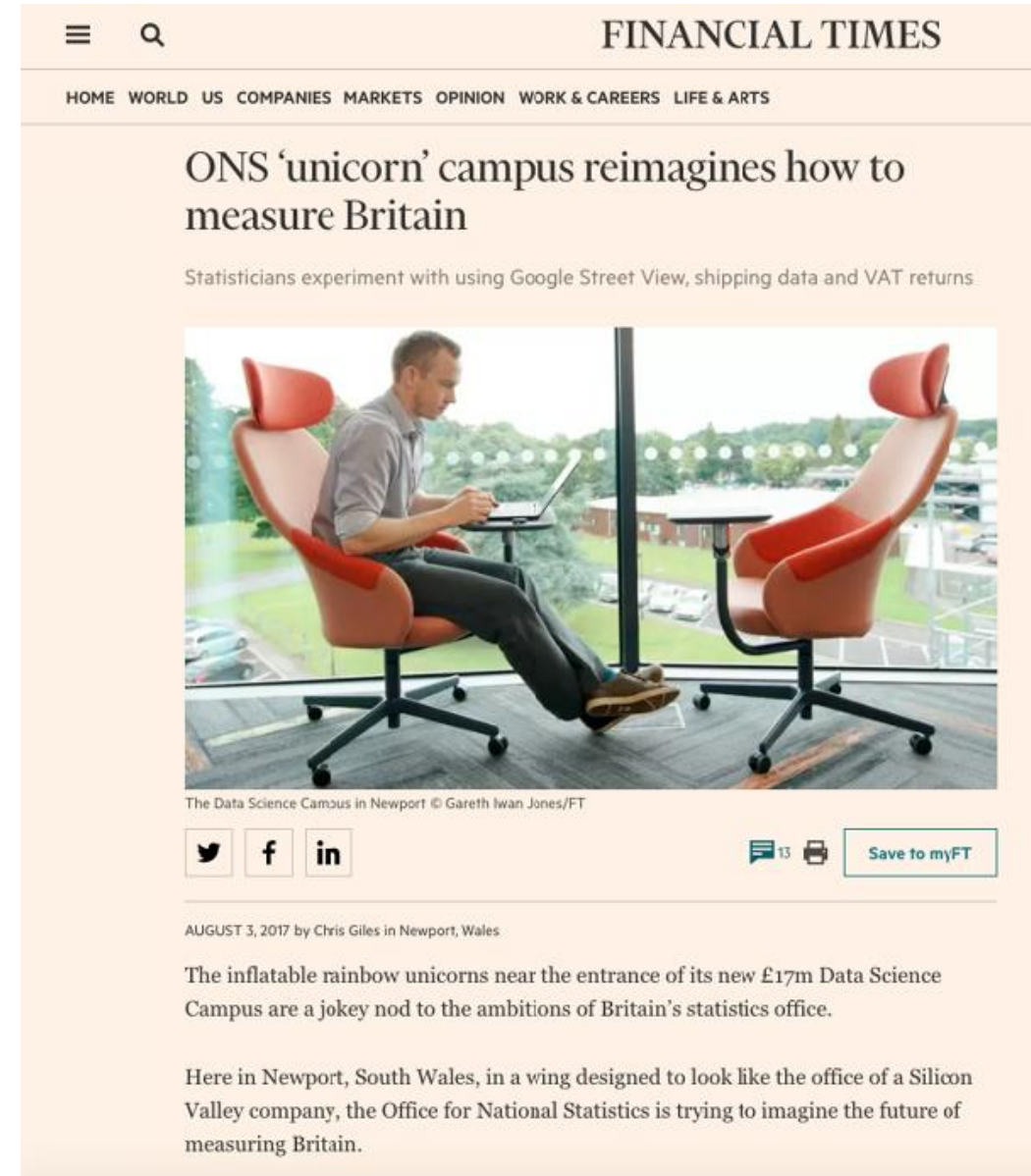


“Although **better use of [data]** has the potential to transform the provision of economic statistics, ONS will need to **build up its capability** to handle such data.

This will take some time and will require not only **recruitment of a cadre of data scientists** but also **active learning and experimentation**.

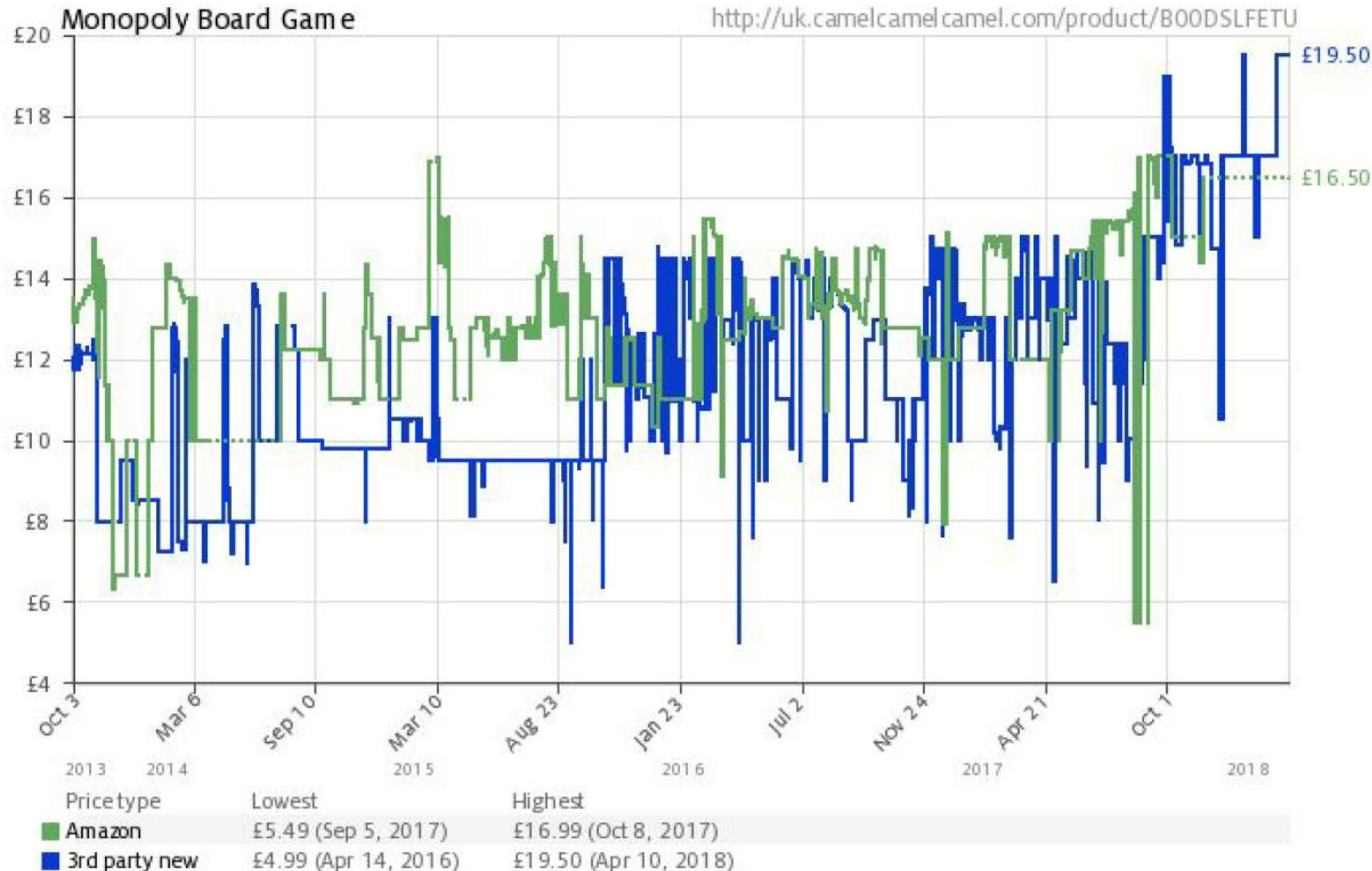
That can be facilitated through **collaboration with relevant partners** – in academia, the private and public sectors, and internationally.”

