

THE BATTLE OF NEIGHBOURHOODS

Edinburgh and Glasgow

Two major cities in Scotland

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- ▶ Edinburgh and Glasgow are the two major cities in Scotland, situated one in the East side and other in the West side of the country.
 - ▶ Edinburgh is Scotland's second most populous city and the seventh most populous in the United Kingdom. Main tourism destination of Scotland.
 - ▶ Glasgow is the most populous city in Scotland, and the third most populous city in the United Kingdom. Urban and Modern Glasgow in a major centre of business and residency in Scotland.
- ▶ There is a historical rivalry between these great cities, and both competing in public services, entertainment, touristic attractions, and in attracting businesses to their constituencies.

EDINBURGH AND GLASGOW

- ▶ This report aims to analyse these two great neighbour cities, based on data available online, their business and services, to understand the difference or commonalities of both, and their future development.
- ▶ The main objective is to understand how wide is the difference of both cities (Edinburgh and Glasgow), neighbourhood similarities and differences, top businesses flourishing (in numbers), understanding the population and their behaviour pattern, along with type of businesses that are popular (and the least ones) in their neighbourhoods
- ▶ The target audience for this analysis are, city business developers, local authorities, local people (to understand the facilities provided by their cities and their differences), people intending to re-locate to these cities, people that look for new business opportunities.

HOW SIMILAR (OR DIFFERENT) ARE THESE CITIES?

- ▶ The datasets used to analyse the city of Edinburgh and Glasgow comes from the following data sources:
 - ▶ City postcodes, provided by Wikipedia containing each city postcodes and their catchment neighbourhoods
 - ▶ City postcodes location (latitude, longitude), provided by freemaptools
 - ▶ Information of local businesses, types and locations for each city postcode area, obtained using Foursquare API, via a subscription to the Foursquare site.

DATA ACQUISITION AND CLEANING

This process involved two steps:

- ▶ First step - Postcode data, with the longitude and latitude for both cities. From freemaptools website, a single CSV file containing all the postcodes for the UK. Dataset contained 3003 rows and 4 columns. The column id, was dropped.
- ▶ Second step - download information from the Wikipedia page of postcodes belonging to Edinburgh and Glasgow. BeautifulSoup library used for data extraction.
 - ▶ A pandas dataframe with three columns (postcode, post town, neighbourhood) was the result of the clean and transformation process in this step.
- ▶ From the above processes, three datasets were resulted:
 - ▶ UK Postcodes with longitude and latitude
 - ▶ Postcodes with neighbourhoods for Edinburgh
 - ▶ Postcodes with neighbourhoods for Glasgow

DATA ACQUISITION AND CLEANING

Number of Cities' Neighbourhood groups:

- ▶ For Edinburgh, 23 neighbourhoods groups based on their postcodes were analysed.
- ▶ For Glasgow, 55 neighbourhoods groups based on their postcodes were obtained, however only 50 neighbourhood groups provided available venue data, therefore only 50 were analysed.

DATA ACQUISITION AND CLEANING

Several thin, parallel white lines of varying lengths and orientations are positioned in the bottom right corner of the slide, creating a modern, abstract graphic element.

For the feature selection

- ▶ A merge of data relevant for Edinburgh and Glasgow was produced based on previous datasets. Below sample datasets

