

# High-dimensional analysis of census tracts within the City of Surrey

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## Introduction

**PROJECT:** Economic Development project with the City of Surrey for the University of British Columbia's (UBC) 2017 Data Science for Social Good (DSSG) fellowship program

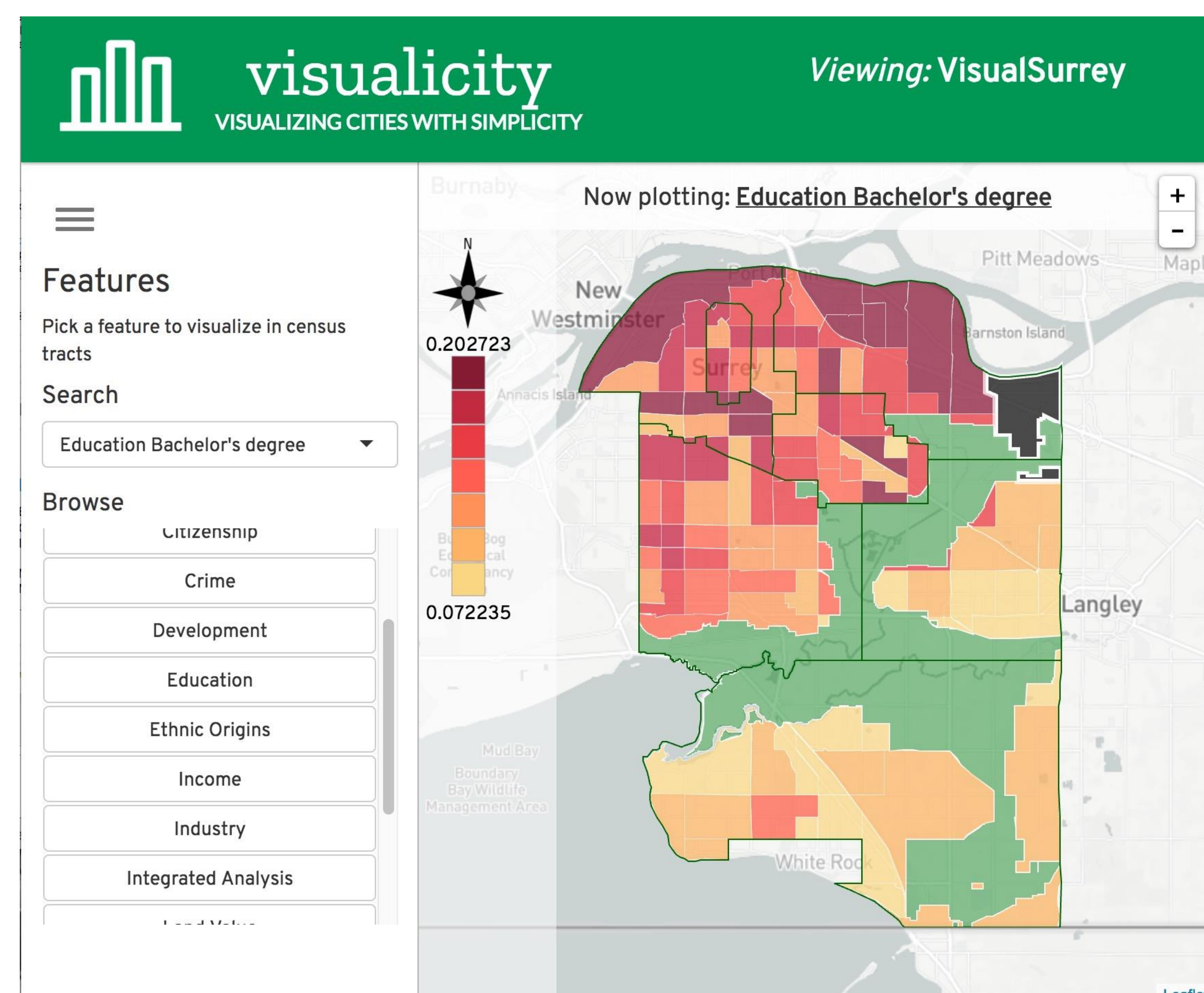
**PURPOSE:** To create an economic profile of Surrey, describing different features which have the potential to affect the economic health of Surrey as a whole and to find out what regions within Surrey (on a census tract level) are distinctive with these different features.