*Independent Review Economic Statistics  
Professor Sir Charles Bean, 2016, p.11*





# We need big data to understand the world



Monopoly price fluctuation over 4 year period  
High = £19.50  
Low = £4.99  
(Data from camelcamel)

*Big Data is changing how consumer markets work*

James Plunkett, 2017-18  
Rybczynski Prize Essay



“The 21st Century has brought new challenges in the analysis of data, and it is increasingly apparent that solutions to these are both statistical and computational. This has led to a great demand for people both in industry and in research who are able to draw upon the mathematics of both computation and probability to make sense of the large amounts of data that are collected in order to solve major problems.

Data science is an interdisciplinary response to this demand”

- University of Warwick



**London Transport workers manually examine over 4 million tickets to identify most and least popular routes, March 1939**

Gerry Cranham/Fox Photos/Hulton Archive/Getty Images



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**Transport for London**

## WiFi data collection

We are collecting WiFi data at this station to test how it can be used to improve our services, provide better travel information and help prioritise investment.

**We will not identify individuals or monitor browsing activity.**

We will collect data between Monday 21 November and Monday 19 December.

For more information visit: [tfl.gov.uk/privacy](http://tfl.gov.uk/privacy)



MAYOR OF LONDON

 **TRANSPORT FOR LONDON**  
EVERY JOURNEY MATTERS

Transport for London 2016 pilot, assessing journeys by WiFi access



The longer a decision-maker has to wait for the statistics, the less useful they are likely to be

Professor Sir Charles Bean (2016)

