



House Prices near Outstanding London Schools

IBM DATA SCIENCE CAPSTONE PROJECT

MARCH 2020

Problem for working Parents in London

- When the time comes for first child to go to school, parents are concerned for their primary education
- The education is detrimental to success in life. There is a clear proven correlation
- Not all schools are great
- The catchment is most important criteria for admission into any State School
- Buying a House is a one of the most important investment in life
- Buying within the catchment of Outstanding rated School can be very beneficial for their child(ren)'s future
- Another important factor to consider is the kind of area, parents would like to live in

Approach to Problem

- Data Science methodology to find a balance of all the requirements
- The below data sources to be used for the problem:
 - Ofsted Rating Report from a Government website: <https://reports.ofsted.gov.uk>
 - London Area for enhanced information for the area: https://en.wikipedia.org/wiki/List_of_areas_of_London
 - Property Prices Portal grouped by Postcodes: <https://propertydata.co.uk/cities/london>
- Foursquare Developer API to explore venues in the areas that may help clustering different locations based on venue categories

Outstanding State Primary Schools in London

- Finalised 62 Postcode across London where Ofsted rated Outstanding Primary Schools reside

No. of Schools that had assessment in 2018, 2019 or 2020: 1116
ONLY Primary Schools out of those: 771
ONLY Outstanding Schools out of those: 75
Grouping by PostCode: 62

| | PostCode | Rating | Type | Name |
|---|----------|-------------|---------|---|
| 0 | BR1 | Outstanding | Primary | Burnt Ash Primary School |
| 1 | BR3 | Outstanding | Primary | Clare House Primary School,Harris Primary Acad... |
| 2 | BR5 | Outstanding | Primary | Crofton Junior School |
| 3 | CR0 | Outstanding | Primary | Chestnut Park Primary School,Harris Primary Ac... |
| 4 | CR5 | Outstanding | Primary | Woodcote Primary School |

