

Census flow data workshop

Handout instructions #2

Downloading 2021 census flow data and analysing the data programmatically

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Getting started

- Start up a browser
- Screenshots of process

Flow data website

For quick access you can follow the link to

https://wicid.ukdataservice.ac.uk/



Flow data homepage (i)

- Three main routes to data
 - Flexible queries
 - Downloads
 - Summaries

Flow **Census Support: Flow Data** Data Flow Data is part of UK Data Service Census Support, providing data and user support for anyone interested in using Flow data links flow data from the Census. Flow data home Information and Census flow data (also referred to as *interaction* data) relate to the movement of people between places. These can be Publications regular short distance moves such as the daily commute to work, or less frequent - and sometimes longer distance -Available Data moves such as migration to a new home or an extended stay in a second address. Downloads Flow data differ from other Census data in that they link two locations - an origin and a destination. With two Contact us geographies, flow datasets can be much larger than other Census data products. News FAQs Getting the data Credits There are three principal ways of getting to the data. In order to use most of the data sets, it is necessary to be Support registered. Accessibility statement Feedback WICID - the flexible query builder Help WICID Downloads - flow data tables ready to be downloaded WICID Flow Summaries - a quick summary of the most significant flows associated with a chosen area New data for un-registered users Un-registered users and interested registered users can now access a time series of UK inter-district migration estimates, which have been produced by CIDER. These data are available directly from the Office for National Statistics - for more information about the dataset and how to gain access, click here About the data

WICID Query builder

- The WICID general query builder allows users to identify and extract a subset of flows in which they are interested
 - It also provides built-in support for area code labelling
 - Select 'WICID Downloads' button



Census Support: Flow Data Flow Data is part of UK Data Service Census Support, providing data and user support for anyone interested in using flow data from the Census. Census flow data (also referred to as interaction data) relate to the movement of people between places. These can be regular short distance moves such as the daily commute to work, or less frequent - and sometimes longer distance moves such as migration to a new home or an extended stay in a second address. Flow data differ from other Census data in that they link two locations - an origin and a destination. With two geographies, flow datasets can be much larger than other Census data products. Getting the data There are three principal ways of getting to the data. In order to use most of the data sets, it is necessary to be registered. WICID - the flexible query builde WICID Downloads - flow data tables ready to be downloaded WICID Flow Summaries - a quick summary of the most significant flows associated with a chosen area New data for un-registered users Un-registered users and interested registered users can now access a time series of UK inter-district migration estimates, which have been produced by CIDER. These data are available directly from the Office for National Statistics - for more information about the dataset and how to gain access, click here.

Login screen

- For use with OGL/Public data, we can use 'Standard Login'
- Registered access offers open data AND safeguarded data

Select 'Standard login

Flow Census Support: WICID Login

Standard login (public access datasets)

Start a new session - no username or password required

Registered access for academic and most other users

Login using Shibboleth / UK Federated Access Management

WICID downloads page

UK Data Service	Sele	ect '2021 Census'
Census Support	[Home] > FlowData downloads page	
	Logged in as: guest [Logout now]	
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Flow data links Flow data home Information and Publications Available Data	In this page you can find various files to download. Click on the category titles to expand the available files.	
Downloads Contact us	2021 Census England & Wales - Open	
FAQs Credits	2011 Census United Kingdom - Open	
Support Accessibility statement Feedback Help		

We will work with the closest equivalent dataset to its 2011 tables

ODMG01EW_NON_UK_LTLA. Clicking on the table name will display some basic information

about the table.

FlowData downloads page

Clicking on the 'Download' button will download the dataset

Flow data links Flow data home Information and Publications Available Data Downloads Contact us News FAQs Credits