Review of UK economic statistics

# Faster indicators of the economy

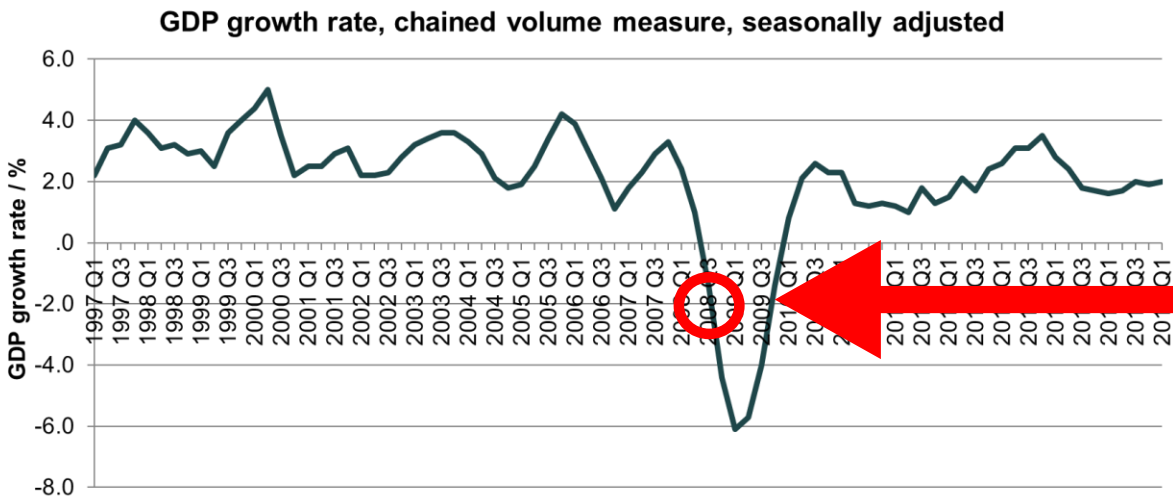


Fig 1. UK GDP Growth Rate

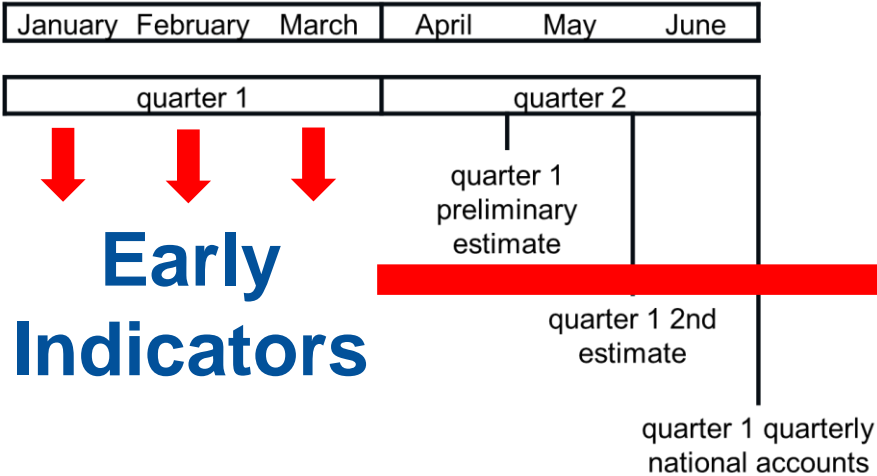


Fig 2. ONS National Accounts Publication Timetable

-6%

Change in UK GDP between first quarter of 2008 and second quarter of 2009

5 years

Length of time from 2008 for the UK economy to return to pre-recession size

£12b

Estimated value for earlier identification of 2008 downturn

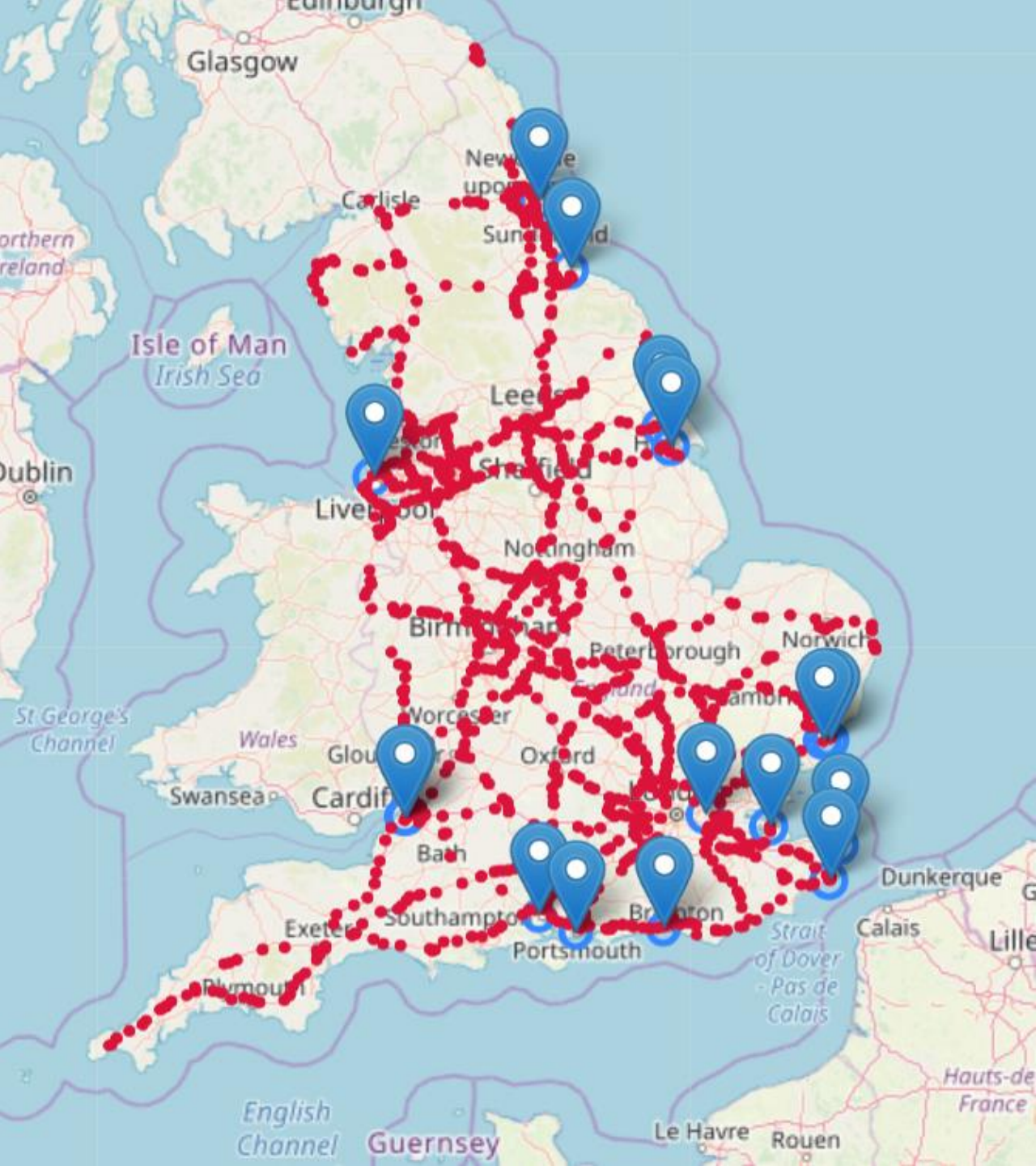


## Business value added tax (VAT) returns

- Expenditure and turnover diffusion indices
- Reporting behaviour
- Available up to 1 month before GDP



VAT due in this period on <b>sales</b> and other outputs	1
VAT due in this period on <b>acquisitions</b> from other <b>EC Member States</b>	2
Total VAT due ( <b>the sum of boxes 1 and 2</b> )	3
VAT reclaimed in this period on <b>purchases</b> and other inputs (including acquisitions from the EC)	4
Net VAT to be paid to HMRC or reclaimed by you ( <b>Difference between boxes 3 and 4</b> )	5
Total value of <b>sales</b> and all other outputs excluding any VAT. <b>Include your box 8 figure</b>	6
Total value of <b>purchases</b> and all other inputs excluding any VAT. <b>Include your box 9 figure</b>	7
Total value of all <b>supplies</b> of goods and related costs, excluding any VAT, to other <b>EC Member States</b>	8
Total value of all <b>acquisitions</b> of goods and related costs, excluding any VAT, from other <b>EC Member States</b>	9



## Road traffic data

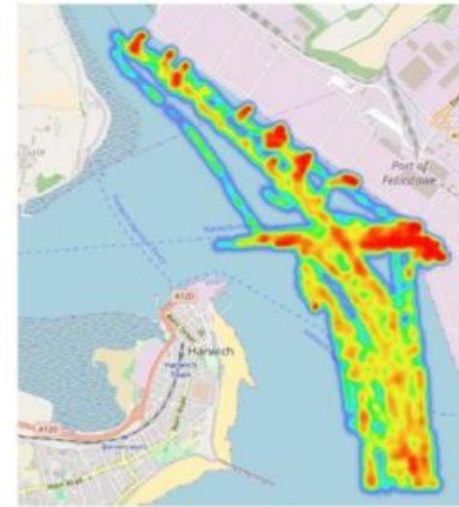
- Highways England sensor data
- Average speeds
- All-England and English ports
- By vehicle length
- Available 2 months before GDP



# Shipping Automated Information System (AIS) data



- Marine and Coastguard Agency, ORBCOMM, Global Platform
- Ship tracking data
- Port traffic frequency
- Time in port
- Real time