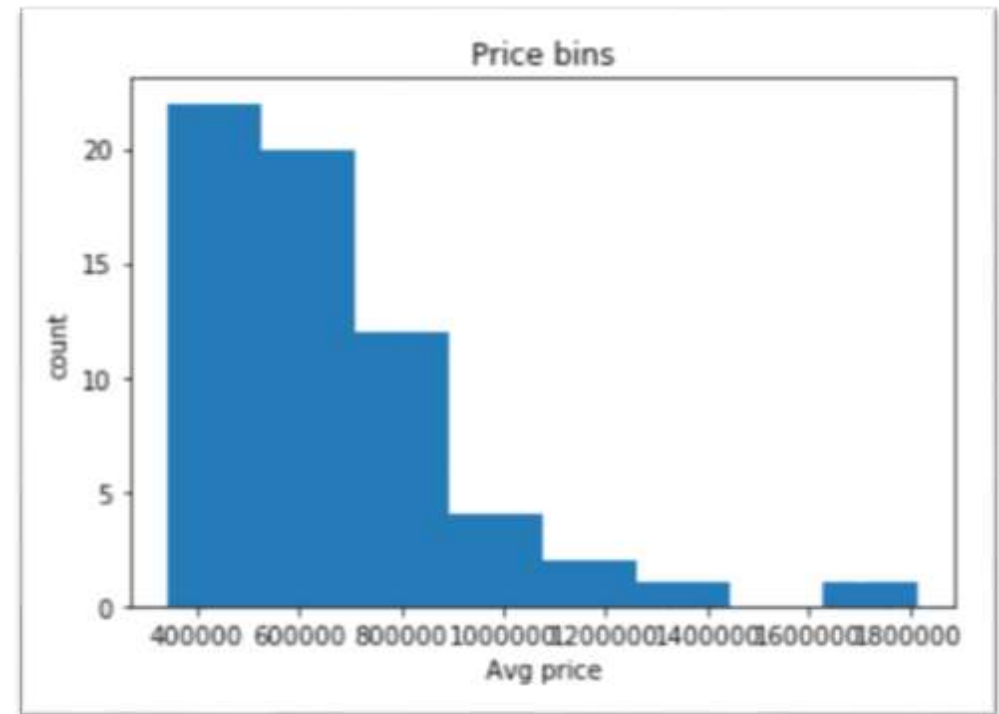
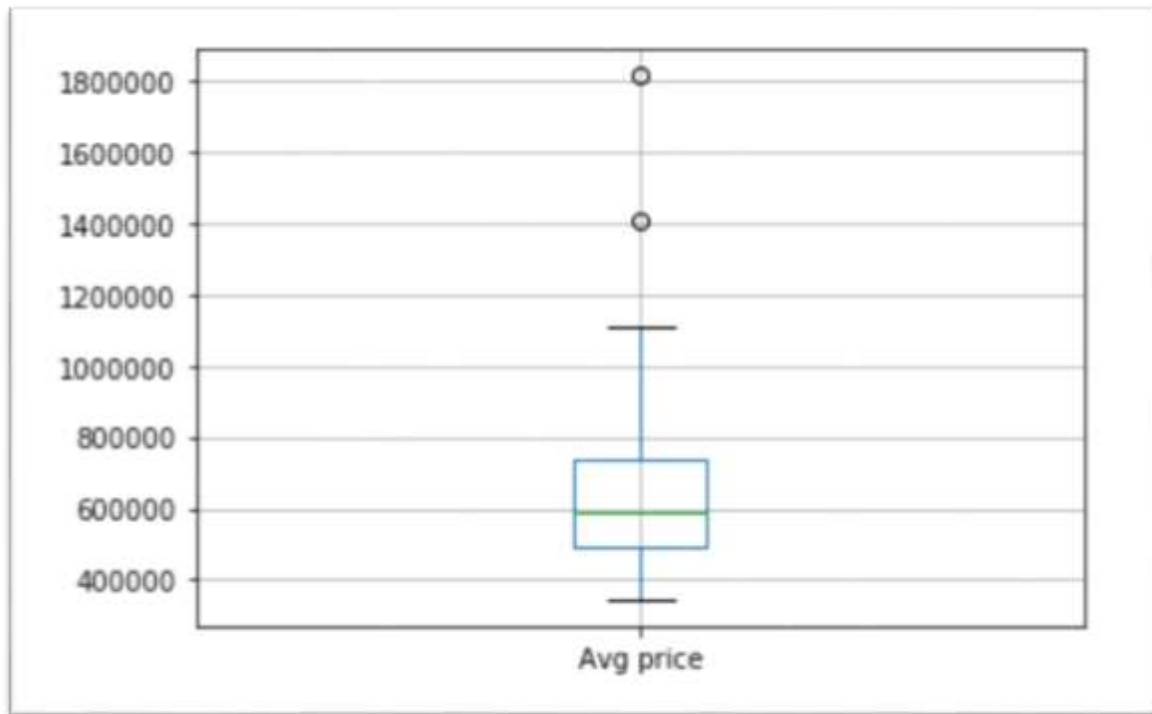
- Need to merge this with House Prices and London areas for further analysis

London Area and House Prices

- Original data table joined with additional London areas and average house prices (included premium of 20%)

| | PostCode | Rating | Type | Name | Location | Borough | Avg price |
|---|----------|-------------|---------|--|---|------------------|-----------|
| 0 | BR1 | Outstanding | Primary | Burnt Ash Primary School | Bromley, Plaistow, Sundridge, Widmore (also Widmo... | Bromley/Lewisham | 447159 |
| 1 | BR3 | Outstanding | Primary | Clare House Primary School, Harris Primary Acad... | Beckenham, Bickley, Bromley Common, Eden Park, Elm... | Bromley | 456224 |
| 2 | BR5 | Outstanding | Primary | Crofton Junior School | Ruxley, Upper Ruxley, Derry Downs, Orpington, Pett... | Bexley/Bromley | 436613 |
| 3 | CR0 | Outstanding | Primary | Chestnut Park Primary School, Harris Primary Ac... | Addington, Addiscombe, Coombe, Croydon, Forestdale... | Croydon/Sutton | 343852 |
| 4 | CR5 | Outstanding | Primary | Woodcote Primary School | Coulsdon, Old Coulsdon | Croydon | 510381 |