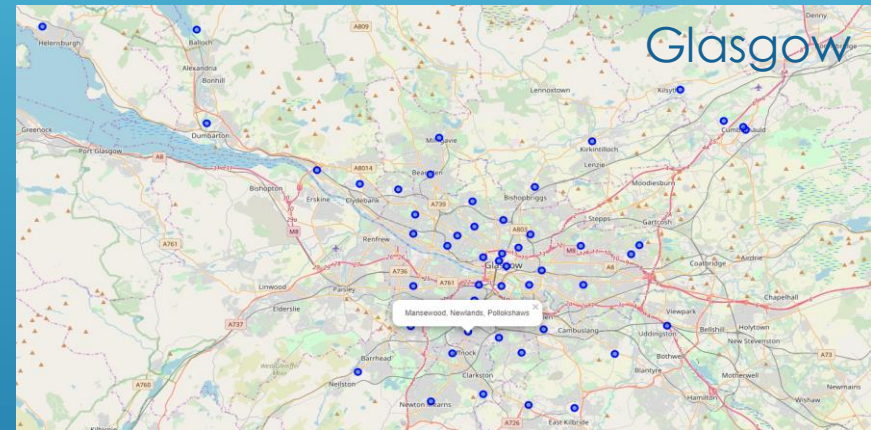
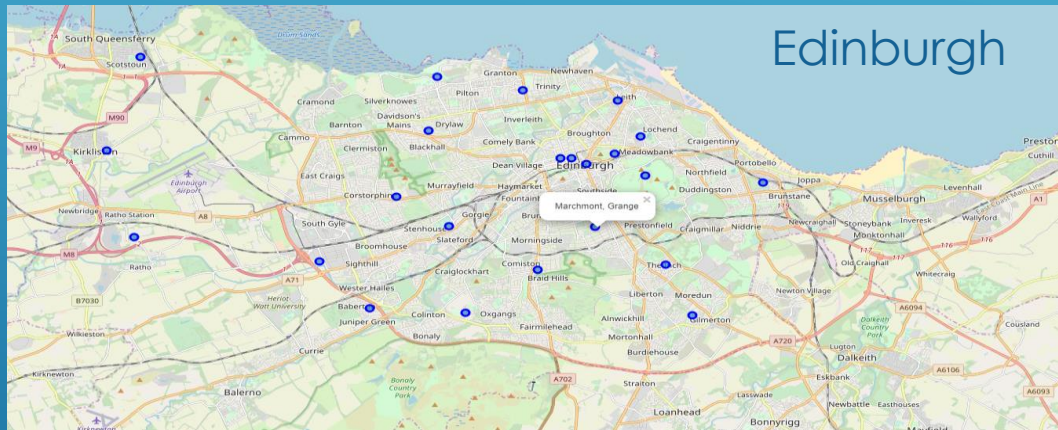
	postcode	latitude	longitude	post town	neighborhood
0	EH1	55.952430	-3.188400	EDINBURGH	Old Town, GPO, St. James Centre
1	EH10	55.920770	-3.209840	EDINBURGH	A702, Bruntsfield, Morningside, Fairmilehead
2	EH11	55.933870	-3.248670	EDINBURGH	A71, Haymarket, Gorgie, Stenhouse, Sighthill, ...
3	EH12	55.942620	-3.271370	EDINBURGH	A8, Murrayfield, Corstorphine, Gyle
4	EH13	55.907880	-3.241440	EDINBURGH	Colinton, Oxgangs
5	EH14	55.909250	-3.283080	BALERNO, CURRIE, EDINBURGH, JUNIPER GREEN	Slateford, Longstone, Wester Hailes, Juniper G...
6	EH15	55.946860	-3.111360	EDINBURGH	Portobello, Duddingston
7	EH16	55.922210	-3.153870	EDINBURGH	Liberton, Cameron Toll, Craigmillar, Niddrie
8	EH17	55.907040	-3.142220	EDINBURGH	Gilmerton, Moredun, Mortonhall
9	EH2	55.954170	-3.194860	EDINBURGH	New Town, Princes Street
10	EH28	55.930600	-3.386240	NEWBRIDGE	Newbridge, Ratho
11	EH29	55.956520	-3.398380	KIRKLISTON	Kirkliston
12	EH3	55.954120	-3.199670	EDINBURGH	Queen Street, Stockbridge, West End, Tollcross...
13	EH30	55.984550	-3.383360	SOUTH QUEENSFERRY	South Queensferry
14	EH4	55.962530	-3.257610	EDINBURGH	Dean Village, Comely Bank, A90, Barnton, Cramo...

	postcode	latitude	longitude	post town	neighborhood
0	G1	55.860380	-4.246710	GLASGOW	Merchant City
1	G11	55.873560	-4.311420	GLASGOW	Broomhill, Partick, Partickhill
2	G12	55.880060	-4.300610	GLASGOW	West End, Dowanhill, Hillhead, Hyndland, Kelvi...
3	G13	55.893580	-4.346200	GLASGOW	Anniesland, Knightswood, Yoker
4	G14	55.880950	-4.348640	GLASGOW	Whiteinch, Scotstoun
5	G15	55.909400	-4.364760	GLASGOW	Drumchapel
6	G2	55.863820	-4.254900	GLASGOW	Blythswood Hill, Anderston
7	G20	55.885800	-4.281760	GLASGOW	Maryhill, North Kelvinside, Ruchill
8	G21	55.880630	-4.220690	GLASGOW	Balornock, Barmulloch, Cowlares, Royston, Spri...
9	G22	55.889980	-4.250020	GLASGOW	Milton, Parkhouse, Possilpark
10	G23	55.901930	-4.284310	GLASGOW	Lambhill, Summerston
11	G3	55.866190	-4.272620	GLASGOW	Anderston, Finnieston, Garnethill, Park, Woodl...
12	G31	55.857480	-4.208190	GLASGOW	Dennistoun, Haghill, Parkhead
13	G32	55.848400	-4.162930	GLASGOW	Carmyle, Tollcross, Mount Vernon, Lightburn, S...
14	G33	55.873510	-4.165930	GLASGOW	Cardowan, Carntyne, Craigend, Cranhill, Gartha...

DATA ACQUISITION AND CLEANING

Data Visualisation (Mapping)

- ▶ From the data collected and processed for Edinburgh and Glasgow, a visualisation technique is used to plot the locations of the neighbourhood of these two cities.
- ▶ The library used is Folium (plot in a geographical map using location latitude and longitude) of Edinburgh and Glasgow Neighbourhoods.



