

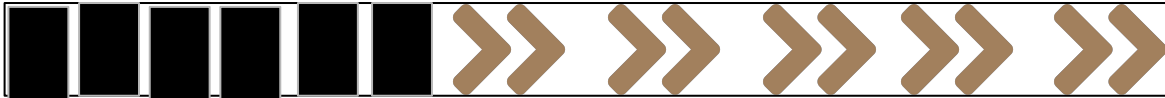
Incorporating Public Transit into Measures of Accessibility



UBCO 2021 Capstone Project

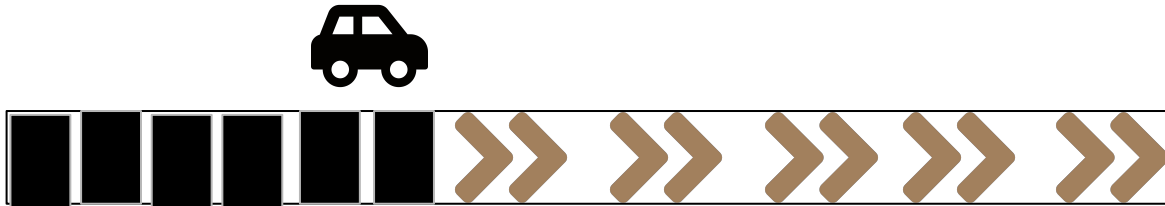
Overall progress

Week 3



Week 3

Overall Progress and Completed Tasks



Last Week's Tasks

Week 3

Last Week's Tasks

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- Created outline of Dashboard in Dash

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- Developed visualizations of accessibility scores

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- Developed scores incorporating only nearest amenities
- Developed individual scores for each amenity type

Last Week's Tasks

Week 3

- Created outline of Dashboard in Dash
- Developed visualizations of accessibility scores
- Developed weight index
- Developed scores incorporating only nearest amenities
- Developed individual scores for each amenity type
- Created model to determine accessibility for each amenity

Summary of team and individual tasks

| | Luka | Graham | Yuxuan | Rain | All |
|-------------------|---|---|---|---|---|
| R Viz |  | | | | |
| Amenity index | | |  | | |
| Local Kepler.gl | | | |  | |
| Dashboard outline | |  | | | |
| Scoring Sets |  | | | |  |

Preliminary Results



- Transit Accessibility Score Sets
- Visualizations
 - R (leaflet)
 - Python (plotly)
 - Local Kepler.gl using Python

Recall from last week



- Used R5R to compute Vancouver's travel time matrix
 - **All** dissemination blocks to **All** cultural amenities (15,197 x 432) x 36 > 230,000,000
 - Averaging over departures on Fri/Sat/Sun every hour from 7am - 7pm (= 36)
 - Took roughly ~ 2-3 hours

| | <i>O</i> | <i>D</i> | <i>T</i> | σ_T |
|-------|-----------------|---------------|--------------------------|-------------------------|
| | fromId <chr> | told <chr> | avg_unique_time <dbl> | sd_unique_time <dbl> |
| O_i | 59150004004 | 10 | 99.76316 | 5.364721 |
| | 59150004004 | 15 | 72.48718 | 3.401794 |
| | 59150004004 | 157 | 96.69231 | 3.001349 |
| | 59150004004 | 1759 | 106.82051 | 4.388213 |
| | 59150004004 | 1760 | 46.58974 | 2.642944 |
| | 59150004004 | 1822 | 76.64103 | 3.990035 |
| | 59150004004 | 1839 | 76.15385 | 2.680715 |
| | 59150004004 | 1840 | 75.15385 | 2.680715 |
| | 59150004004 | 1916 | 99.07692 | 3.571706 |
| | 59150004004 | 1930 | 86.97436 | 4.923024 |

Diagram illustrating the relationship between origin (O_i), destination (d_i), travel time (T), and standard deviation of travel time (σ_T).

The origin (O_i) is represented by a box containing O_i . The destination (d_i) is represented by a box containing d_i . The travel time (T) is represented by a box containing t_{O_i, d_i} . The standard deviation of travel time (σ_T) is represented by a box containing $\sigma_{t_{O_i, d_i}}$.