Boxplot & Bins for House Prices



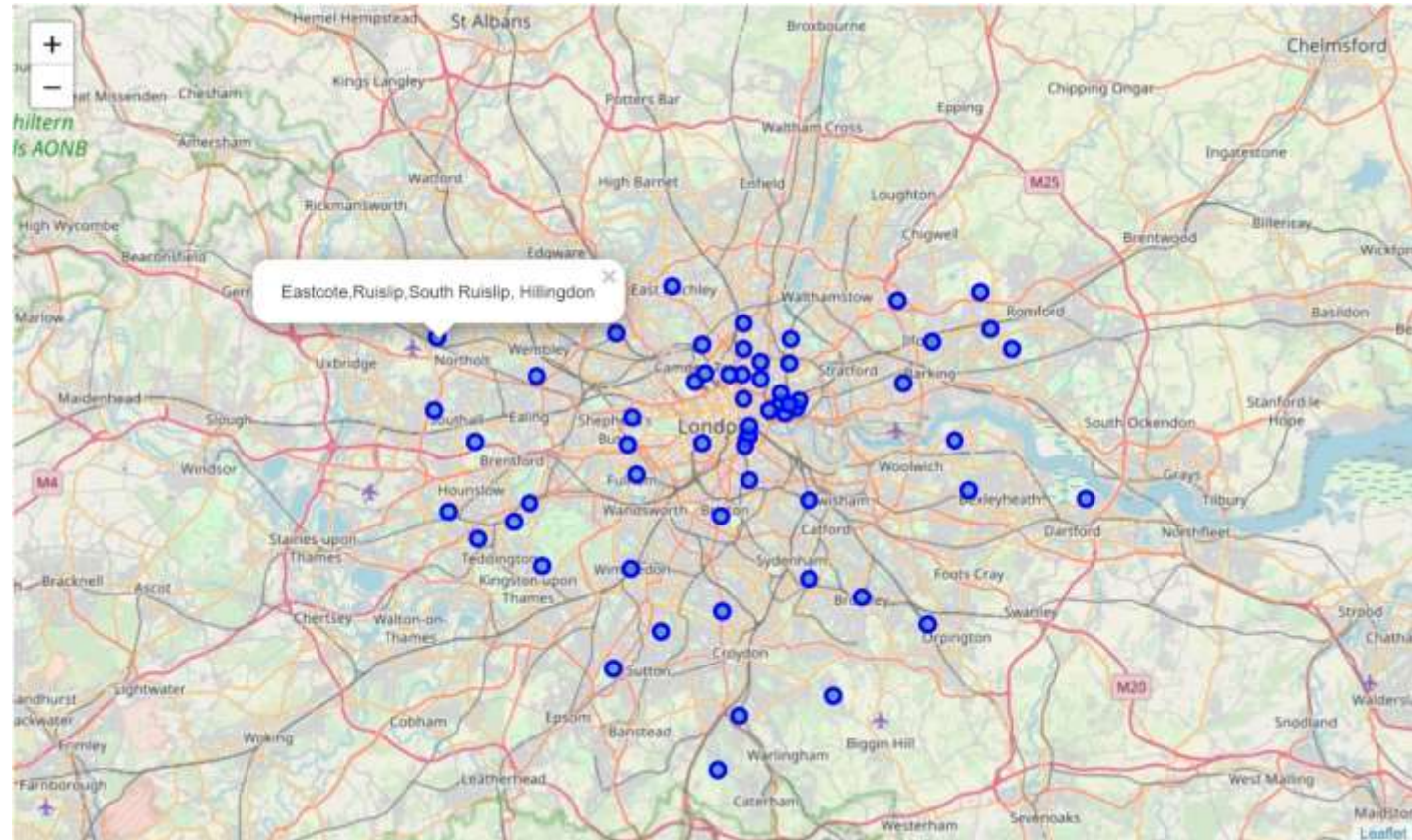
Location Latitude and Longitude

- Added location coordinates for exploring venues via Foursquare API

| | PostCode | Rating | Type | Name | Location | Borough | Avg price | Latitude | Longitude |
|---|----------|-------------|---------|--|---|------------------|-----------|-----------|-----------|
| 0 | BR1 | Outstanding | Primary | Burnt Ash Primary School | Bromley, Plaistow, Sundridge, Widmore (also Widmo... | Bromley/Lewisham | 447159 | 51.404240 | 0.015425 |
| 1 | BR3 | Outstanding | Primary | Clare House Primary School, Harris Primary Acad... | Beckenham, Bickley, Bromley Common, Eden Park, Elm... | Bromley | 456224 | 51.415095 | -0.035403 |
| 2 | BR5 | Outstanding | Primary | Crofton Junior School | Ruxley, Upper Ruxley, Derry Downs, Orpington, Pett... | Bexley/Bromley | 436613 | 51.388315 | 0.078482 |