METHODOLOGY

Location-based Data Gathering and Analysis (Foursquare API)

- information processed and obtained for each city are: list of business/services provided for each neighbourhood, number of business/services per neighbourhood, frequency of type of business/services per neighbourhood, and the 10 most common venues per neighbourhood.

	neighborhood	American Restaurant	Aquarium	Argentinian Restaurant	Art Gallery	Art Museum	Arts & Crafts Store	Asian Restaurant	Auto Garage	Baby Store	...	Tram Station	Vegetarian / Vegan Restaurant	Whisky Bar	Wine Bar	Wine Shop
0	A702, Bruntsfield, Morningside, Fairliehead, ...	0.00	0.000000	0.00	0.000000	0.00	0.0	0.00	0.00	0.0	...	0.0	0.000000	0.000000	0.000000	0.2
1	A71, Haymarket, Gorgie, Steinhouse, Sighthill, ...	0.00	0.000000	0.00	0.000000	0.00	0.0	0.00	0.25	0.0	...	0.0	0.000000	0.000000	0.000000	0.0
2	A8, Murrayfield, Corstorphine, Gyle	0.00	0.000000	0.00	0.000000	0.00	0.0	0.00	0.00	0.0	...	0.0				
3	Colinton, Oxgangs	0.00	0.000000	0.00	0.000000	0.00	0.0	0.00	0.00	0.0	...	0.0				
4	Dean Village, Comely Bank, A90, Barmston, Cramo...	0.00	0.000000	0.00	0.000000	0.00	0.0	0.00	0.00	0.0	...	0.0				
5	Gilmerton, Moredun, Mortonhall	0.00	0.000000	0.00	0.000000	0.00	0.0	0.00	0.00	0.0	...	0.0				
6	Granton, Firth of Forth, Ferry Road	0.00	0.000000	0.00	0.000000	0.00	0.2	0.00	0.00	0.0	...	0.0				
7	Jobcentre Plus	0.00	0.000000	0.00	0.000000	0.00	0.0	0.00	0.00	0.1	...	0.1				
8	Kirkliston	0.00	0.000000	0.00	0.000000	0.00	0.0	0.00	0.00	0.0	...	0.0				
9	Leith, Newhaven	0.00	0.000000	0.00	0.037037	0.00	0.0	0.00	0.00	0.0	...	0.0				
10	Liberton, Cameron Toll, Craigmillar, Niddrie	0.00	0.000000	0.00	0.000000	0.00	0.0	0.00	0.00	0.0	...	0.0				
11	Marchmont, Grange	0.00	0.000000	0.00	0.000000	0.00	0.0	0.00	0.00	0.0	...	0.0				
12	New Town, Princes Street	0.01	0.000000	0.01	0.040000	0.01	0.0	0.01	0.00	0.0	...	0.0				
13	Newbridge, Ratho	0.00	0.000000	0.00	0.000000	0.00	0.0	0.00	0.00	0.0	...	0.0				
14	Old Town, GPO, St. James Centre	0.00	0.000000	0.01	0.030000	0.00	0.0	0.00	0.00	0.0	...	0.0				
15	Portobello, Duddingston	0.00	0.000000	0.00	0.000000	0.00	0.0	0.00	0.00	0.0	...	0.0				
16	Queen Street, Stockbridge, West End, Tollcross...	0.01	0.000000	0.01	0.020000	0.01	0.0	0.00	0.00	0.0	...	0.0				

Edinburgh

	neighborhood	American Restaurant	Art Gallery	Asian Restaurant	Athletics & Sports	Auto Garage	BBQ Joint	Bagel Shop	Bakery	Bar	...	Tennis Court	Thai Restaurant	Theater	Toy / Game Store	Trail	Train Station
0	Alexandria, Arrochar, Aldochlay, Ardlui, Ballo...	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.000000	0.000000	...	0.0	0.000000	0.000000	0.000000	0.000000	0.000000
1	Anderston, Finnieston, Garnethill, Park, Woodl...	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.025	0.000000	0.150000	...	0.0	0.000000	0.025000	0.000000	0.000000	0.000000
2	Annieisland, Knightswood, Yoker	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.000000	0.000000	...	0.0	0.000000	0.000000	0.000000	0.000000	0.000000
3	Arden, Camwadrac, Deaconsbank, Giffnock, Kenn...	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.000000	0.000000	...	0.0	0.000000	0.000000	0.000000	0.000000	0.000000
4	Auldhous, East Kilbride	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.000000	0.000000	...	0.0	0.000000	0.000000	0.000000	0.000000	0.000000
5	Baillieston, Bargeddie, Chryston, Garrowhill, ...	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.000000	0.000000	...	0.0	0.000000	0.000000	0.000000	0.000000	0.000000
6	Baldernock, Milngavie, Mugdock	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.090909	0.090909	...	0.0	0.000000	0.000000	0.000000	0.090909	0.000000
7	Balfron, Balmaha, Blaneield, Croftamie, Dryme...	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.000000	0.000000	...	0.0	0.000000	0.000000	0.000000	0.000000	0.000000
8	Balnornock, Barmulloch, Cowlairs, Royston, Spr...	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.000000	0.000000	...	0.0	0.000000	0.000000	0.000000	0.000000	0.500000
9	Barrhead, Neilston, Uplawmoor	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.000000	0.000000	...	0.0	0.000000	0.000000	0.000000	0.000000	0.000000
10	Battlefield, Govanhill, Mount Florida, Strathb...	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.000000	0.400000	...	0.2	0.000000	0.000000	0.000000	0.000000	0.200000