Flow

Support Accessibility statement Feedback Help

2021 Census England & Wales	s - Open					
Public tables from 202	21 Census.		Release dat	e 31-10	-2023 10:00:00	
Click on each table's r For more information published by ONS.	number to view additional information and specifications. Each CSV table is compressed into a zip file. on how to use the datasets, please see the official user guide to Census 2021 origin-destination data for England ar	nd Wales	Publisher Release	ONS 2021.0	DD.1	
Table name	Table title	Table populatior	1	Geographic coverage	Geographic breakdown	Download
ODMG01EW_LTLA	This dataset provides Census 2021 estimates on all usual residents aged 1 year and over in England and Wales who were living at a different address one year before the Census. The estimates classify people currently resident in each Lower Tier Local Authority (LTLA), in which they were resident in one year before the Census. The estimates are as at Census Day, 21 March 2021. People resident outside of the UK one year before the Census are counted in the category "Outside UK".	All usual residents and over	s aged 1	England and Wales	LTLA	٥
DDMG01EW_MSOA	This dataset provides Census 2021 estimates on all usual residents aged 1 year and over in England and Wales who were living at a different address one year before the Census. The estimates classify people currently resident in each Middle layer Super Output Area (MSOA), in which they were resident in one year before the Census. The estimates are as at Census Day, 21 March 2021. People resident outside of the UK one year before the Census are counted in the category "Outside UK".	All usual residents and over	s aged 1	England and Wales	MSOA	3
DDMG01EW_NON_UK_LTLA	his dataset provides Census 2021 estimates on all usual residents aged 1 year and over in England and Wales who were living outside the UK one year before the Census. The estimates classify people currently resident in each Lower Tier Local Authority (LTLA) by the country in which they were resident one year before the Census. The estimates are as at Census Day, 21 March 2021.	All usual residents and over	s aged 1	England and Wales	LTLA	(3)
ODMG01EW_NON_UK_RGN	This dataset provides Census 2021 estimates on all usual residents aged 1 year and over in England and Wales who were living outside the UK one year before the Census. The estimates classify people currently resident in each region by the country in which they were resident one year before the Census. The estimates are as at Census Day, 21 March 2021.	All usual residents and over	s aged 1	England and Wales	RGN	٥
ODMG01EW_NON_UK_UTLA	This dataset provides Census 2021 estimates on all usual residents aged 1 year and over in England and Wales who were living outside the UK one year before the Census. The estimates classify people currently resident in each Upper Tier Local Authority (UTLA) by the country in which they were resident one year before the Census. The estimates are as at Census Day, 21 March 2021	All usual residents and over	s aged 1	England and Wales	UTLA	•

WICD download 2021 tables The dataset is archived in a ZIP file so you need to extract it.

1. Open the folder where the downloaded ZIP file is



2. Extract the CSV file from the ZIP archive and then Open it with Microsoft Excel.



Google Colab

Google Colab is a powerful tool which we can use to run code without the need to install any software in our local machines.

https://colab.research.google.com/

Click File->New notebook and login using your Google account



Google Colab After successful login, we are ready to run our code. Click on the input box next to the play button and paste the code from exercise2_1_convert_to_matrix_simple.py.



Comment 2 Share

© **• •** • • •

Google Colab Upload ODMG01EW_NON_UK_LTLA.csv into the Colab environment.

2. Upload the file using the upload dialog box or drag and drop it into storage below the sample_data folder

1. Open the files tab



Google Colab Upload ODMG01EW_NON_UK_LTLA.csv into the Colab environment.

2. Refresh the storage after processing has finished or the generated file might not be visible

1. Execute the script by clicking the play button



3. Hover the mouse over the generated file, click on the three vertical dots that appear and select Download from the context menu

Google Colab

```
import pandas as pd
# Read the CSV data into a DataFrame
census data = pd.read csv('/content/ODMG01EW NON UK LTLA.csv')
# Create a pivot table with 'Migrant country one year ago' as rows,
# 'Lower tier local authorities label' as columns, and 'Count' as values
pivot table = census data.pivot table(
    index='Migrant country one year ago (60 categories) (detailed) label',
    columns='Lower tier local authorities label',
    values='Count',
    aggfunc='sum',
   fill_value=0
# Write the pivot table to a new CSV file
pivot_table.to_csv('/content/ODMG01EW_NON_UK_LTLA_matrix.csv')
```

Exercises with downloaded data Open ODMG01EW_NON_UK_LTLA_matrix.csv with Microsoft Excel.

Explore it. What immediate differences you notice in the dataset compared to ME02UK non_uk from 2011 census?

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An immediate problem is that the 2021 dataset contains the numbers of those who have not migrated ('does not apply') as well as the internal migrants from the rest of the UK. So, if we only want to see the numbers of overseas migrants ,we need to clean our data and remove the following rows: 'Does not apply', 'Europe: United Kingdom: England', 'Europe: United Kingdom: Northern Ireland', 'Europe: United Kingdom: Scotland', 'Europe: United Kingdom: Wales'. Select these rows by holding the **CTRL** key and left click each one of these row numbers (16, 31, 32, 33, 34) until all of them are grey. While on top of one of the selected rows, **right click** without holding the CTRL key anymore and select **Delete** from the context menu to remove them. You should be left with 54 rows now including the header.