**DATASETS:**

- Geographic data
- 2011 National Household Survey (NHS)
- Business licenses
- Commercial rental listings
- Job postings
- Property assessment data
- Business break and enters
- New building permit data

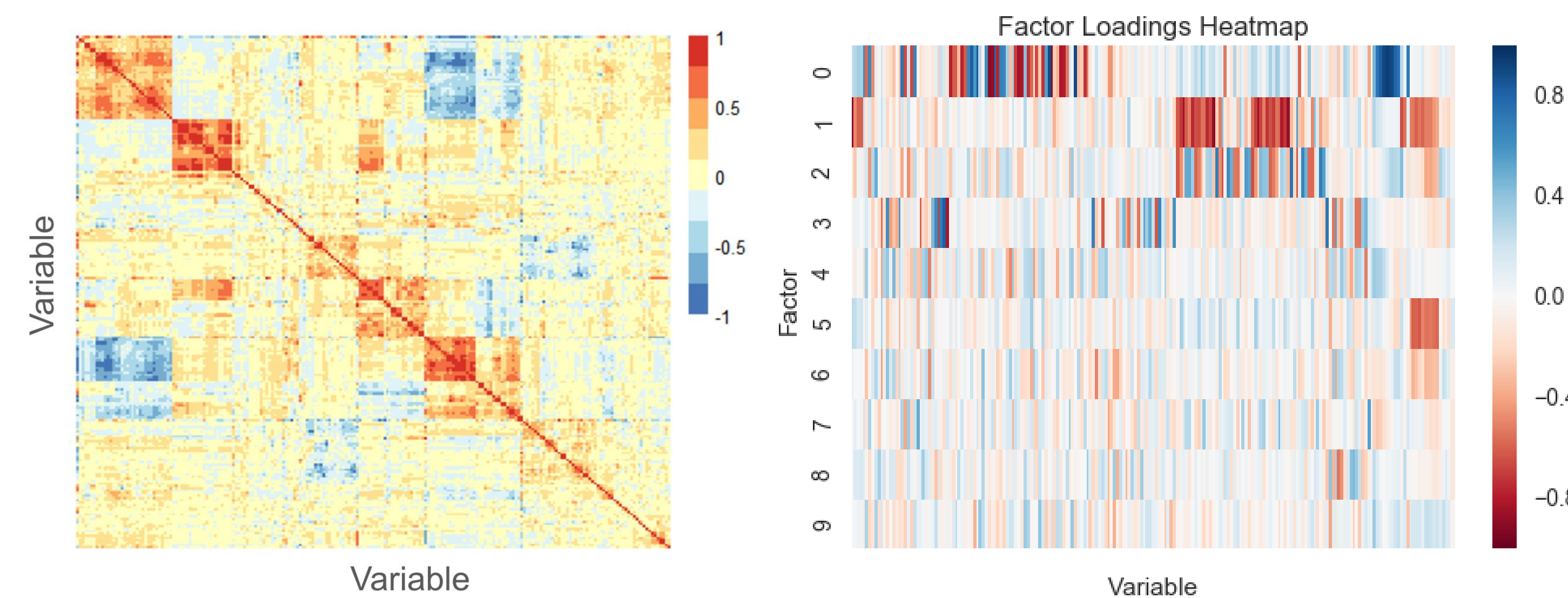
## VisualSurrey allows for visualization of important metrics

- A data visualization platform written in Javascript/Python
- Hosted on Microsoft Azure
- Accessible at [bit.ly/visualsurrey](http://bit.ly/visualsurrey)