London map with targeted locations

- London map
- Locations superimposed



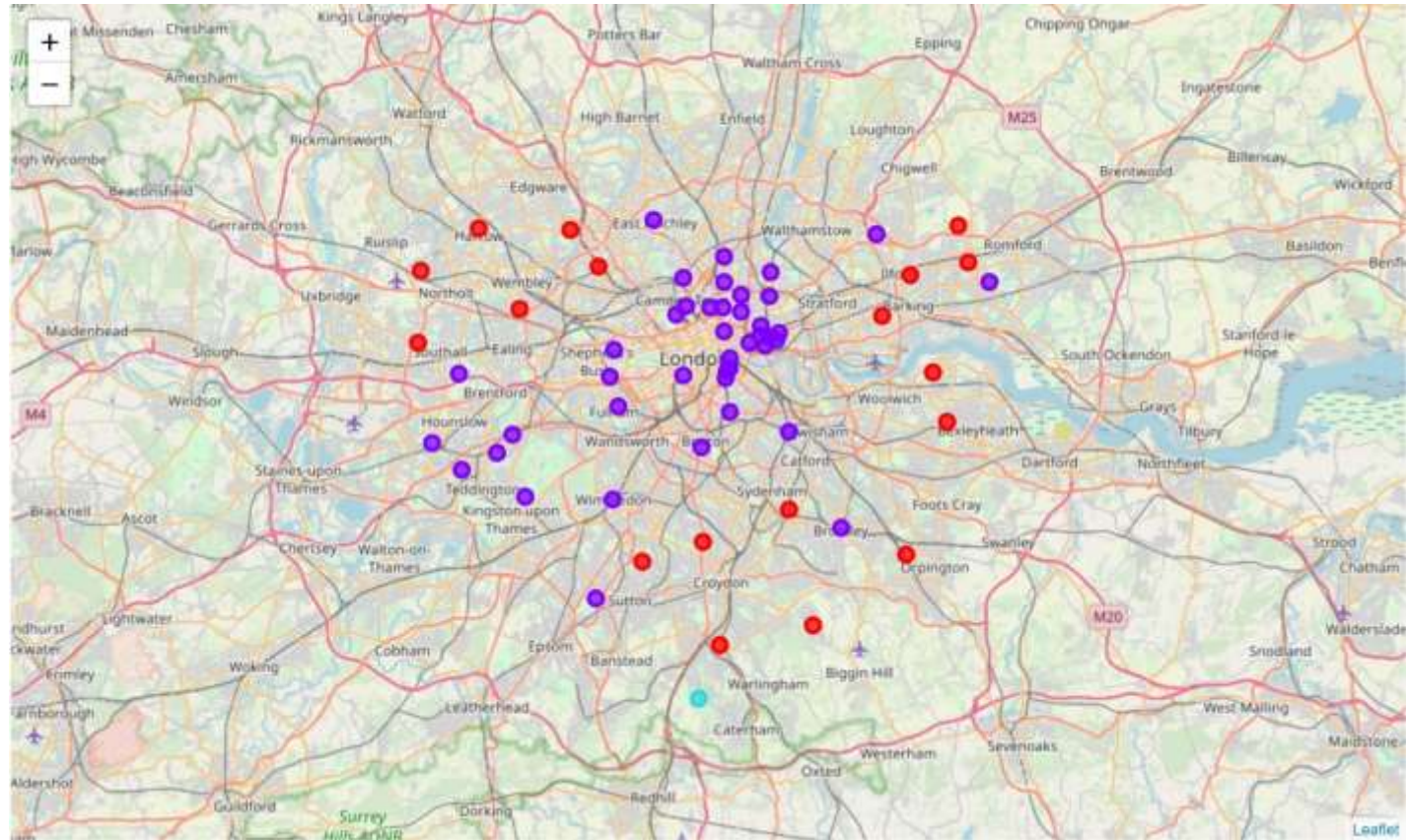
Foursquare API

- Used Foursquare API to find nearest venues within 1000m of each postcode and selected most common venues for those that will help clustering them