Arrows indicate the flow of information: from O_i to d_i , from d_i to t_{O_i, d_i} , and from t_{O_i, d_i} to $\sigma_{t_{O_i, d_i}}$.

Recall from last week

- Google Review Data

| poi_name <chr> | open_days <dbl> | Total_hours <dbl> | Rating <dbl> | Total_Review <dbl> |
|--|--------------------|----------------------|-----------------|-----------------------|
| Science World At Telus World of Science | 7 | 49.00 | 4.5 | 8833 |
| Van Dusen Botanical Garden | 7 | 49.00 | 4.6 | 6937 |
| Bloedel Conservatory | 7 | 47.25 | 4.6 | 4466 |
| Lynn Canyon Ecology Centre | NA | NA | 4.7 | 4053 |
| Dr. Sun Yat-Sen Classical Chinese Garden | 2 | 10.00 | 4.2 | 3885 |
| Museum of Anthropology | 6 | 42.00 | 4.7 | 3406 |
| UBC Museum of Anthropology | 6 | 42.00 | 4.7 | 3406 |
| Burnaby Village Museum | NA | NA | 4.6 | 2167 |
| UBC Botanical Garden | 5 | 35.00 | 4.5 | 936 |
| Beaty Biodiversity Museum | 6 | 42.00 | 4.5 | 662 |

Recall from last week

- There are missing values !

| poi_name <chr> | open_days <dbl> | Total_hours <dbl> | Rating <dbl> | Total_Review <dbl> |
|--|--------------------|----------------------|-----------------|-----------------------|
| Science World At Telus World of Science | 7 | 49.00 | 4.5 | 8833 |
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| UBC Botanical Garden | 5 | 35.00 | 4.5 | 936 |
| Beaty Biodiversity Museum | 6 | 42.00 | 4.5 | 662 |

Preliminary Results

- Replaced NAs with column mean

| poi_name <chr> | open_days <dbl> | Total_hours <dbl> | Rating <dbl> | Total_Review <dbl> |
|--|---------------------------|-----------------------------|------------------------|------------------------------|
| Science World At Telus World of Science | 7 | 49.00000 | 4.500000 | 8833.0000 |
| Van Dusen Botanical Garden | 7 | 49.00000 | 4.600000 | 6937.0000 |
| Bloedel Conservatory | 7 | 47.25000 | 4.600000 | 4466.0000 |
| Lynn Canyon Ecology Centre | 4 | 35.88077 | 4.700000 | 4053.0000 |
| Dr. Sun Yat-Sen Classical Chinese Garden | 2 | 10.00000 | 4.200000 | 3885.0000 |
| Museum of Anthropology | 6 | 42.00000 | 4.700000 | 3406.0000 |
| UBC Museum of Anthropology | 6 | 42.00000 | 4.700000 | 3406.0000 |
| Burnaby Village Museum | 4 | 35.88077 | 4.600000 | 2167.0000 |
| UBC Botanical Garden | 5 | 35.00000 | 4.500000 | 936.0000 |
| Beaty Biodiversity Museum | 6 | 42.00000 | 4.500000 | 662.0000 |

Preliminary Results

- Normalized data for each Feature

$$\text{Normalize.Values} = \frac{\text{Values} - \text{Mean}}{\text{Max} - \text{Min}}$$

| open_days <dbl> | Total_hours <dbl> | Rating <dbl> | Total_Review <dbl> |
|---------------------------|-----------------------------|------------------------|------------------------------|
| 1.0000000 | 0.39423077 | 0.6875000 | 1.0000000000 |
| 1.0000000 | 0.39423077 | 0.7500000 | 0.7853260870 |
| 1.0000000 | 0.37740385 | 0.7500000 | 0.5055480072 |
| 0.5000000 | 0.26808432 | 0.8125000 | 0.4587862319 |
| 0.1666667 | 0.01923077 | 0.5000000 | 0.4397644928 |
| 0.8333333 | 0.32692308 | 0.8125000 | 0.3855298913 |
| 0.8333333 | 0.32692308 | 0.8125000 | 0.3855298913 |
| 0.5000000 | 0.26808432 | 0.7500000 | 0.2452445652 |
| 0.6666667 | 0.25961538 | 0.6875000 | 0.1058650362 |
| 0.8333333 | 0.32692308 | 0.6875000 | 0.0748414855 |