Glasgow

METHODOLOGY

Location-based Data Gathering and Analysis (Foursquare API)

- information processed and obtained for each city are: list of business/services provided for each neighbourhood, number of business/services per neighbourhood, frequency of type of business/services per neighbourhood, and the 10 most common venues per neighbourhood.

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5	Gilmerton, Moredun, Mortonhall	0.00	0.000000	0.00	0.000000	0.00	0.0	0.00	0.00	0.0	...	0.0				
6	Granton, Firth of Forth, Ferry Road	0.00	0.000000	0.00	0.000000	0.00	0.2	0.00	0.00	0.0	...	0.0				
7	Jobcentre Plus	0.00	0.000000	0.00	0.000000	0.00	0.0	0.00	0.00	0.1	...	0.1				
8	Kirkliston	0.00	0.000000	0.00	0.000000	0.00	0.0	0.00	0.00	0.0	...	0.0				
9	Leith, Newhaven	0.00	0.000000	0.00	0.037037	0.00	0.0	0.00	0.00	0.0	...	0.0				
10	Liberton, Cameron Toll, Craigmillar, Niddrie	0.00	0.000000	0.00	0.000000	0.00	0.0	0.00	0.00	0.0	...	0.0				
11	Marchmont, Grange	0.00	0.000000	0.00	0.000000	0.00	0.0	0.00	0.00	0.0	...	0.0				
12	New Town, Princes Street	0.01	0.000000	0.01	0.040000	0.01	0.0	0.01	0.00	0.0	...	0.0				
13	Newbridge, Ratho	0.00	0.000000	0.00	0.000000	0.00	0.0	0.00	0.00	0.0	...	0.0				
14	Old Town, GPO, St. James Centre	0.00	0.000000	0.01	0.030000	0.00	0.0	0.00	0.00	0.0	...	0.0				
15	Portobello, Duddingston	0.00	0.000000	0.00	0.000000	0.00	0.0	0.00	0.00	0.0	...	0.0				
16	Queen Street, Stockbridge, West End, Tollcross...	0.01	0.000000	0.01	0.020000	0.01	0.0	0.00	0.00	0.0	...	0.0				

Edinburgh

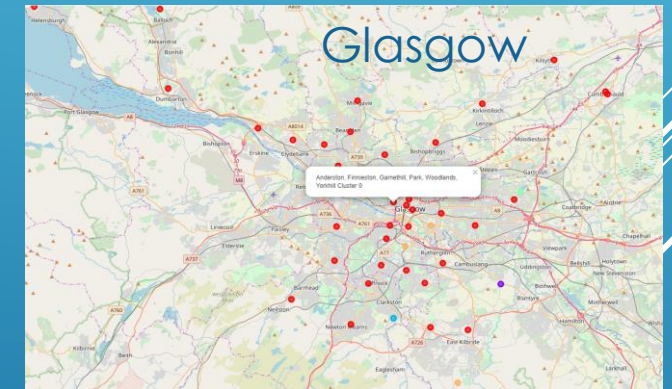
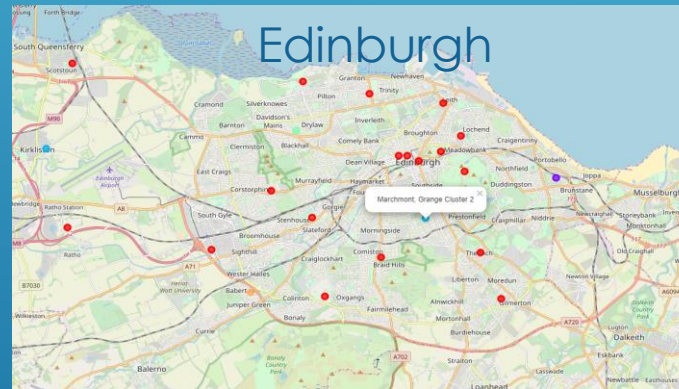
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0	Alexandria, Arrochar, Aldochlay, Ardlui, Ballo...	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.000000	0.000000	...	0.0	0.000000	0.000000	0.000000	0.000000	0.000000
1	Anderston, Finnieston, Garnethill, Park, Woodl...	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.025	0.000000	0.150000	...	0.0	0.000000	0.025000	0.000000	0.000000	0.000000
2	Annieisland, Knightswood, Yoker	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.000000	0.000000	...	0.0	0.000000	0.000000	0.000000	0.000000	0.000000
3	Arden, Camwadrac, Deaconsbank, Giffnock, Kenn...	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.000000	0.000000	...	0.0	0.000000	0.000000	0.000000	0.000000	0.000000
4	Auldhous, East Kilbride	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.000000	0.000000	...	0.0	0.000000	0.000000	0.000000	0.000000	0.000000
5	Baillieston, Bargeddie, Chryston, Garrowhill, ...	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.000000	0.000000	...	0.0	0.000000	0.000000	0.000000	0.000000	0.000000
6	Baldernock, Milngavie, Mugdock	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.090909	0.090909	...	0.0	0.000000	0.000000	0.000000	0.090909	0.000000
7	Balfron, Balmaha, Blaneisland, Croftamie, Dryme...	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.000000	0.000000	...	0.0	0.000000	0.000000	0.000000	0.000000	0.000000
8	Balnornock, Barmulloch, Cowlares, Royston, Spr...	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.000000	0.000000	...	0.0	0.000000	0.000000	0.000000	0.000000	0.500000
9	Barrhead, Neilston, Uplawmoor	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.000000	0.000000	...	0.0	0.000000	0.000000	0.000000	0.000000	0.000000
10	Battlefield, Govanhill, Mount Florida, Strathb...	0.000000	0.000000	0.000000	0.000	0.000000	0.000000	0.000	0.000000	0.400000	...	0.2	0.000000	0.000000	0.000000	0.000000	0.200000