There is. We can remove the undesired rows programmatically. Let's get back to the drawing board!

Upload exercise2_2_convert_to_matrix_with_exclusions.ipynb into Google Colab via the File->Upload a notebook option

import pandas as pd
<pre># Read the CSV data into a DataFrame census_data = pd.read_csv('/content/ODMG01EW_NON_UK_LTLA.csv')</pre>
<pre># Define the countries we do not want to include exclusions = ['Does not apply', 'Europe: United Kingdom: England', 'Europe: United Kingdom: Northern Ireland', 'Europe: United Kingdom: Scotland', 'Europe: United Kingdom: Wales']</pre>
<pre># Filter out the rows where 'Migrant country one year ago (60 categories) (detailed) label' matches any of the exclusions census_data = census_data[~census_data['Migrant country one year ago (60 categories) (detailed) label'].isin(exclusions)]</pre>
<pre># Create a pivot table with 'Migrant country one year ago' as rows, # 'Lower tier local authorities label' as columns, and 'Count' as values pivot_table = census_data.pivot_table(index='Migrant country one year ago (60 categories) (detailed) label', columns='Lower tier local authorities label', values='Count', aggfunc='sum', fill_value=0)</pre>
Write the pivot table to a new CSV file pivot table.to csv('/content/ODMG01EW NON UK LTLA matrix excl.csv')

If you want to repeat and slightly adjust the steps from Exercise 1 you can follow the instructions of the following 8 slides.

- While in cell B60, start typing =LARGE(
- Using your keyboard arrow keys go up to B54 which is the last row with data. Press CTRL+Shift+UP simultaneously and Excel will select all rows up to the top.
- We don't want the first row as it's just the column header. While holding **Shift** key use your **down arrow** until the selection reaches **B2**.
- The formula should now be =LARGE(B2:B54. Large function accepts a final argument which allows to select the first largest, second largest etc. Type ,1) and press Enter.
- The complete formula must be **=LARGE(B2:B54,1)** and the result in B60 should be **22**.

- We need to find an easy way to repeat this formula for all columns.
- Click on any column in row 54 (the last row containing data). While holding CTRL use the right arrow key. The active cell should now be the last one LT54.
- Move your cursor a bit further down to LT60 which is the same row with the formula we created earlier. Type anything in, e.g. a number like 1. Press CTRL+Left key and the cursor should be move back to our formula cell B60.

- Use CTRL+SHIFT+Right key to select all columns in row 54 up to column LT.
- Press F2 to enter Edit mode and Excel will automatically move the cursor back to B60 while keeping the cells selection active. Use CTRL+Enter to apply the formula. All columns in row 60 should now contain the largest number for each column (local authority).
- Repeat the process in B61 finding the second largest head count. The initial formula should be =LARGE(B2:B54,2). Expand the formula to LT60 as before.