Accomplishments

- Derived the Accessibility Index for Museum

Nor(Days)

| | | <i>Nor(Hours)</i> | <i>Nor(Rating)</i> | <i>Nor(Reviews)</i> | |
|--|---------------------------|-----------------------------|------------------------|------------------------------|-----------------------|
| | open_days <dbl> | Total_hours <dbl> | Rating <dbl> | Total_Review <dbl> | Index <dbl> |
| | 1.0000000 | 0.39423077 | 0.6875000 | 1.0000000000 | 0.77043269 |
| | 1.0000000 | 0.39423077 | 0.7500000 | 0.7853260870 | 0.73238921 |
| | 1.0000000 | 0.37740385 | 0.7500000 | 0.5055480072 | 0.65823796 |
| | 0.5000000 | 0.26808432 | 0.8125000 | 0.4587862319 | 0.50984264 |
| | 0.1666667 | 0.01923077 | 0.5000000 | 0.4397644928 | 0.28141548 |
| | 0.8333333 | 0.32692308 | 0.8125000 | 0.3855298913 | 0.58957158 |
| | 0.8333333 | 0.32692308 | 0.8125000 | 0.3855298913 | 0.58957158 |
| | 0.5000000 | 0.26808432 | 0.7500000 | 0.2452445652 | 0.44083222 |
| | 0.6666667 | 0.25961538 | 0.6875000 | 0.1058650362 | 0.42991177 |
| | 0.8333333 | 0.32692308 | 0.6875000 | 0.0748414855 | 0.48064947 |

$$Naive_Score = \frac{Nor(Hour) + Nor(Days) + Nor(Rating) + Nor(Reviews)}{N_i}$$

Interactions with the client



Pitfall (save for discussion)

- Different amenity types should be weighed differently or kept separate (ie. museums, libraries, and theatres are very different)
- Accessibility to the nearest 1-3 amenities gives a more realistic score than when considering all amenities

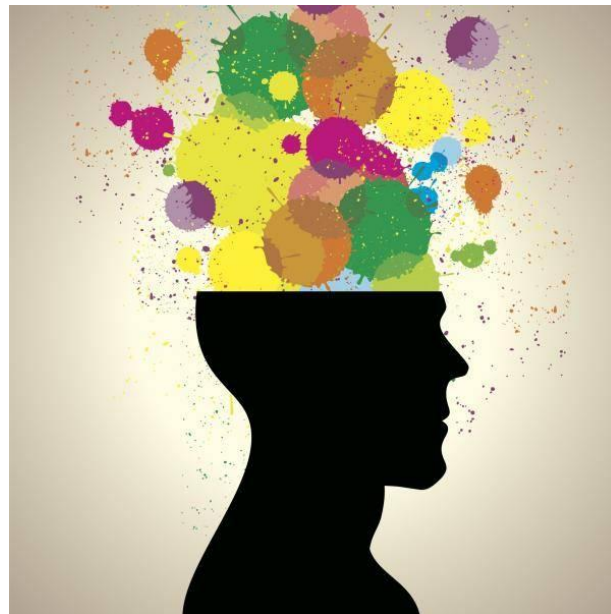
Can be addressed with modifications in aggregation.