Glasgow

METHODOLOGY

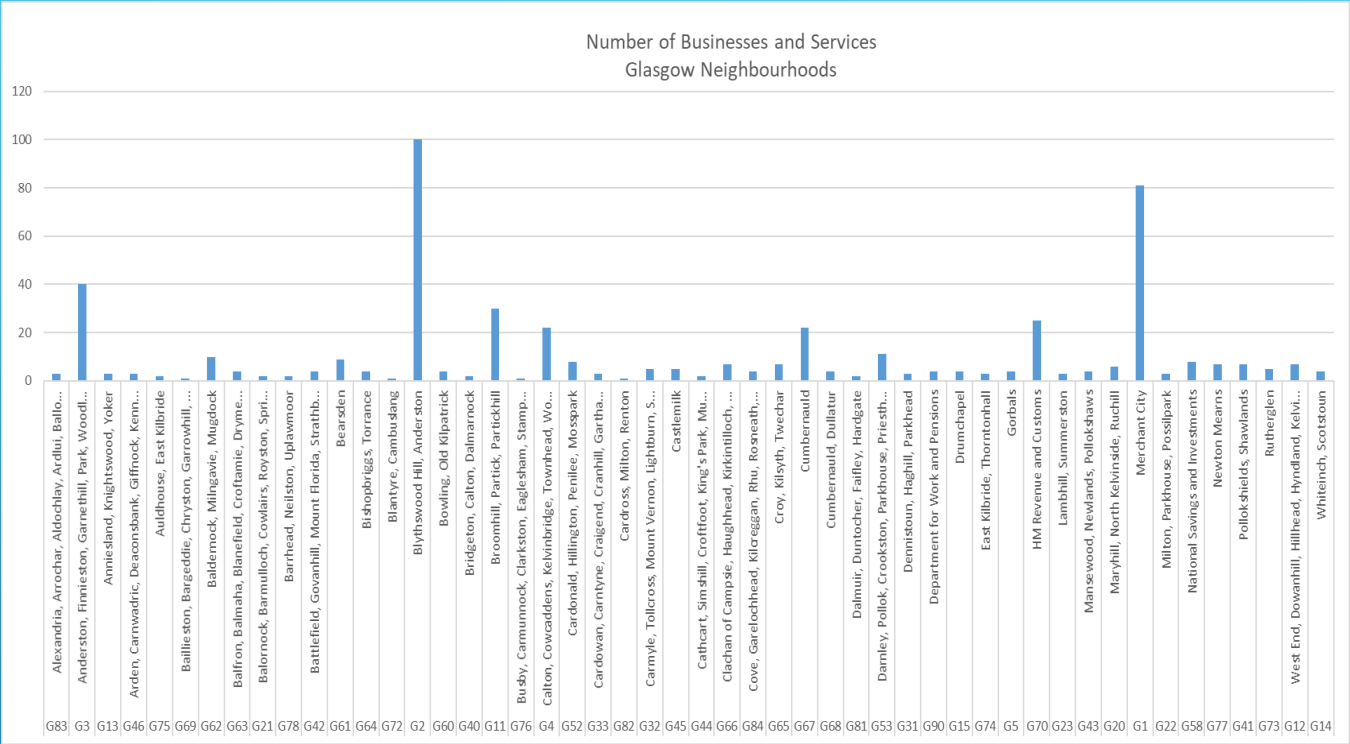
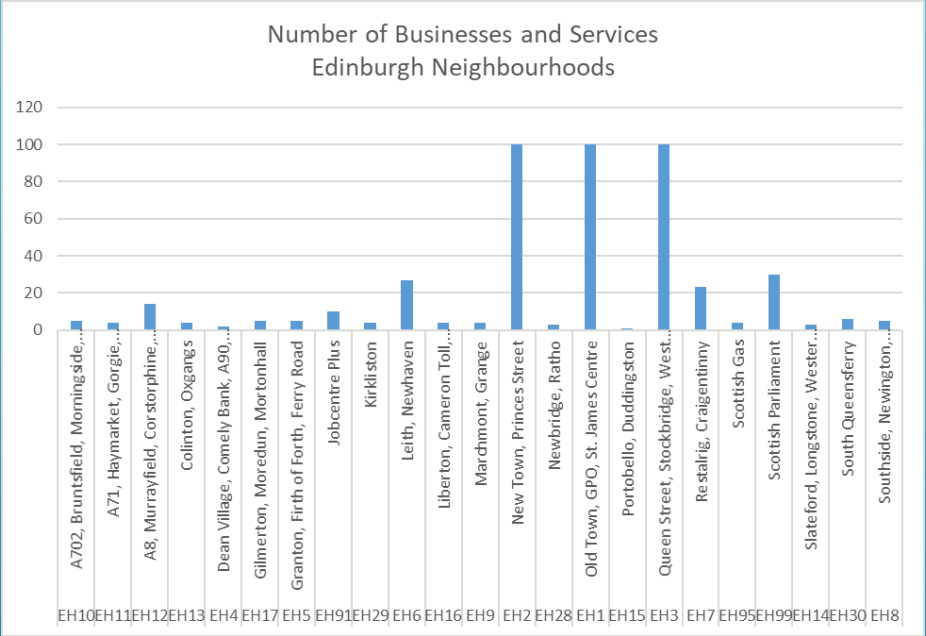
Segmentation and Clustering (K-Means)