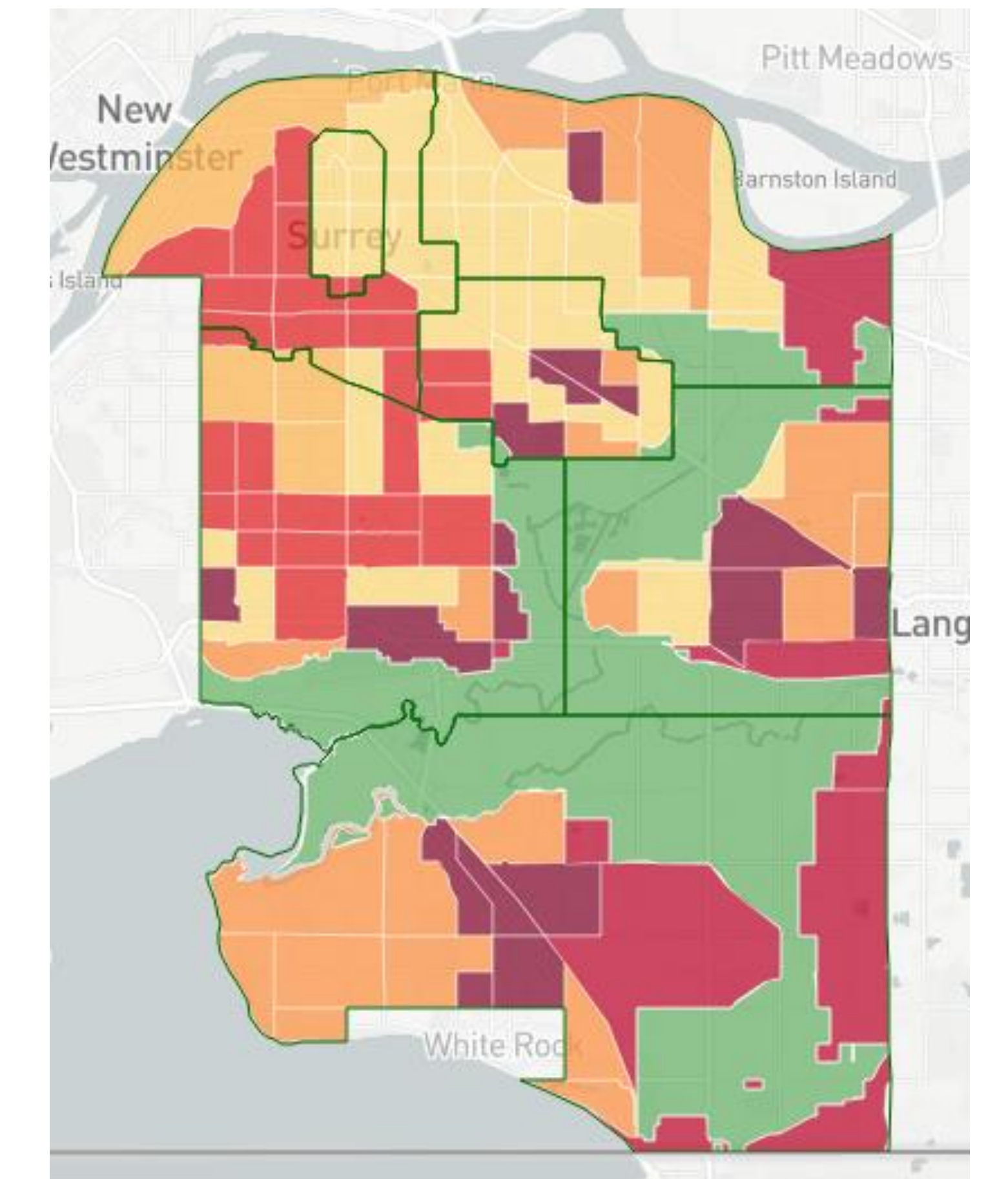
## Automatic removal of redundant variables

- Many variables containing redundant information (*left*)
- Simultaneously reduce dimensionality and remove redundancy with Principle Component Analysis (PCA)
- Decided to use 4 PCs as PC5's loadings appeared to contain redundant information (*right*)