Monday 12 December 2016



Monday 19 December 2016

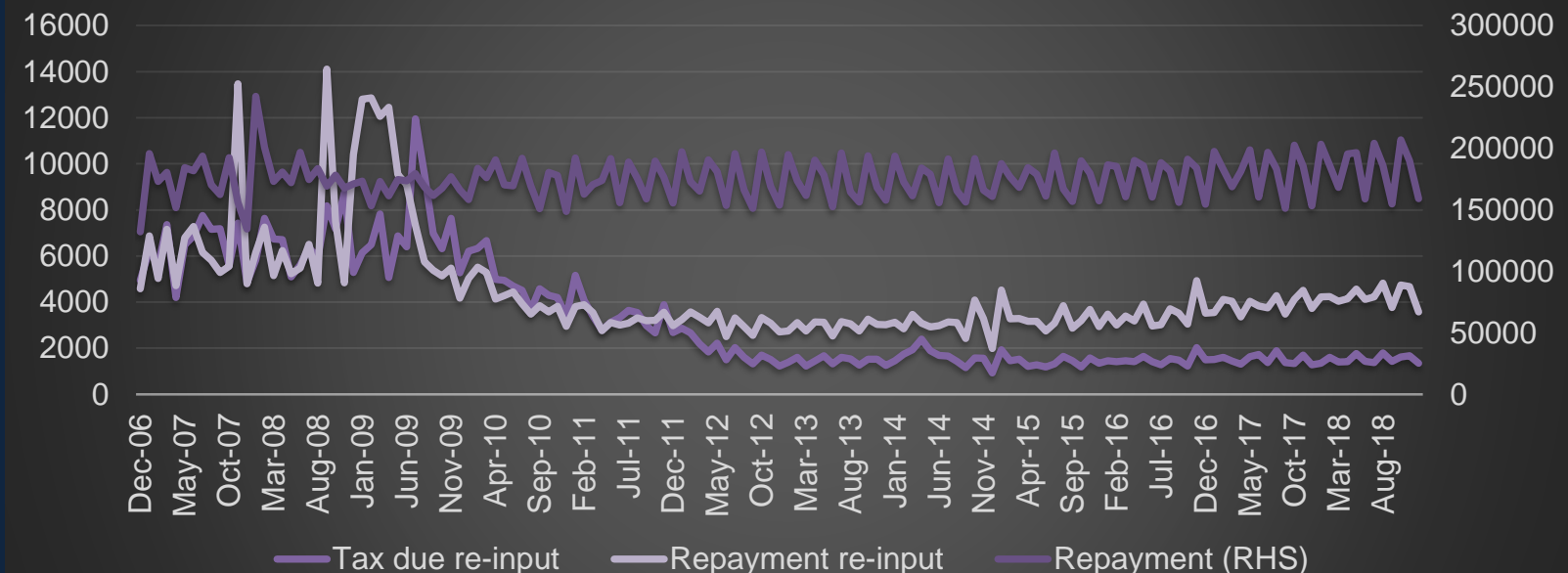
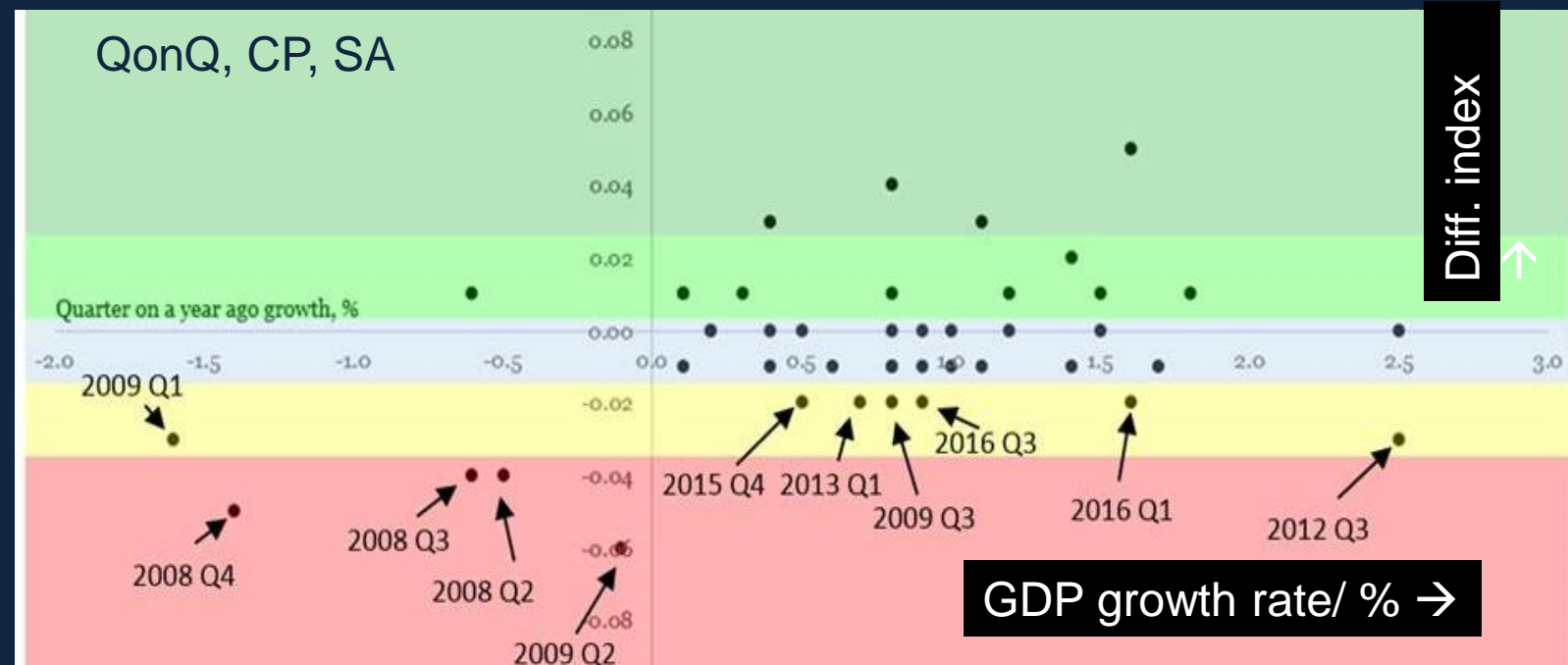


Sunday 25 December 2016



Sunday 1 January 2016

- VAT is a good indicator of large change
- Last recession identified 5 months before official statistics
- Novel repayments indicators show financial stress
- Care with over-interpretation and beware bias!





