

# Restaurants in Famous Indian Cities

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#### **Content**

- ➤ A description of the problem and a discussion of the background.
- A description of the data and how it will be used to solve the problem.

## 1.1 Background

Being a citizen of India, I have always been intrigued with what the various cities of India has to offer. With our wide range of cuisines and our very large appetite to try different delicacies, restaurants and cafés around this country are not only well versed in serving Indian cuisine but are highly recommended for international dishes too.

It is not an uncommon fact that there are some densely populated cities dispersed around Indian soil. Financial superpowers like Mumbai, technical giants like Bangalore and emerging cities like Pune – each have their own \_\_\_\_. Then again there are some religious and historic sites like \_\_\_\_ that have managed to uphold their legacies in terms of maintaining livelihoods. What each city has to offer to arouse our taste buds and how they are connected to each other? That is the question the natural foodie in me seeks to answer.

#### 1.2 Problem

Clustering restaurants from different cities in India will help determine some common characteristics between them. Analyzing these different venues, we can visualize the following data:

- Groups of cities similar to each other w.r.t restaurants
- Why these places are so populated?
- What characteristics do they share?

## 1.3 Interest

Say if one were to visit a famous Indian city and would want to acquire knowledge of the best food spots. Or better still maybe some entrepreneur wants to set up base with a restaurant, he/she will need to know the kind of cuisines and eateries the general public picks. With the attained information from this study, these individuals will be able to make their stay and capital more profitable.

This data can also be useful for culinary experts and food critics to categorize and rate famous places based on their similarities.

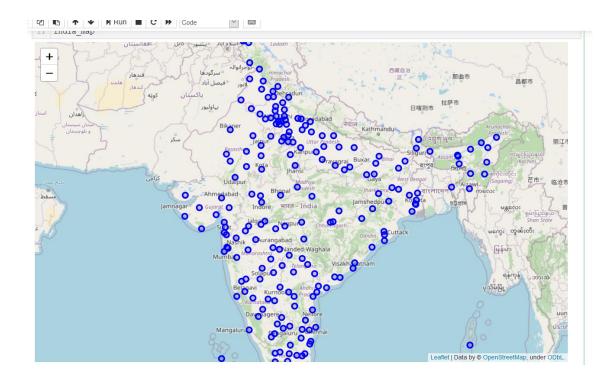
## 2. Data Acquisition

For famous Indian cities, I found a dataset of 200 odd famous cities with respect to population. It has the following attributes:

- Latitude
- Longitude
- State
- Population
- City name

Source: https://simplemaps.com/data/in-cities





Now that we have the details of each city, the essential information i.e. the venue data can be extracted using the FourSquare API using request methods.

To get venues and their categories from these cities, I will use the FourSquare API. The latitude and longitude values can be retrieved from the above table. For each city the range will be around 5 km and limit of up to 100 most popular venues.

From the FourSquare API, the data retrieved will have the following attributes:

- Venue
- Venue Category
- Latitude
- Longitude

From this data, for analysis I will only require restaurants/ café/ hotels to determine a food roadmap of the country.

Venue Category	Venue	Venue	Venue	Neighborhood Group	Neighborhood Group	City	
venue Category	Longitude	Latitude	venue	Longitude	Latitude	City	
Hotel	72.825220	18.993652	The St. Regis Mumbai	72.836447	18.987807	Mumbai	0
Restaurant	72.824400	18.994478	Smoke House Deli	72.836447	18.987807	Mumbai	1
Seafood Restaurant	72.829512	19.002183	Jai Hind Lunch Home	72.836447	18.987807	Mumbai	2
Maharashtrian Restaurant	72.836574	18.994526	Ladu Samrat	72.836447	18.987807	Mumbai	3
Pub	72.824721	18.994416	The Irish House	72.836447	18.987807	Mumbai	4
Deli / Bodega	72.823760	18.994498	Indigo Delicatessen	72.836447	18.987807	Mumbai	5
Indian Restaurant	72.837639	18.997938	Kebabs & Kurries	72.836447	18.987807	Mumbai	6
Indian Restaurant	72.823850	18.994333	The Sahib Room & Kipling Bar	72.836447	18.987807	Mumbai	7
Hotel	72.838433	18.998469	ITC Grand Central	72.836447	18.987807	Mumbai	8
Pizza Place	72.824964	18.995435	Francesco's	72.836447	18.987807	Mumbai	9
Hotel	72.820319	18.994356	Four Seasons	72.836447	18.987807	Mumbai	10
Hotel Bar	72.823795	18.994186	Li Bai - St. Regis	72.836447	18.987807	Mumbai	11
Cupcake Shop	72.823735	18.995091	Le 15 Patisserie	72.836447	18.987807	Mumbai	12
Indian Restaurant	72.827816	19.003410	Bombay Canteen	72.836447	18.987807	Mumbai	13
Restaurant	72.823103	18.992942	The Tasting Room	72.836447	18.987807	Mumbai	14
Nightclub	72.820294	18.980266	Tote On The Turf	72.836447	18.987807	Mumbai	15

