

A photograph of the Chicago skyline at dusk. The Cloud Gate sculpture, also known as 'The Bean', is in the foreground on the left, reflecting the city lights. In the background, several skyscrapers are visible, including the Willis Tower on the right. The sky is a deep blue, and the city lights are beginning to glow.

Select the Ideal Community to Launch a Local Sharing Service App

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Selecting the right community is critical for Enso Street's Launch

- Enso Street, a Chicago-based startup firm, is developing a local sharing platform that focuses on family tools and equipment.
- The firm plans to debut its services in one Chicago community to test its platform, in March 2020.
- Identifying the right community help the startup to find product-market fit and gain meaningful operating metrics before their next funding event
- Besides Enso Street's founding team, future investors might be interested in the process in selecting target locations to expand geographically in the future.

Data Acquisition

- Complete List of Communities in Chicago
<https://data.cityofchicago.org/Health-Human-Services/Uptown-Census-Data/vdfh-mxit>
- Socioeconomic Data of Communities in Chicago
<https://data.cityofchicago.org/Health-Human-Services/Uptown-Census-Data/vdfh-mxit>
- Geographic Data
 - Coordinates of Communities: acquired through ArcGIS geocoding API
<https://developers.arcgis.com/features/geocoding/>
 - Venue Data: acquired through FourSquare API with required parameters
<https://foursquare.com/developers/apps>

Data Cleaning

- Dropped rows whose 'Community Area Number' value was NaN
- Dropped 'Community Area Number'
- Renamed 'Per Capita Income ' (with space after Income) to 'Per Capita Income'

Methodology – Dataframe Filtering

- Our first selection criteria are socioeconomic factors.
- For each socioeconomic indicator, we only selected communities with value better than the group average value.
- The process allowed us to narrow down the list of communities that are suitable and subject to our further analysis.

Methodology – Dataframe Filtering

	PERCENT HOUSEHOLDS BELOW POVERTY	PERCENT AGED 25+ WITHOUT HIGH SCHOOL DIPLOMA	PERCENT OF HOUSING CROWDED	PERCENT AGED 16+ UNEMPLOYED	HARDSHIP INDEX	PERCENT AGED UNDER 18 OR OVER 64	PER CAPITA INCOME
count	15.000000	15.000000	15.000000	15.000000	15.000000	15.000000	15.000000
mean	13.300000	8.006667	2.173333	7.326667	11.933333	24.620000	48420.133333
std	4.554433	4.406726	1.215652	2.229499	8.250253	5.925152	17952.246520
min	3.300000	2.500000	0.300000	4.700000	1.000000	13.500000	25828.000000
25%	11.150000	3.950000	1.200000	5.450000	5.500000	21.750000	35454.500000
50%	13.800000	7.400000	1.900000	7.000000	10.000000	23.800000	43198.000000
75%	16.100000	11.900000	3.300000	8.300000	18.000000	26.200000	59567.500000
max	20.600000	14.800000	4.100000	12.400000	25.000000	35.500000	88669.000000

Methodology – Geocoding

- We employed the geocoding API provided by ArcGIS to retrieve latitude and longitude data for each community.

	COMMUNITY AREA NAME	COMMUNITY LATITUDE	COMMUNITY LONGITUDE
0	Lincoln Square	41.97580	-87.68914
1	North Center	41.95411	-87.68142
2	Lake View	41.93982	-87.65682
3	Lincoln Park	41.92184	-87.64744
4	Near North Side	41.90021	-87.63433
5	Edison Park	42.00789	-87.81399
6	Jefferson Park	41.97054	-87.76329
7	Logan Square	41.92328	-87.69810
8	West Town	41.89329	-87.65743
9	Near West Side	41.87301	-87.67613
10	Loop	41.87834	-87.61997
11	Near South Side	41.85388	-87.62711
12	Hyde Park	41.79388	-87.59326
13	O'Hare	41.97959	-87.90446
14	Edgewater	41.98571	-87.66346

Methodology – One Hot Encoding

- Convert categorical variables into a form that could be utilized by machine learning algorithms to provide optimal predictions.