	A	В	С	D	E	F	G	Н	1	J	К	L	M	N	0	Р	Q	R
23	Europe: Other Europe: EU countries: Member countries in March 2001: Ireland	6	8	4	10	4	8	2	13	89	6	6	13	29	2	23	32	15
24	Europe: Other Europe: EU countries: Member countries in March 2001: Italy	11	4	8	7	16	4	5	237	184	24	3	10	53	5	95	104	46
25	Europe: Other Europe: EU countries: Member countries in March 2001: Other member countries in March 2001	15	15	19	27	8	45	12	64	396	20	17	26	63	14	224	100	63
26	Europe: Other Europe: EU countries: Member countries in March 2001: Portugal (including Madeira and the Azores)	2	5	2	28	2	24	4	104	120	13	0	9	43	1	32	33	40
27	Europe: Other Europe: EU countries: Member countries in March 2001: Spain (including Canary Islands)	22	16	23	44	39	29	26	105	214	68	11	43	65	34	221	92	44
28	Europe: Other Europe: Rest of Europe: Other Europe	11	8	9	55	15	25	16	141	309	28	7	48	29	9	139	42	71
29	Europe: Other Europe: Rest of Europe: Turkey	1	12	6	9	3	9	5	22	138	7	12	13	19	11	28	18	25
30	Middle East and Asia: Central Asia	0	0	0	0	0	1	0	0	10	0	3	0	9	1	2	1	8
31	Middle East and Asia: Eastern Asia: China	6	3	6	6	3	6	10	15	131	6	4	10	17	7	158	13	23
32	Middle East and Asia: Eastern Asia: Hong Kong (Special Administrative Region of China)	11	2	4	7	4	36	5	17	414	4	3	12	48	7	157	28	32
33	Middle East and Asia: Eastern Asia: Other Eastern Asia	4	9	3	8	4	5	2	9	229	11	7	9	12	8	84	7	13
34	Middle East and Asia: Middle East: Iran	1	0	0	2	0	3	1	2	180	5	0	3	0	1	8	13	4
35	Middle East and Asia: Middle East: Iraq	2	1	0	4	1	0	0	0	5	4	0	2	1	1	6	1	1
36	Middle East and Asia: Middle East: Other Middle East	7	29	24	35	25	72	23	50	586	25	45	48	133	11	158	83	72
37	Middle East and Asia: South-East Asia: Malaysia	4	0	0	3	0	2	1	4	42	6	3	8	3	1	32	4	5
38	Middle East and Asia: South-East Asia: Other South-East Asia	6	7	6	28	13	23	14	9	94	18	7	19	25	10	71	35	38
39	Middle East and Asia: South-East Asia: Philippines	3	4	1	5	4	7	3	14	74	5	20	33	52	0	58	10	21
40	Middle East and Asia: South-East Asia: Singapore	0	8	0	4	0	9	3	2	30	3	0	3	8	0	70	3	17
41	Middle East and Asia: Southern Asia: Afghanistan	1	0	0	0	0	4	3	21	20	2	1	0	0	0	1	2	3
42	Middle East and Asia: Southern Asia: Bangladesh	1	1	2	4	0	3	0	193	28	2	4	8	2	0	1	29	10
43	Middle East and Asia: Southern Asia: India	5	3	3	9	18	52	6	257	372	22	21	108	263	7	153	188	108
44	Middle East and Asia: Southern Asia: Other Southern Asia	1	0	2	0	0	89	0	5	24	0	0	1	35	0	6	3	16
45	Middle East and Asia: Southern Asia: Pakistan	2	1	2	9	1	6	0	112	61	7	1	11	14	1	9	33	13
46	Middle East and Asia: Southern Asia: Sri Lanka	0	0	0	1	4	0	0	10	27	0	5	6	6	3	6	12	12
47	Other	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0	1	0
48	The Americas and the Caribbean: Central America: All Central American countries	1	1	2	6	1	2	1	0	38	6	0	0	5	0	7	9	3
49	The Americas and the Caribbean: North America: Canada	4	10	14	8	2	17	11	11	80	11	4	10	22	2	46	18	17
50	The Americas and the Caribbean: North America: Other North America	0	0	1	2	0	0	0	0	1	0	0	0	0	0	4	2	0
51	The Americas and the Caribbean: North America: United States	11	15	31	41	15	33	32	28	274	36	10	25	80	16	155	62	42
52	The Americas and the Caribbean: South America: All South American countries	16	10	4	15	2	9	1	10	135	9	1	22	40	2	40	29	35
53	The Americas and the Caribbean: The Caribbean: Jamaica	0	0	0	0	0	1	0	4	7	0	0	7	2	0	0	7	6
54	The Americas and the Caribbean: The Caribbean: Other Caribbean	1	3	7	6	1	12	6	7	25	4	0	10	10	0	5	9	12
55																		
56																		
57																		
58																		
59																		
60		22	29	31	105	39	122	33	257	586	193	86	108	263	66	224	188	199
61		17	22	31	62	25	89	32	237	414	81	45	106	133	35	221	160	108
62																		

- We now need to match the numbers to the countries. For this purpose we will use a slightly more complex Excel formula.
- We will combine two Excel functions into one formula:
 - **INDEX**: returns a value based on the intersection of a row and column position within a given range
 - MATCH: returns the relative position of an item within a given range

 Go to cell B62 and type in the following formula: =INDEX(\$A\$2:\$A\$54,MATCH(B60,B2:B54,0))

An array of values that contain the labels of the countries.

Notice the dollar sign. It instructs Excel to treat the values as fixed. It can become especially handy in situations when we want to apply auto-fill but want to keep this part of the formula fixed. **B60** is the look-up value which we want to match against the look-up array.

B2:B54 is the look-up array defined as a range of cells.

0 is the match type. Zero tells Excel to find the first value that is exactly equal to look-up value.