# FINANCIAL TIMES

UKCOMPANIESTECHMARKETSGRAPHICSPINIONWORK & CAREERSLIFE & ARTSHOW TO SPEND IT

conomic growth

ppers unfazed by Brexit as UK  
il sales jump



UK house price growth weakest in  
seven years



Slowing UK productivity rings  
alarm bells

fastFT UK economic growth

+ Add to myFT

## Economy lost momentum in first quarter, ONS 'big data' show

New system based on VAT returns aims to be early warning for  
looming problems

THE  TIMES

SUBSCRIBELOG IN

MARCH 20 2019, 12:01AM, THE TIMES

## Even a skip-counter like me agrees economic indicators need updating

DAVID SMITH



Today I want to take you away from the Alice in Wonderland world of Brexit, populated by strange creatures often called Steve or John, and deal with something that will still be important long after the dust has settled. My interest was piqued

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Economics

## Faster Indicators for U.K. Point to Modest Decline in Turnover

By [Andrew Atkinson](#) and [Fergal O'Brien](#)  
April 15, 2019, 10:28 AM GMT+1

The Telegraph

HOME | NEWS | SPORT

# Business

Economy | Companies | Opinion | Open economy | Markets | Alex | Telegraph

FTSE 100 ▲  
7523.07 +0.85%

FTSE 250 ▲  
19908.02 +0.36%

GBP/USD ▼  
\$1.2943 -0.31%

GBP/EUR ▲  
€1.1543 +0.09%

BRENT OIL ▼  
\$74.20 -0.07%

PREMIUM

Home > Business

## Early warning indicators not flashing red: few signs of economic slowdown in March

Data Science Campus | [datasciencecampus.ons.gov.uk](https://datasciencecampus.ons.gov.uk) | [datasciencecampus@ons.gov.uk](mailto:datasciencecampus@ons.gov.uk) | [@DataSciCampus](https://twitter.com/DataSciCampus)

In a recent study produced for the Office for National Statistics (ONS) Natural Capital Accounts, the UK's trees were estimated to **remove 1.4 million tonnes** of air pollutants in a single year. This would result in an **annual saving of £1 billion** in avoided health damage costs. In another study, London's 8.42 million trees have been estimated to remove 2,241 tonnes of pollution per year, which in addition to other services, is estimated to provide £132.7 million in annual benefits.

For Cardiff, the annual benefit is close to **£8 million**.



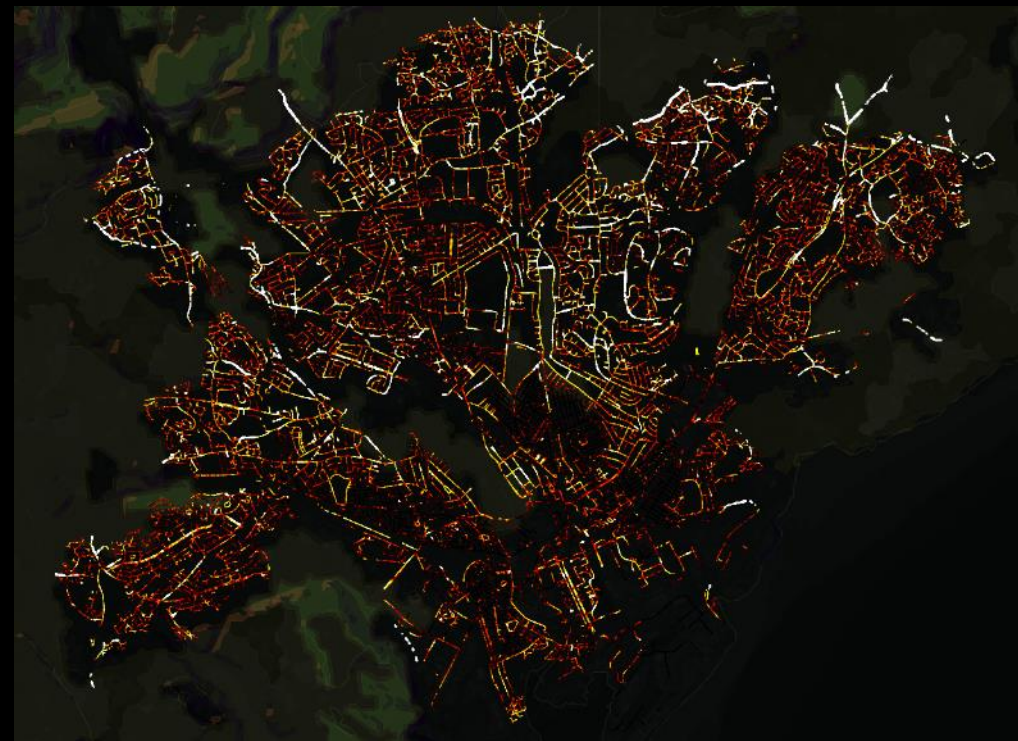


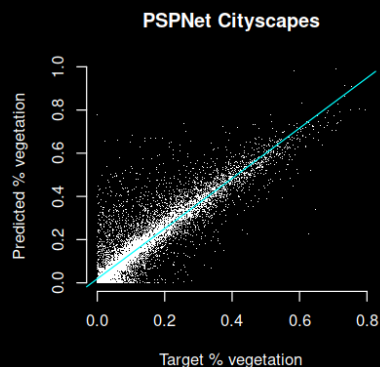
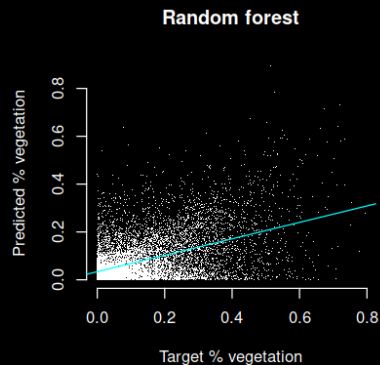
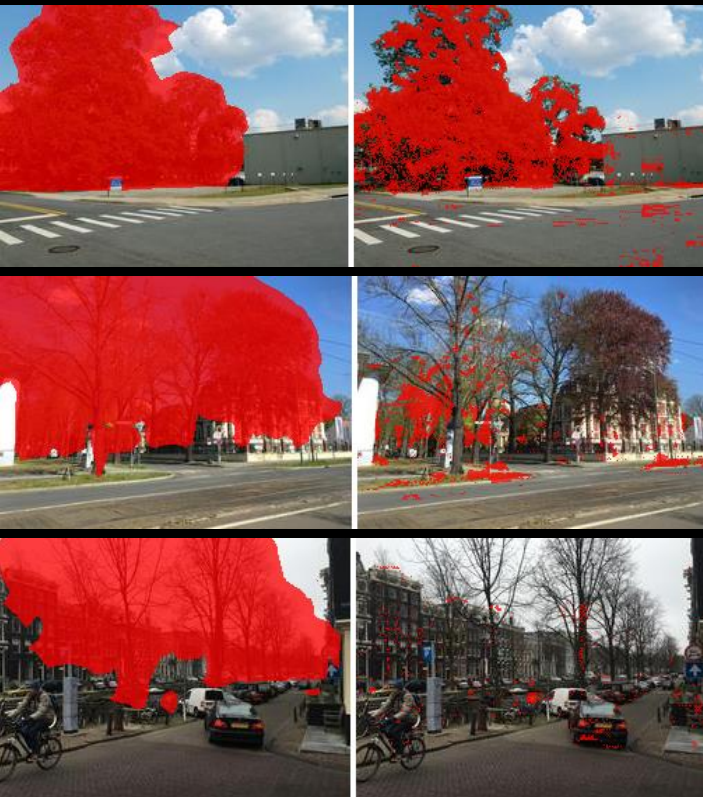
**Aim:** Generate a scalable, consistent, automated, **urban vegetation index**