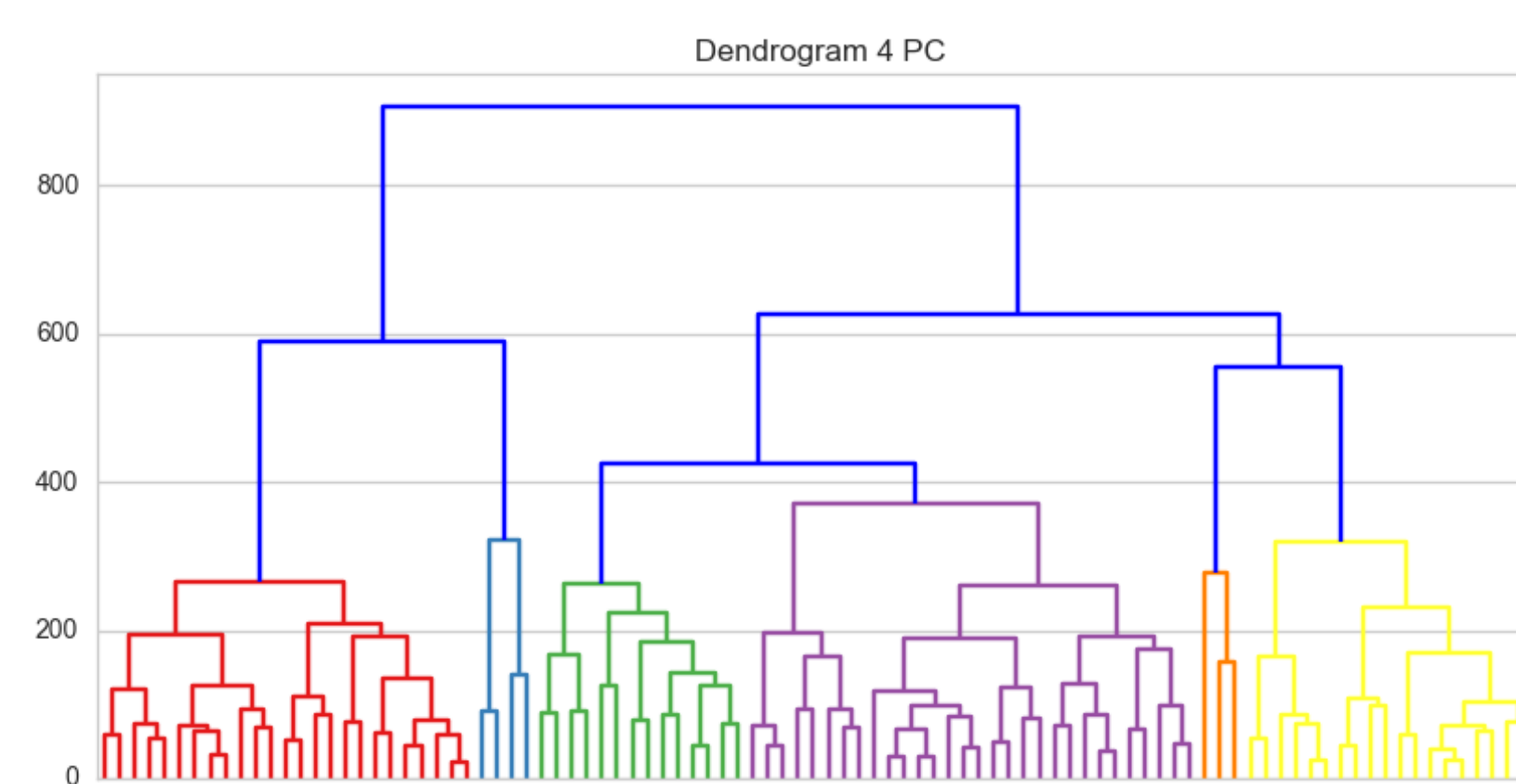
## Towards a new data-driven vocabulary

*Right:* Cluster results visualized in VisualSurrey. Each color represents one cluster. Clusters have a tendency to be grouped together in geographical space. This enables a new vocabulary to describe the different neighborhoods in the City