- ▶ K-Means is an unsupervised learning algorithm used for clustering problems, and popular for cluster analysis in data mining. Various real-world applications, e.g.: customer segmentation, pattern recognition, and, data compression.
- ▶ The number of clusters used in this project is 5 (K value).
- ▶ The datasets for Edinburgh and Glasgow used with the K-mean algorithm, were:
 - ▶ Each city dataset that was previously grouped in rows by neighbourhood, and by taking the mean of the frequency of occurrence of each business/services category.
 - ▶ A new data frame created by using the K-means cluster labels results and the top 10 venues for each city's neighbourhood.



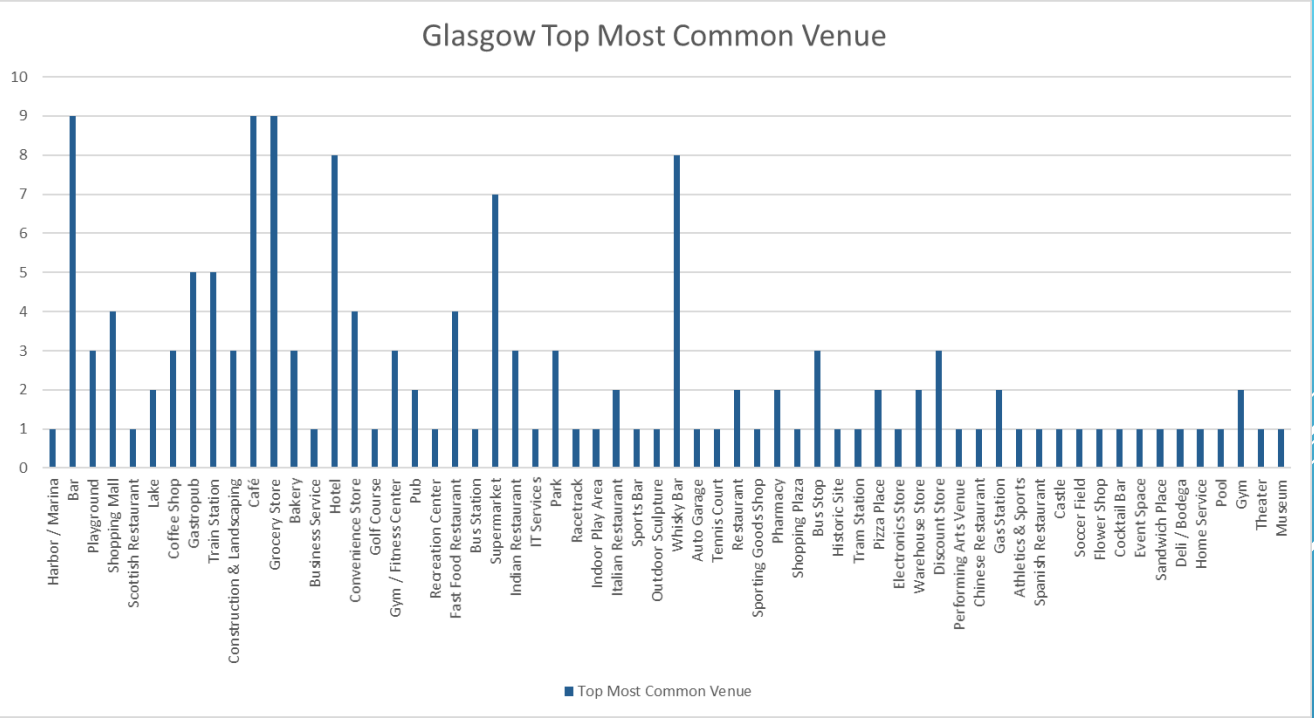
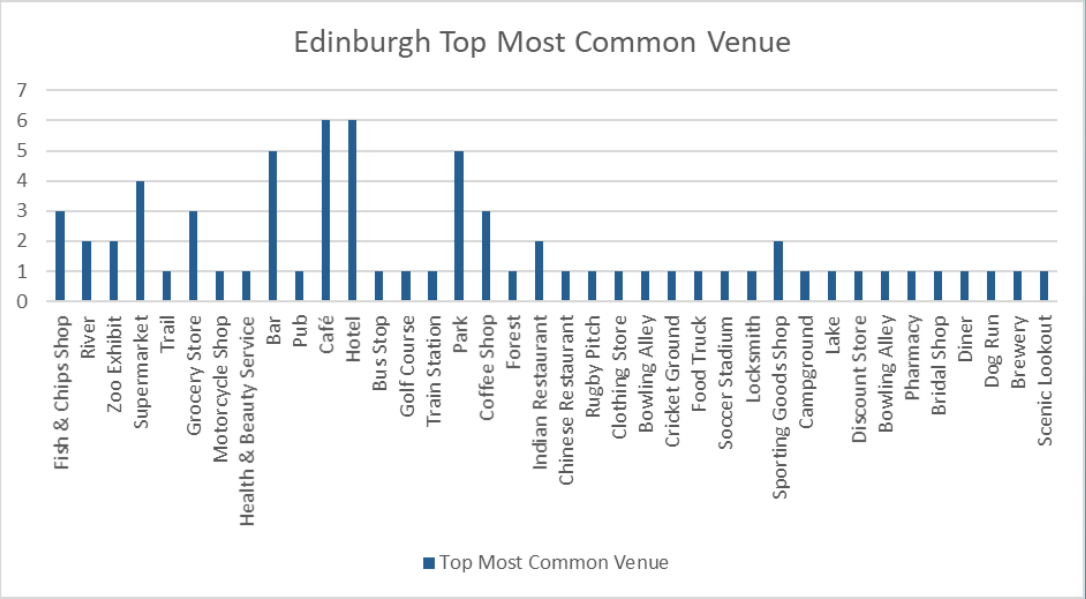
METHODOLOGY