**Outcome:** An end-to-end processing pipeline.

Making use of: **17 million images** for 112 cities in the UK.

... **OpenStreetMap** road network data  
... Deep **image segmentation** methods





Current approach...

## ... Pyramid Scene Parsing Network

Hengshuang Zhao, Jianping Shi, Xiaojuan Qi, Xiaogang Wang, Jiaya Jia.  
IEEE Conference on Computer Vision and Pattern Recognition (CVPR), 2017.

Model	BACC	Pre	Rec	F1	MCC	$R^2$	$\tau$
PSPNet (city)	<b>0.90</b>	0.66	<b>0.87</b>	0.75	0.72	<b>0.83</b>	<b>0.77</b>
PSPNet (ade20k)	0.85	<b>0.82</b>	0.73	<b>0.77</b>	<b>0.74</b>	<b>0.83</b>	0.76
Random forest	0.62	0.48	0.29	0.36	0.31	0.25	0.32
Lab ( $a^*$ $b^*$ )	0.62	0.47	0.28	0.35	0.29	0.20	0.28
Lab ( $a^*$ )	0.55	0.33	0.14	0.19	0.15	0.04	0.15

Images segmented by **cars**, buildings, **path**, **people**, **trees**.

**90%** vs 62% class balanced accuracy.

Validated using the Mapillary Vistas Dataset for semantic understanding of street scenes. <https://research.mapillary.com/>

Enter your postcode or click on the map to explore

cf23 5ee

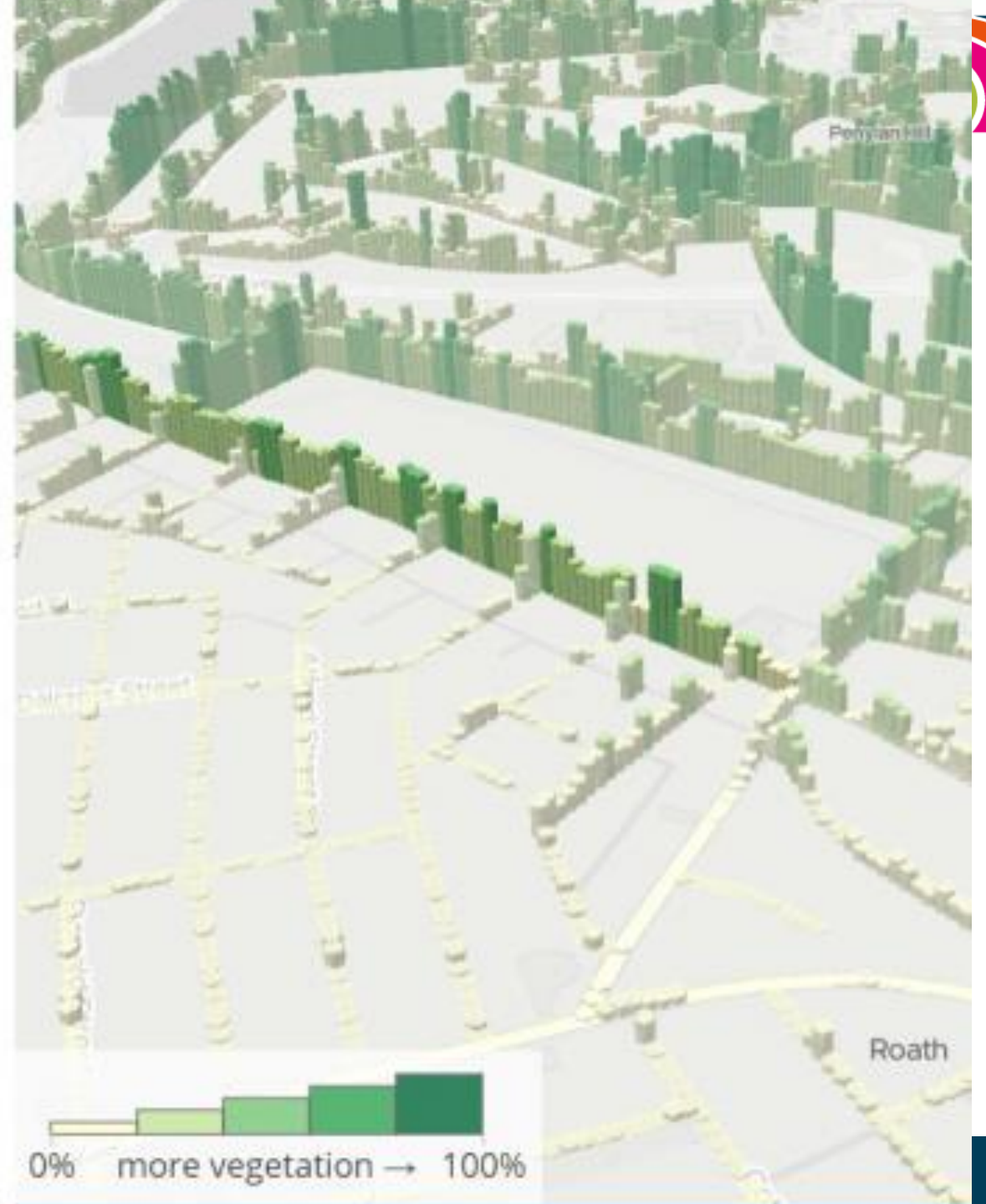


— Cardiff average **13%**







**Ninian Road** is the **182nd** greenest street out of **3,219** in **Cardiff**

Share





# A Hierarchical Street Tree Index Using Street-Level Imagery and Deep Learning

Philip Stubbings <sup>a,1\*</sup> , Joe Peskett <sup>a,2</sup> , Francisco Rowe <sup>b,3</sup>  and Dani Arribas-Bel <sup>b,4</sup> 

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<sup>b</sup> Geographic Data Science Lab, Department of Geography & Planning. University of Liverpool

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Version March 28, 2019 submitted to Remote Sens.