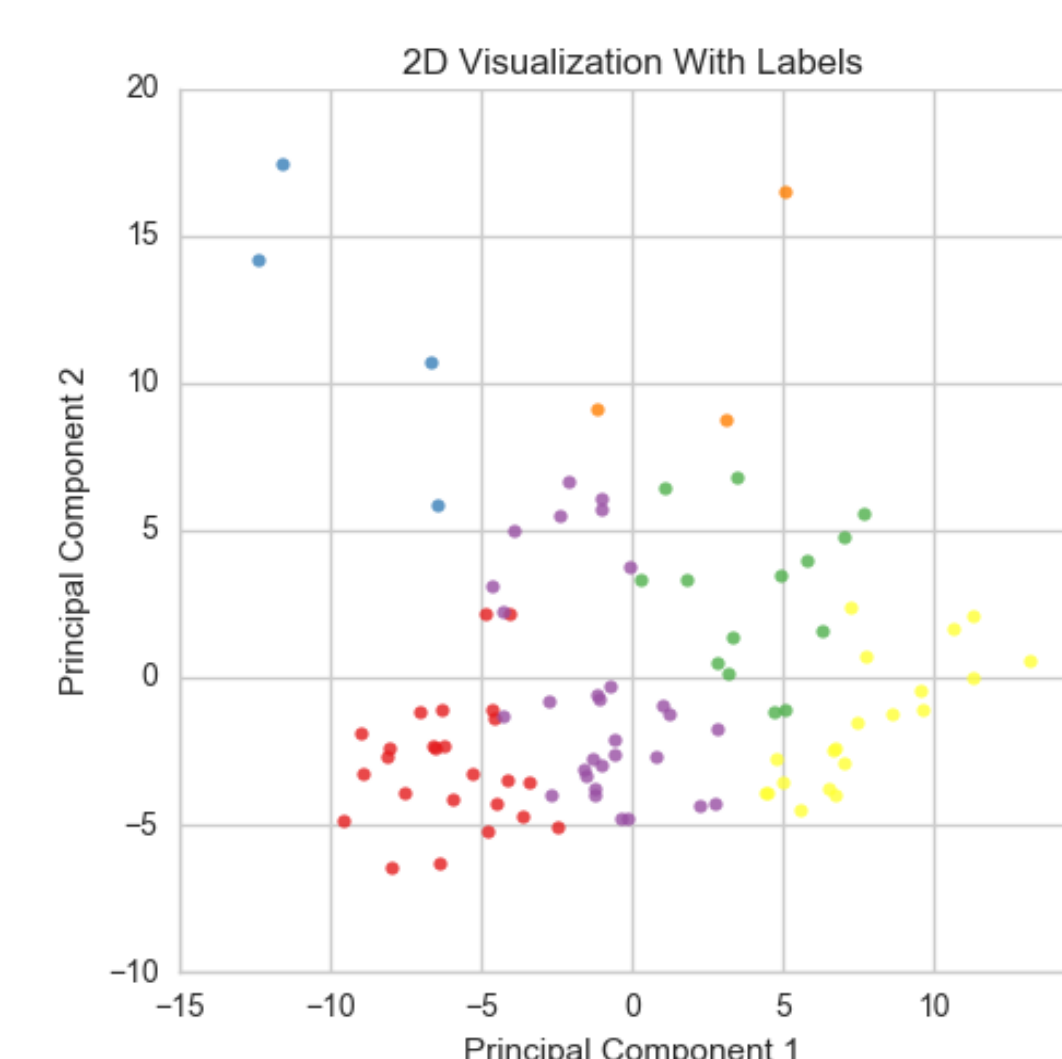


## Hierarchical clustering reveals distinct clusters

- Upon inspection of the resulting dendrogram, we decided to go with 5 clusters (as colored).



*Right:* Validating clustering results in two-dimensional PC space. The individual points represents individual census tracts