	COMM UNITY AREA NAME	Access ories Store	Airport	Airport Lounge	Airport Service	Airport Terminal	Americ an Restaur ant	Amphit heater	Antique Shop	Arcade	...	Tunnel	Vegetar ian / Vegan Restaur ant	Video Game Store	Video Store	Vietna mese Restaur ant	Whisky Bar	Wine Bar	Wine Shop	Wings Joint	Yoga Studio
0	Lincoln Square	0	0	0	0	0	0	0	0	0	...	0	0	0	0	0	0	0	0	0	0
1	Lincoln Square	0	0	0	0	0	0	0	0	0	...	0	0	0	0	0	0	0	0	0	0
2	Lincoln Square	0	0	0	0	0	0	0	0	0	...	0	0	0	0	0	0	0	0	0	0
3	Lincoln Square	0	0	0	0	0	0	0	0	0	...	0	0	0	0	0	0	0	0	0	0
4	Lincoln Square	0	0	0	0	0	0	0	0	0	...	0	0	0	0	0	0	0	0	0	0

5 rows × 202 columns

Methodology – 10 Most Common Venues

- Selected the 10 most common venues ONLY for our analysis, before we conducted our K-means clustering analysis.

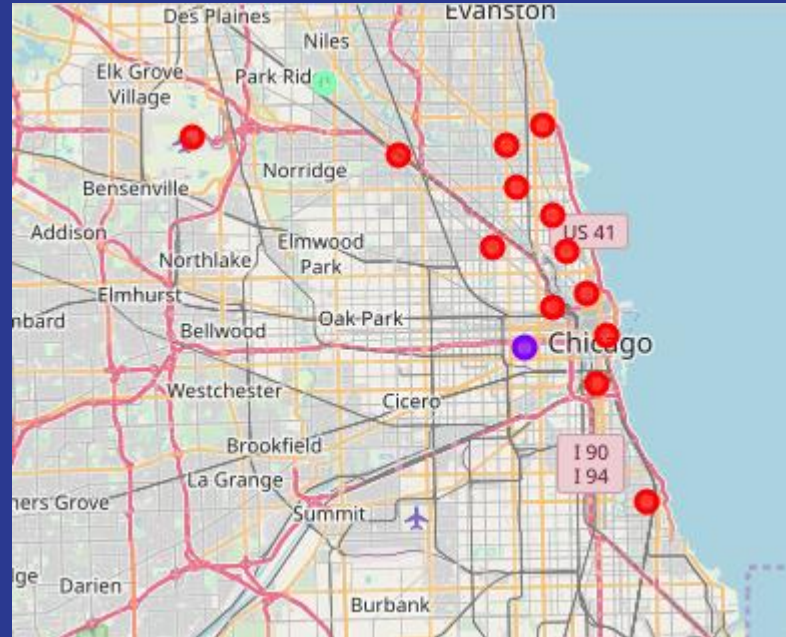
	COMMUNITY AREA NAME	1st Most Common Venue	2nd Most Common Venue	3rd Most Common Venue	4th Most Common Venue	5th Most Common Venue	6th Most Common Venue	7th Most Common Venue	8th Most Common Venue	9th Most Common Venue	10th Most Common Venue
0	Edgewater	Mexican Restaurant	Bus Station	Indian Restaurant	Sushi Restaurant	Asian Restaurant	Antique Shop	Bakery	Deli / Bodega	Yoga Studio	Convenience Store
1	Edison Park	Theater	Neighborhood	Park	Yoga Studio	Flower Shop	Fish & Chips Shop	Filipino Restaurant	Fast Food Restaurant	Farmers Market	Exhibit
2	Hyde Park	Coffee Shop	Bookstore	Sandwich Place	Train Station	Pharmacy	Shipping Store	Bubble Tea Shop	Café	Rental Car Location	Gym
3	Jefferson Park	Bar	Pharmacy	Video Store	Coffee Shop	Ice Cream Shop	Park	Chinese Restaurant	Sushi Restaurant	Supermarket	Restaurant
4	Lake View	Café	Japanese Restaurant	Coffee Shop	Bakery	Bagel Shop	Sandwich Place	Performing Arts Venue	Gym / Fitness Center	Pizza Place	Pharmacy

Methodology – K-Means Clustering

- Employed unsupervised learning algorithm K-Means clustering twice in our analysis. First on our socioeconomic data and second on our venue data.
- Used cluster number of 3 in both analysis.

Results

- The communities are categorized into three different clusters.
- We visualized our clustered communities on a Leaflet map using Folium with different colors.