**Abstract:** In this study, we describe a computer vision based method to derive an Urban Street Tree Vegetation Index which aims to quantify the amount of vegetation visible from the point of view of a pedestrian. We first generalise the problem of detecting trees and vegetation at street level as a form of semantic image segmentation. Using labelled data, we then compare two optimised colour-space thresholding methods to identify green pixels with a deep learning based approach. While image thresholding is computationally efficient and effective in controlled environments, we find a deep learning based approach to image segmentation superior in this context, particularly with respect to the problem of detecting diverse, possibly non-green tree species in different seasons and varying lighting conditions. Having identified a robust method to determine the quantity of vegetation present in arbitrary images, we then sample 220,068 street-level images for a large city in the UK and produce a vegetation index for 10 metre intervals along the entirety of the city road network. Using this high resolution dataset, we then generate indices for Lower Layer Super Output Areas (LSOAs) using a hierarchical linear model which we use to correct for visual obstructions typical in the urban environment.

# Text analysis of ferry cargo



## The Challenge

Ferry operators collect information on the contents of lorries and trade vehicles boarding their Ferries

A single line description is recorded to detail the contents

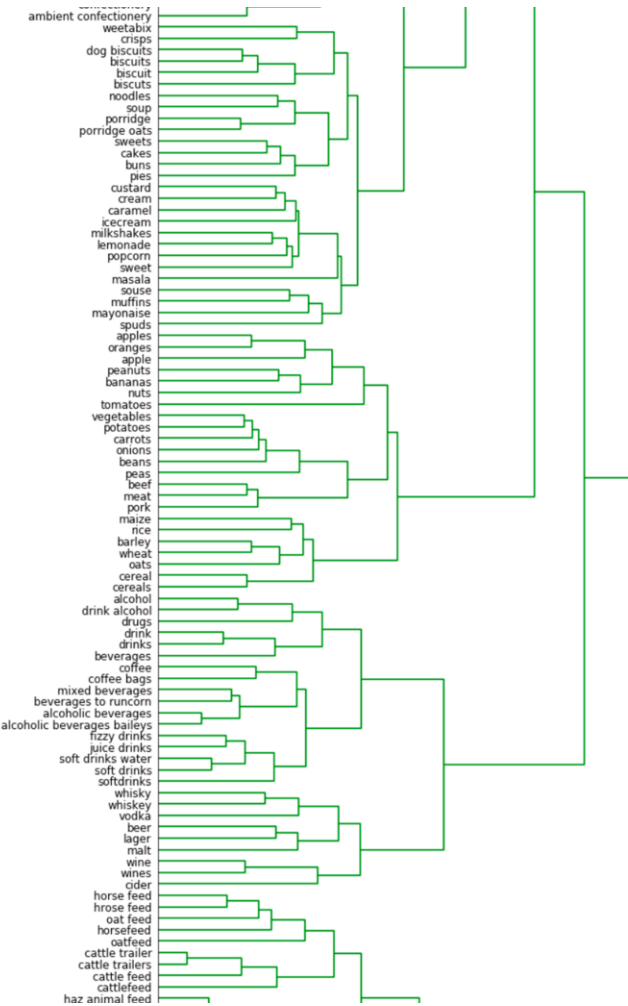
The data collection is not controlled enabling complete free text entries.

This significantly restricts the analysis that can be done.

## The Solution

Optimus is an NLP pipeline that can group items from free-text lists by context that do not have accompanying classifications or codes.

The tool can generate labels for groups of items based on common syntax or, in some cases, synonyms. It can also handle inconsistencies in text records such as spelling mistakes, plurality and other syntactic variation.



## The Data

35k

Lorry journeys in single month analysed during Phase 1

450k

Lorry journeys in 2017 to be analysed during Phase 2

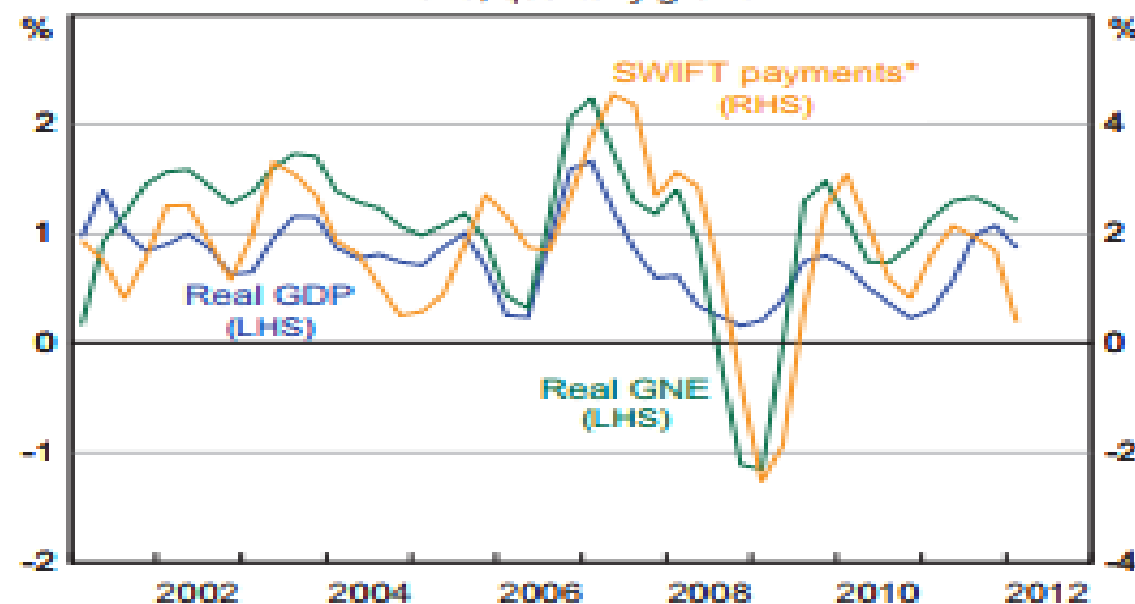
# Payments data for regional indicators



- Identifying rapid, local economic indicators - breakdowns by geography, industry, product, credit / debit card, on-line payment, international
- Collaboration with Barclays, 2-way secondments
- What can we learn about payments data?



**SWIFT Payments and Economic Activity\***  
Trend, quarterly growth



\* Number of SWIFT interbank payments settled in RITS, 7-period  
Henderson trend  
Sources: ABS; RBA.