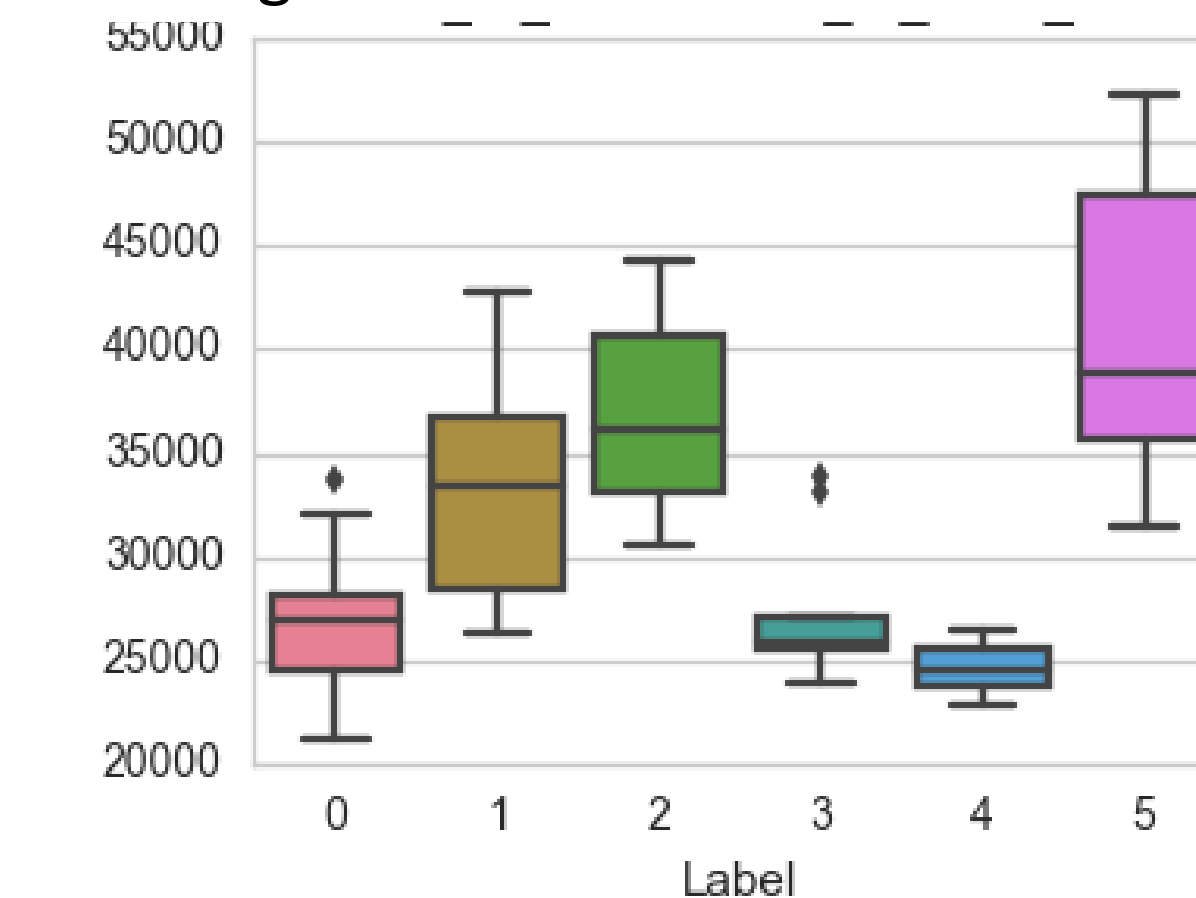


*Right:* High-level descriptions of the clusters

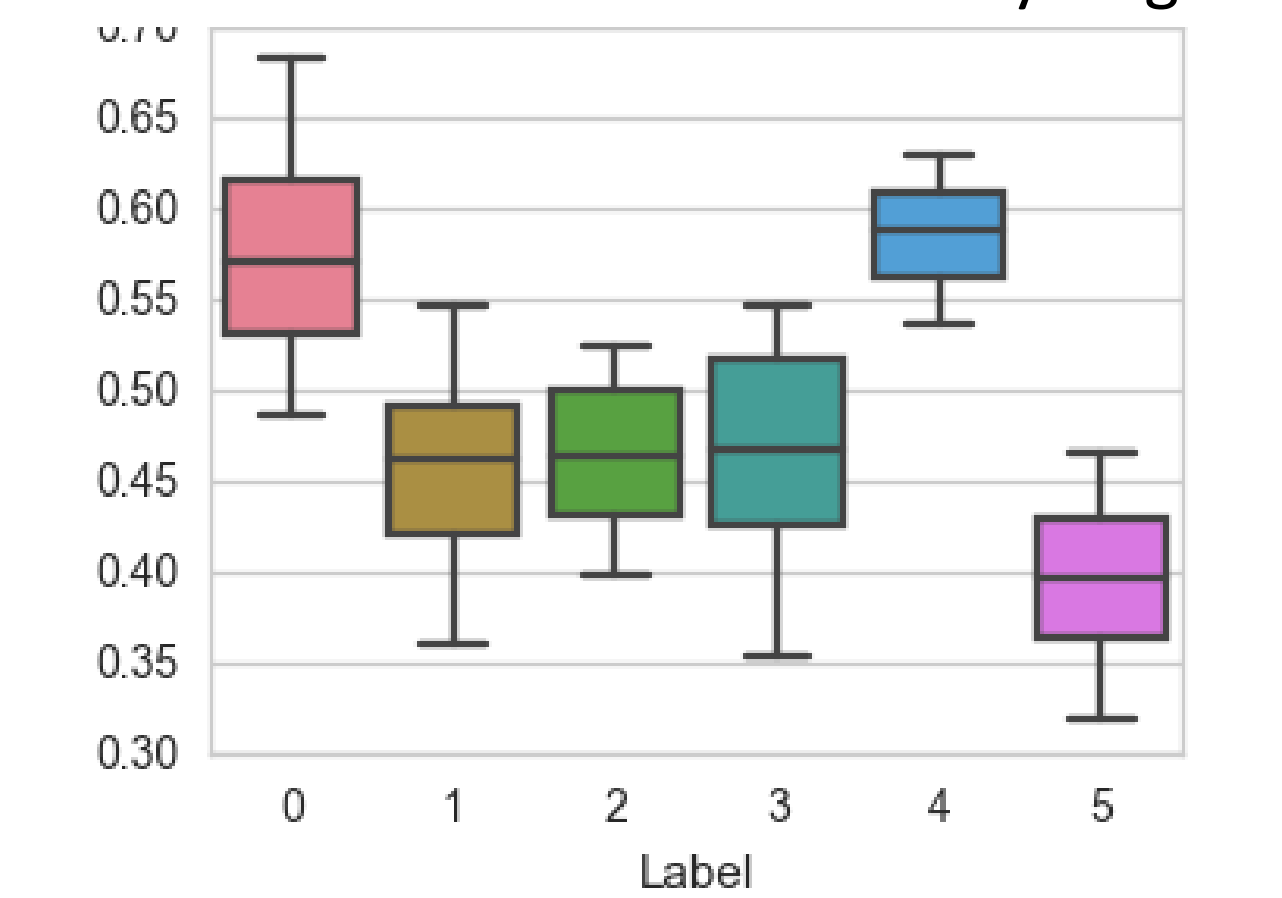
*Below:* Example boxplots of some key variables defining each cluster of census tracts

- |  |   |
|--|---|
| <ul style="list-style-type: none"> <li>• <b>Cluster 0:</b> Residential 1                     <ul style="list-style-type: none"> <li>○ low income</li> <li>○ low education</li> </ul> </li> <li>• <b>Cluster 1:</b> Residential 2                     <ul style="list-style-type: none"> <li>○ high income</li> </ul> </li> <li>• <b>Cluster 5:</b> Residential 3                     <ul style="list-style-type: none"> <li>○ high income</li> <li>○ high education</li> </ul> </li> </ul> | <ul style="list-style-type: none"> <li>• <b>Cluster 2:</b> Business 1                     <ul style="list-style-type: none"> <li>○ high income</li> <li>○ "professional service" businesses</li> </ul> </li> <li>• <b>Cluster 3:</b> Business 2                     <ul style="list-style-type: none"> <li>○ low income</li> <li>○ retail, food, etc. businesses</li> </ul> </li> <li>• <b>Cluster 4:</b> Business 3                     <ul style="list-style-type: none"> <li>○ low income</li> <li>○ manufacturing businesses</li> </ul> </li> </ul> |
|--|---|

Average After Tax Income of Individuals



Fraction without Postsecondary Degree



## Conclusions and Future Directions

- Built a visualization tool to visualize arbitrary =
- Clustered census tracts in high dimensional space
- Interpreted the defining characteristics for each cluster
- More data to add to VisualSurrey
- More detailed descriptions of census tract clusters