Accomplishments



Visualization Methods:

1. Python
2. R
3. Kepler.gl
 - a. All amenities
 - b. Different types
 - c. Shortest travel time



Accomplishments



- Shiny Dashboard

Roadblocks



- Selecting the preferred Dashboard Language (R vs Python)
 - Incorporate all amenities
 - Dashboard style

Roadblocks

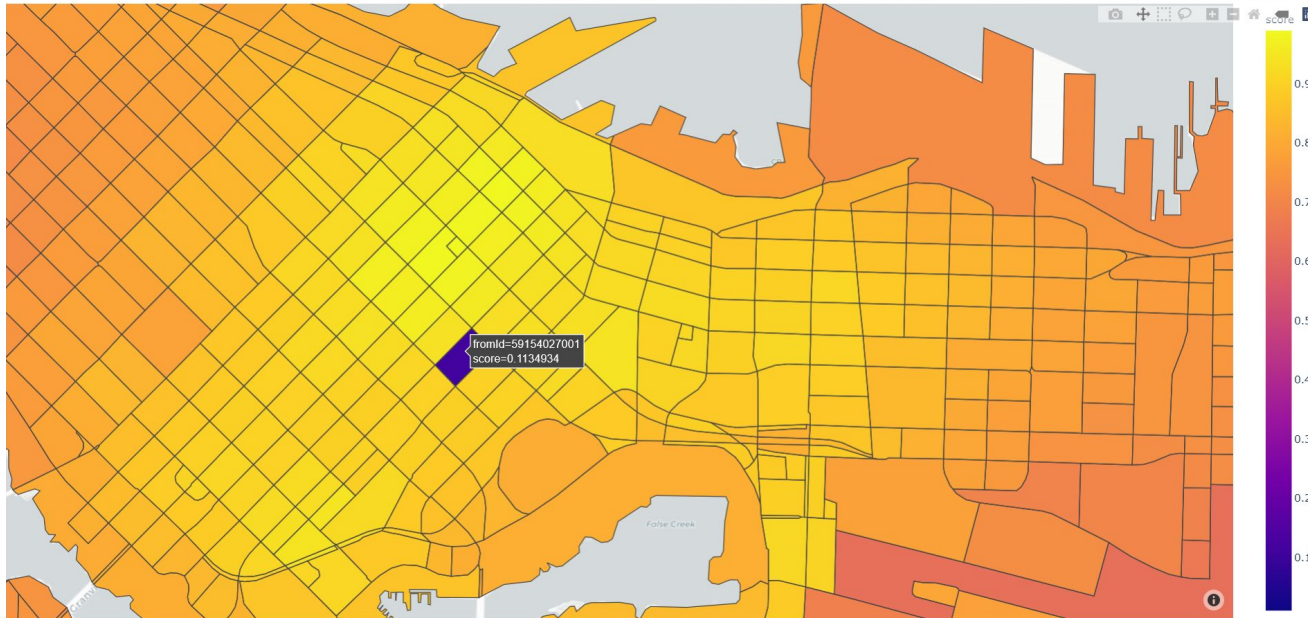


- Selecting the preferred Dashboard Language (R vs Python)
 - Incorporate all amenities
 - Dashboard style
- Libraries Information
 - Lack of information for each individual library
 - Datasets are mainly for different library systems

Roadblocks



- Strange low access outlier in city centre (to be investigated)



Week 4 Plan

- Construct dashboard in shiny
- Embed kepler.gl html into R dashboard
- Start methodology report writing
- Amenity accessibility feature engineering
- Create score set for transit efficiency