# Payments data for regional indicators



- Financial data held by banks
  - No sensitive or personally identifiable data shared
  - All outputs are aggregate and non-sensitive
- Hypotheses we are exploring include
  - Payments data as proxy for retail sales by sector & time (eg night time economy)
  - Payments data as proxy for private household consumption
  - Payments data can improve the accuracy of GDP nowcasting

- Data sources potentially available through secondments:

Consumer	Electronic payments	Business
Debit Card spend Credit card spend Personal Loans Mortgages Savings accounts Insurance	POS data ATM data Online gateway data (online purchases) Peer-to-peer	Merchant & Acquirer data Corporate Cards Business Bank products Corporate bank Products Investment bank products

### **Level 4 Apprenticeship in Data Analytics:**

Two-year programme, 12 months at the Campus followed by 2 x 6 month rotations across ONS

### **Level 6 Apprenticeship in Data Science:**

Three-year programme, approved for England in 2018, launching in England and Wales in 2019

### **Data Science Faculty:**

In-house training unit delivering operational courses in programming (R, Python) and fundamentals of Machine Learning, NLP etc

### **Accelerator:**

12-week mentoring programme for Government analysts delivered with GDS, in parallel with in-house ONS Data Science Academy

### **Masters in Data Analytics for Government:**

2 year part-time MSc in Data Science and Statistics for government analysts, delivered by UCL, Oxford Brookes and University of Southampton. Expanding in 2020/21



Elund Morgan, Minister for Welsh Language and Lifelong Learning  
and Alexis Fernquest, ONS Data Analytics Apprentice, Nov 2018



## Attracting talent tomorrow, Accessing skills today

### University research programmes and PhD funding:

Research partnerships with over a dozen universities and the Alan Turing Institute, which additionally hosts the *Data Science for Public Good* joint PhD programme

### Centres for Doctoral Training:

7 UKRI, EPSRC and STFC centres for Doctoral Training in AI, Data Science, Statistics and Physics, with PhD co-supervision and Campus placements

### Graduate Student Placement Programme:

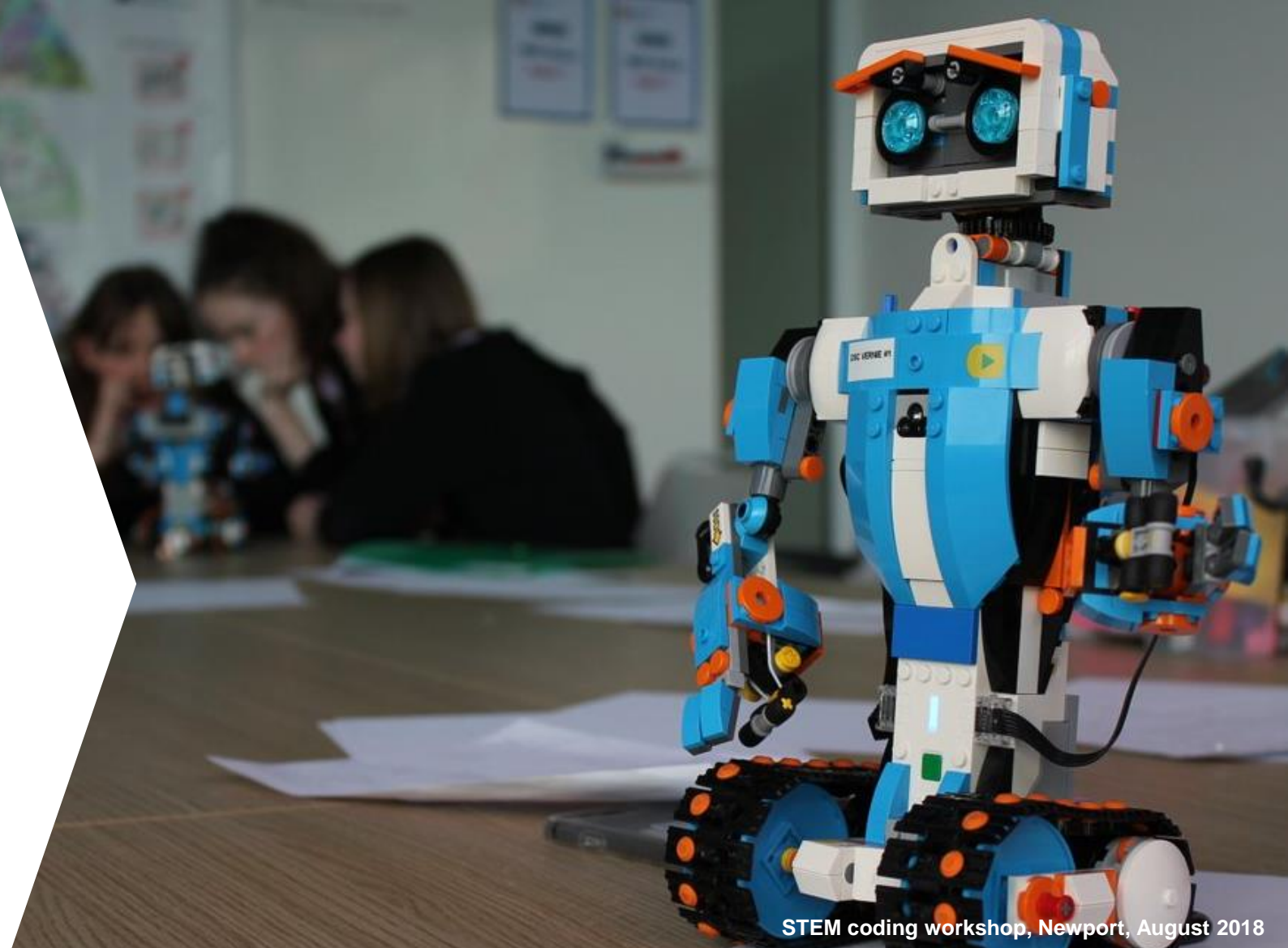
Three-month MSc thesis and MSc/PhD industry placements at the Campus

### Welsh Data Science Graduate Programme:

2 year MSc programme with Welsh Contact Centre Forum that includes three eight month industry placements.

### STEM Outreach:

Girls into STEM (Science, Technology, Engineering & Maths) programme for GCSE students; Nuffield Research Placements for A-level students



STEM coding workshop, Newport, August 2018

## Developing the next generation of Data Scientists

# New light on old problems

## Novel data sources and official statistics

Tom Smith, @\_datasmith  
Director, ONS Data Science Campus



**Data Science  
Campus**

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