Discussion

- 13 out of 15 communities are clustered in #1, indicating a high level of homogeneity in these Chicago communities. The 10 most common venues might imply that these communities have a large population of young professionals.

	COMMUNITY AREA NAME	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	Lincoln Square	Bar	Hot Dog Joint	Liquor Store	Bus Station	Convenience Store	Pizza Place	Korean Restaurant	Grocery Store	Football Stadium	Food Truck
1	North Center	Bar	Coffee Shop	Bank	Dive Bar	Pub	Pharmacy	Mobile Phone Shop	Boutique	American Restaurant	Latin American Restaurant
2	Lake View	Café	Japanese Restaurant	Coffee Shop	Bakery	Bagel Shop	Sandwich Place	Performing Arts Venue	Gym / Fitness Center	Pizza Place	Pharmacy
3	Lincoln Park	Pizza Place	Sandwich Place	Coffee Shop	Gym / Fitness Center	Bar	Taco Place	Breakfast Spot	Mexican Restaurant	Vietnamese Restaurant	Art Gallery
4	Near North Side	Gym / Fitness Center	Gym	Restaurant	Spa	American Restaurant	Bar	Breakfast Spot	Sandwich Place	Pub	Pool
6	Jefferson Park	Bar	Pharmacy	Video Store	Coffee Shop	Ice Cream Shop	Park	Chinese Restaurant	Sushi Restaurant	Supermarket	Restaurant
7	Logan Square	Bar	Cocktail Bar	Mexican Restaurant	Pizza Place	Restaurant	Ice Cream Shop	Discount Store	Donut Shop	Coffee Shop	Fast Food Restaurant
8	West Town	Sandwich Place	Pizza Place	Bar	Sushi Restaurant	Yoga Studio	Theater	Deli / Bodega	Pub	Burger Joint	Coffee Shop
10	Loop	Harbor / Marina	Park	Boat or Ferry	Ice Cream Shop	Concert Hall	Sushi Restaurant	Museum	Coffee Shop	Garden	Sandwich Place
11	Near South Side	Chinese Restaurant	Pizza Place	Dessert Shop	Bubble Tea Shop	Bakery	Rental Car Location	Nightclub	Grocery Store	Caribbean Restaurant	Candy Store
12	Hyde Park	Coffee Shop	Bookstore	Sandwich Place	Train Station	Pharmacy	Shipping Store	Bubble Tea Shop	Café	Rental Car Location	Gym
13	O'Hare	Airport Service	Coffee Shop	Snack Place	Airport Lounge	American Restaurant	Accessories Store	Bar	Tea Room	Tex-Mex Restaurant	Dessert Shop
14	Edgewater	Mexican Restaurant	Bus Station	Indian Restaurant	Sushi Restaurant	Asian Restaurant	Antique Shop	Bakery	Deli / Bodega	Yoga Studio	Convenience Store

Discussion

- Cluster No. 2 has only one community. From the venue type information, this community Near West Side might have a large population of students.

	COMMUNITY AREA NAME	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
9	Near West Side	Coffee Shop	Mexican Restaurant	Sandwich Place	College Gym	Baseball Field	Fast Food Restaurant	Train Station	Flower Shop	Fish & Chips Shop	Filipino Restaurant

Discussion

- There is one community, namely Edison Park, in Cluster #3. The three most venues are theaters, neighborhoods, and parks, all of which are highly popular among families.

	COMMUNITY AREA NAME	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
5	Edison Park	Theater	Neighborhood	Park	Yoga Studio	Flower Shop	Fish & Chips Shop	Filipino Restaurant	Fast Food Restaurant	Farmers Market	Exhibit

Conclusion

- After analyzing the socioeconomic indicators and venue types of each community in Chicago, we strongly recommend that Enso Street select Edison Park as the community to launch their services.
- As actual customer data becomes available, we will finetune our methodologies and analysis for future operation expansion.

	COMMUNITY AREA NAME	PERCENT HOUSEHOLDS BELOW POVERTY	PERCENT AGED 25+ WITHOUT HIGH SCHOOL DIPLOMA	PERCENT OF HOUSING CROWDED	PERCENT AGED 16+ UNEMPLOYED	HARDSHIP INDEX	PERCENT AGED UNDER 18 OR OVER 64	PER CAPITA INCOME
8	Edison Park	3.3	7.4	1.1	6.5	8.0	35.3	40959