- Apply the auto-fill for formula in B62 in the exact same way as we did before to find the largest number.
- Go to cell B63 and repeat the process with B62 as our lookup value in order to find the second most popular countries of origin. **=INDEX(\$A\$2:\$A\$54,MATCH(B61,B2:B54,0))**
- Apply the auto-fill

Exercises with download data You should now be able to see the top two countries for each lower tier local authority.

Α	в	с	D	F	E F
Ta Antarctica and Oceania: Australasia: Other Australasia		0	0	0	0 (
5 Antarrina and Oreania: Other Oreania and Antarrina		0	0	0	0
Findered on the Cecurity of the Countries that joined the EU between April 2001 and March 2011; Lithuania		3	0	0	16
The proper other Europe El countries countries that joined the El between April 2001 and March 2011; Other El countries		14 2	2	20 1	105 25
Europe: Other Europe: El countries: Countries that Joined the El between April 2001 and March 2011: Poland		17	5	15	62 11
Example: Chief Europe: El countries: Countries that joined the El between April 2001 and March 2011; Bomania		0 1	0	7	48 24
Europe: Other Europe: El countries: Countries that Joined the El between April 2001 and March 2001; Croatia		0	0	0	0 0
California Cher Europe: El countries: Member countries in March 2001: France		11	9	20	37 12
22 Europe: Other Europe: El countries: Member countries in March 2001: Germany		2	5	24	19 11
22 Europe: Other Europe: EU countries: Member countries in March 2001; Icaland		5	0	4	10
22 Europe: Other Europe: El countries: Member countries in March 2001; Italy		11	A	0	7 16
Car Langer, Other Europe, Cli Countries, Member countries in Wards 2001; Other member countries in March 2001		15 1	5	10	27 5
22 Europe: Other Europe: El countries: Member countries in March 2001: Dort member countries in March 2001			5	2	20 1
22 Europe, Other Europe, EU countries: Member countries in March 2001; Couge (including Maderle and the Ables)			c	2	44 20
27 Europe, Other Europe, Do contracts, Memory other Countries in Ward (2001, Spain (Including Canary Islands)			0	25	44 55
20 Europe, Other Europe, Rest of Europe, Other Europe			2	6	35 1
Mildle Green Concept Rest on Langue Turkey			0	0	-
Jo miloure East and Asia. Certifial Asia 24 Mildule East and Asia. Certifial Asia		6	2	6	6
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22 Windule East and Asia. Eastern Asia. Hong Kong (Special Administrative Region of China)	GORIN	11	2	-4	-
Midule Edst and Asid. Edstein Asid. Other Edstein Asid	officier	4	0		
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57 Middle East and Asia: South-East Asia: Malaysia	whole a	4	7	0	3 (
So Middle East and Asia: South-East Asia: Uner South-East Asia				0	28 13
Middle East and Asia: South-East Asia: Philippines		3	*	1	5 2
All Middle East and Asia: South-East Asia: Singapore			3	0	4 (
A Middle East and Asia: Southern Asia: Anghanistan			1	0	0 0
42 Middle East and Asia: Southern Asia: Bangladesh			2	2	4 (
43 Middle East and Asia: Southern Asia: India		5	3	3	9 18
44 Middle East and Asia: Southern Asia: Other Southern Asia			1	2	0 1
Middle East and Asia: Southern Asia: Pakistan		2	2	2	9
40 Mildole East and Asia: Southern Asia: Sh Lanka		0		0	1 2
47 Orner 			1	0	
40 The Americas and the Caribbean: Ventral America: An Central American countries			2	2	0 1
The Americas and the Caribbean: North America: Canada The Americas and the Caribbean: North America: Canada		4 1		14	8 4
Storme Americas and the Caribbean: North America: Other North America			r	1	2 0
The Americas and the Caribbean: North America: United States		11 1	3	31	41 15
Se The Americas and the Carlobean's bound America: All South American countries		10 1		4	15 4
The Americas and the Caribbean: The Caribbean: Jamaica			2		C 1
The Americas and the Canobean. The Canobean: Other Canobean		1	<u>></u>		<u> </u>
57					
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		22		21 4	105 20
ou targest		22 2		31 1	05 35
o Second largest	Constant Other Frances Fill constained Marshare statistics in Marsh 2001, Casia (including Constant)	1/ 2 Addella Facto and Asia: Addella Facto Others Addella F	Anteresting and Oceanics Asstallation to the	31	02 25
	Europe, Other Europe, Ed. Countries: Member Countries in March 2001: Spain (including Canary Islands)	Suppose Other Suppose Still assets Other Middle East	Antarctica and Oceania: Australiasia: Australia	Europe:	or Europe: C
op becond largest	Europe, other Europe, co-countries: countries that joined the Eo between April 2001 and March 2011: Poland	Europe: Other Europe: EU countries: Countries that Joined the EU b	2 Antarctica and Oceania: Australasia: Australia	Europe:	. Oreurope: C

Again, there are more efficient methods!