| | PostCode | 1st Most Common Venue | 2nd Most Common Venue | 3rd Most Common Venue | 4th Most Common Venue | 5th Most Common Venue | 6th Most Common Venue | 7th Most Common Venue | 8th Most Common Venue | 9th Most Common Venue | 10th Most Common Venue |
|---|----------|-----------------------|----------------------------|--------------------------|-----------------------|-----------------------|------------------------|-----------------------|-----------------------|-----------------------|------------------------|
| 0 | BR1 | Pub | Clothing Store | Coffee Shop | Gym / Fitness Center | Café | Pizza Place | Indian Restaurant | Bar | Burger Joint | Supermarket |
| 1 | BR3 | Grocery Store | Coffee Shop | Train Station | Pizza Place | Park | Bar | Tram Station | Pub | Tapas Restaurant | Bookstore |
| 2 | BR5 | Supermarket | Pub | Mediterranean Restaurant | Coffee Shop | Indian Restaurant | American Restaurant | Fish & Chips Shop | Train Station | Thai Restaurant | Sushi Restaurant |
| 3 | CR0 | Tram Station | Convenience Store | Grocery Store | Supermarket | Home Service | Furniture / Home Store | Gas Station | Farm | Entertainment Service | Ethiopian Restaurant |
| 4 | CR5 | Fish & Chips Shop | Construction & Landscaping | Restaurant | Café | Filipino Restaurant | Ethiopian Restaurant | Event Space | Falafel Restaurant | Farm | Farmers Market |

K-means Clustering ($k = 4$)

- Used K-means clustering
- Unsupervised learning
- Selected k following elbow method
- Superimposed them on map



House Prices in each Cluster

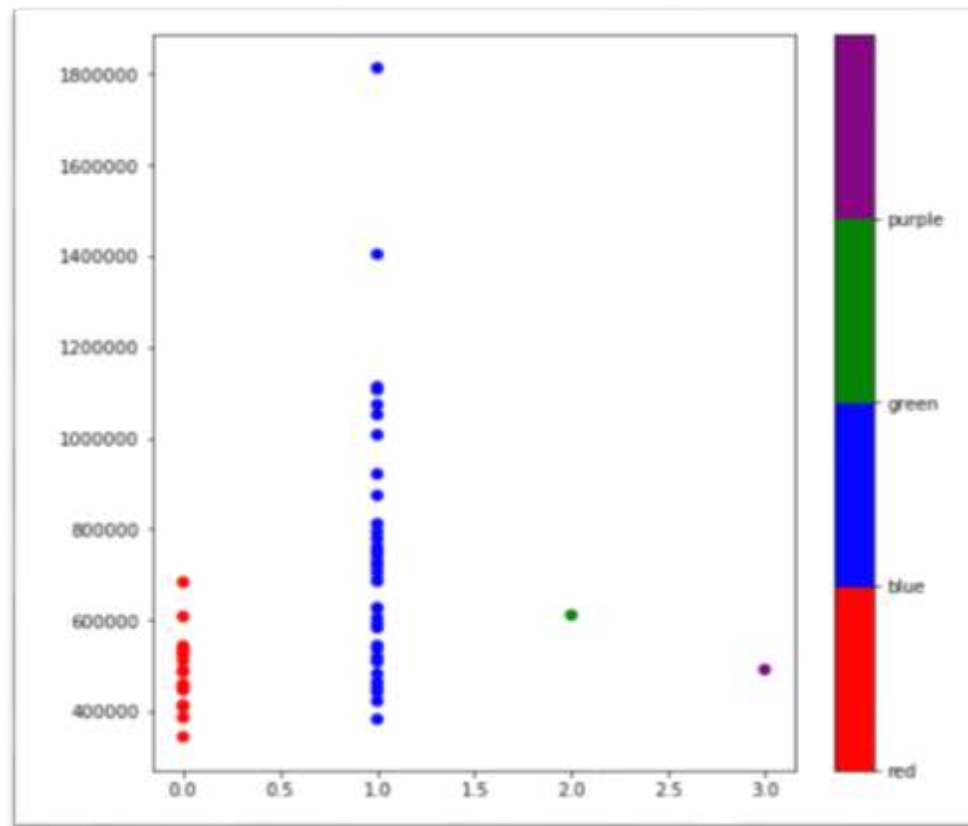
- Each Cluster of area choice for parents is shown with price range for houses

1st Cluster: £300 – 700k

2nd Cluster: £400 – 1.8M

3rd Cluster: £650k

4th Cluster: £500k



London offers enough options to balance between affordability, outstanding primary education for children and preference over certain kind of areas

CONCLUSION