1. Business-thrived neighbourhoods



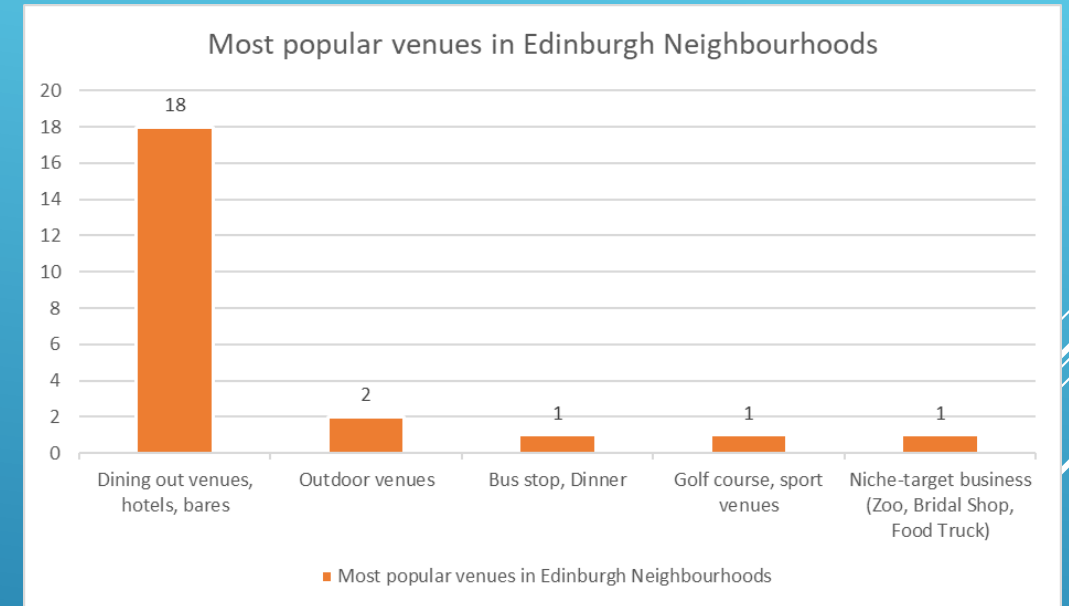
RESULTS

2. Most common business types



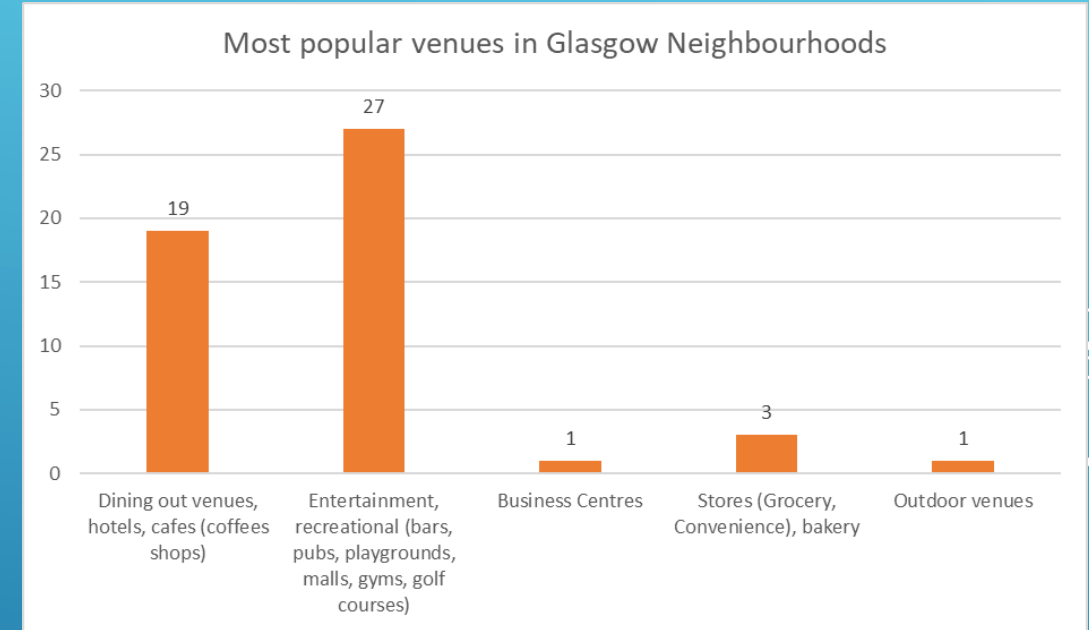
RESULTS

Edinburgh



RESULTS

Glasgow



RESULTS

- ▶ Edinburgh and Glasgow, are two major cities of Scotland. Glasgow, as the largest city in Scotland provides a large data set of business types compare to Edinburgh, however the difference between these two cities were not as wider as expected.
- ▶ The most popular business and services provided by both cities are of similar nature: dining-out venues, restaurants, bars, pubs, cafes and hotels. Clearly explained, as both are major touristic destinations of Scotland.
- ▶ The difference, explained from the data, is in the scale and number of neighbourhoods and target people:
 - ▶ Edinburgh, as being the main historical and touristic destination of Scotland, has a preference for business related to the tourism industry, such as dining-out, entertainment, outdoors venues, sightseeing, parks and lakes , follow by services and businesses that target their local population, such as supermarkets, niche-target businesses, grocery shops and others.
 - ▶ Glasgow as being a larger city, and the more residential city between them, although coincide with Edinburgh in entertainment and dining out venues as the most popular business and services, expands its top interest in venues like supermarkets, malls and playgrounds, therefore orientated more to entertain their local residents. The second most popular business venues includes hotels, cafes, and dining-out venues. Follow by other niche-businesses and outdoor places.

DISCUSSION

- ▶ Both cities offer great business and services to their population and visitors.