Upload **exercise2_3_top_countries.ipynb** into Google Colab via the File->Upload a notebook option

import pandas as pd

Load the CSV data into a DataFrame census_data = pd.read_csv('/content/ODMG01EW_NON_UK_LTLA.csv')

Define the countries we do not want to include
exclusions = ['Does not apply', 'Europe: United Kingdom: England', 'Europe: United Kingdom: Northern Ireland', 'Europe: United Kingdom: Scotland', 'Europe: United Kingdom: Wales']

Filter out the rows where 'Migrant country one year ago (60 categories) (detailed) label' matches any of the exclusions
census_data = census_data[~census_data['Migrant country one year ago (60 categories) (detailed) label'].isin(exclusions)]

Function to find the top N countries for each local authority
def top_n_countries(group, n=2):
 return group.nlargest(n, 'Count')[['Migrant country one year ago (60 categories) (detailed) label', 'Count']]

Group by 'Lower tier local authorities label' and apply the function top_countries = census_data.groupby('Lower tier local authorities label', group_keys=True).apply(top_n_countries)

Reset index to clean up the DataFrame top_countries = top_countries.reset_index(level=-1, drop=True).reset_index()

Write the pivot table to a new CSV file top_countries.to_csv('/content/ODMG01EW_NON_UK_LTLA_top_countries.csv')

Different methods. Same results.

display(top_countries)

index Lower tier local authorities lab	el Migrant country one year ago (60 categories) (detailed) label	Count
0 Adur	Europe: Other Europe: EU countries: Member countries in March 2001: Spain (including Canary Islands)	22
1 Adur	Europe: Other Europe: EU countries: Countries that joined the EU between April 2001 and March 2011: Poland	17
2 Allerdale	Middle East and Asia: Middle East: Other Middle East	29
3 Allerdale	Europe: Other Europe: EU countries: Countries that joined the EU between April 2001 and March 2011: Other EU countries	22
4 Amber Valley	The Americas and the Caribbean: North America: United States	31
5 Amber Valley	Antarctica and Oceania: Australasia: Australia	31
6 Arun	Europe: Other Europe: EU countries: Countries that joined the EU between April 2001 and March 2011: Other EU countries	105
7 Arun	Europe: Other Europe: EU countries: Countries that joined the EU between April 2001 and March 2011: Poland	62
8 Ashfield	Europe: Other Europe: EU countries: Member countries in March 2001: Spain (including Canary Islands)	39
9 Ashfield	Europe: Other Europe: EU countries: Countries that joined the EU between April 2001 and March 2011: Other EU countries	25
10 Ashford	Africa: Central and Western Africa: Nigeria	122
11 Ashford	Middle East and Asia: Southern Asia: Other Southern Asia	89
12 Babergh	Europe: Other Europe: EU countries: Member countries in March 2001: France	33
13 Babergh	The Americas and the Caribbean: North America: United States	32
14 Barking and Dagenham	Middle East and Asia: Southern Asia: India	257
15 Barking and Dagenham	Europe: Other Europe: EU countries: Member countries in March 2001: Italy	237
16 Barnet	Middle East and Asia: Middle East: Other Middle East	586
17 Barnet	Middle East and Asia: Eastern Asia: Hong Kong (Special Administrative Region of China)	414
18 Barnsley	Europe: Other Europe: EU countries: Countries that joined the EU between April 2001 and March 2011: Romania	193
19 Barnsley	Europe: Other Europe: EU countries: Countries that joined the EU between April 2001 and March 2011: Poland	81
20 Barrow-in-Furness	Africa: Central and Western Africa: Nigeria	86
21 Barrow-in-Furness	Middle East and Asia: Middle East: Other Middle East	45
22 Basildon	Middle East and Asia: Southern Asia: India	108
23 Basildon	Africa: Central and Western Africa: Nigeria	106
24 Basingstoke and Deane	Middle East and Asia: Southern Asia: India	263