Week 3 Timeline

| Weekly Tasks | Mon. | Tue. | Wed. | Thu. | Fri. | Sat. |
|--|-----------|-----------------|-----------------|-----------------|-----------|-----------|
| <i>This week's theme:</i> Dashboards and Scoring Models | 5/17/2021 | 5/18/2021 | 5/19/2021 | 5/20/2021 | 5/21/2021 | 5/22/2021 |
| Sketch our dashboard outline | Graham ✓ | | | | | |
| First Dashboard build with plotly (R or Python?) | Graham ✓ | Graham ✓ | Graham ✓ | Graham ✓ | | |
| Interactive plotly visualization of accessibility scores | | | Graham ✓ | Graham ✓ | | |
| Using Urban Access + Pandana for Time computation (a second methodology for benchmarking r5r) | Rain ✓ | Rain ✓ | | | | |
| Using Urban Access + Pandana for visualization | Rain ✓ | Rain ✓ | Rain ✓ | | | |
| Add weight factor for different categories (libraries) | | | Rain ✓ | Rain ✓ | | |
| Developed museum weight index | Yuxuan ✓ | Yuxuan ✓ | | | | |
| Keplr.gl in local dash file (deck.gl) | | | | Rain ✓ | Rain ✓ | |
| R top down network visualization | Luka ✓ | Luka ✓ | Luka ✓ | | | |
| Develop multiple sets of scores to incorporate Joseph's "nearest amenity type" feedback | | Luka + Anyone ✓ | Luka + Anyone ✓ | Luka + Anyone ✓ | | |
| Document all models for score computation | | Luka + Anyone ✓ | Luka + Anyone ✓ | Luka + Anyone ✓ | | |
| Presentation Slides | All ✓ | | | | | |
| Client meeting and feedback | All ✓ | | | | | |
| Develop the amenity popularity weight index using Yuxuan's API data on Google reviews | | All ✓ | All ✓ | | | |
| Visualize new score models (to be done on a local Keplr instance and ggplot) | | | | All ✓ | All ✓ | |
| Visualizing Transit efficiency by integrating DB populations (not a priority until dashboard and consensus scoring models are build) | | | | | | |
| Facebook, Twitter API for popularity weights (not a priority if using nearest amenity score model) | | | Yuxuan ✓ | Yuxuan ✓ | Yuxuan ✓ | |

Week 4 - Timeline

| Weekly Tasks | Mon. | Tue. | Wed. | Thu. | Fri. | Sat. |
|---|---|---------------------------------|---------------------------------|---------------------------------|---------------------------------|-----------|
| <i>This week's theme:</i> Dashboards and Scoring Models | 5/24/2021 | 5/25/2021 | 5/26/2021 | 5/27/2021 | 5/28/2021 | 5/29/2021 |
| Embed HTML Kepler visualization in R | | All <input type="checkbox"/> | All <input type="checkbox"/> | All <input type="checkbox"/> | All <input type="checkbox"/> | |
| Determine preferred language for dashboard --> R | All <input checked="" type="checkbox"/> | All <input type="checkbox"/> | All <input type="checkbox"/> | All <input type="checkbox"/> | All <input type="checkbox"/> | |
| Create outline for dashboard in shiny | Graham <input type="checkbox"/> | Graham <input type="checkbox"/> | Graham <input type="checkbox"/> | Graham <input type="checkbox"/> | Graham <input type="checkbox"/> | |
| Create weekly presentation | All <input checked="" type="checkbox"/> | | | | | |
| Report writing - Methodologies - Weight Index | Yuxuan <input type="checkbox"/> | Yuxuan <input type="checkbox"/> | Yuxuan <input type="checkbox"/> | Yuxuan <input type="checkbox"/> | Yuxuan <input type="checkbox"/> | |
| Report writing - Methodologies - Score Index | Luka <input type="checkbox"/> | Luka <input type="checkbox"/> | Luka <input type="checkbox"/> | Luka <input type="checkbox"/> | Luka <input type="checkbox"/> | |
| Report writing - Methodologies - Visualization + algorithm comparison | Rain <input type="checkbox"/> | Rain <input type="checkbox"/> | Rain <input type="checkbox"/> | Rain <input type="checkbox"/> | Rain <input type="checkbox"/> | |
| Report writing - Intro, Background | | | | | | |
| Feature engineering for amenity accessibility (combining Google API features) | Yuxuan <input type="checkbox"/> | Yuxuan <input type="checkbox"/> | Yuxuan <input type="checkbox"/> | Yuxuan <input type="checkbox"/> | Yuxuan <input type="checkbox"/> | |
| Create Score set for transit efficiency (using population in conjunction to access) | | | Luka <input type="checkbox"/> | Luka <input type="checkbox"/> | Luka <input type="checkbox"/> | |
| Incorporate library capacity into the weight of the scores | | | Rain <input type="checkbox"/> | Rain <input type="checkbox"/> | Rain <input type="checkbox"/> | |

Closing Remarks

Questions?