 - ▶ If a new investor is interested in setup a business in any of these cities, probably targeting tourism could be ideal in a city like Edinburgh, and targeting the entertainment of local population could be ideal for Glasgow.
- ▶ In both cities, the number of businesses increase the closer is to the city centre.
 - ▶ If new business and service is developed, it will be ideal to target areas that are further than the city centre, however for this it is necessary to understand the size of the population and age targets, which are not covered as part of this analysis.
- ▶ Businesses in the city centre due to the larger number will experience higher competition in both cities.

DISCUSSION

- ▶ From the data analysis, it was understood the similarities of businesses between Edinburgh and Glasgow, but also their difference, and target customers for each of them.
 - ▶ Edinburgh resulted a more tourism-focus due to its high tourism industry, while Glasgow as being a large city for Scottish residents aims to target the local population largely.
- ▶ Although the questions to the problem were answered, there were more questions raised ,such as:
 - ▶ how the population is segmented?
 - ▶ what is the difference in age and gender between the two cities?
 - ▶ and others, such as size of population and incomes?
- ▶ Answering the above could have helped to understand the nature of existing businesses, potential new ones, their numbers and popularities.
- ▶ Although the first steps to analyse the difference of these two cities were provided and achieved in this project, further gathering of information, and analysis of data, will bring more answers, better understanding of patterns present in these two cities, predicting their growth, and others, these could be expanded in future work.

CONCLUSIONS