Fig. Final data obtained from all venues

## 3. Methodology and Exploratory Data Analysis

As a first step, I retrieved the venues in India from Foursquare. I extract the location data from the Foursquare API for all venues up to a distance of 5 kilometers from the center of each city location.

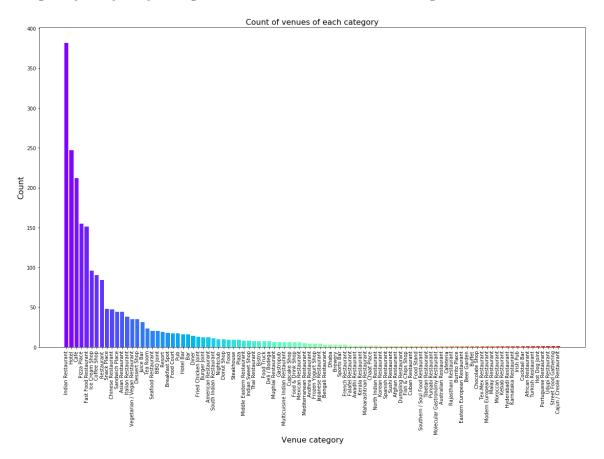
Using data cleaning, the dataset from the API is analysed based on the venue names, latitude, and longitude values. One to one matching and careful data inspection would be used to remove any remaining outliers such as multiple venues at the same location from the dataset. The final data will include the venue name, category, address, latitude, longitude.

Using this dataset, I begin by analyzing the top venue types that exist in India. I will then explore the venues on maps. This will allow us to better understand the location of various venues and the places where many venues co-exist and create place worth visiting. I'll also explore the venues based on the ratings and price range of various venues. The venues will be plot using proper color coding such that a simple glance at the map would reveal the location of the venues as well as give information about them. I aim to identify places which can be recommended to visitors based on their price and rating preferences. I'll also cluster the venues and see if we can draw meaningful information out of what kind of venues exist in India.

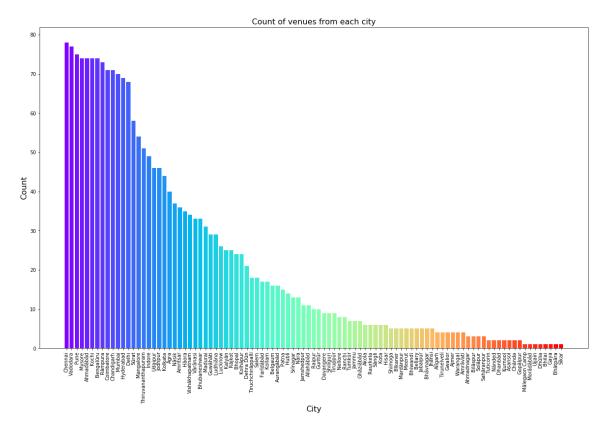
As a final step, I will analyze these plots and try to draw conclusions on what places can be recommended to visitors. I'll discuss my findings and any inferences I can draw.

#### 3.1 Categories

I begin my analysis by taking a look at the various restaurant categories that exist in India.



From this chart we can see that Indian Restaurants, Cafes, Pizza Places, Fast Food Restaurants and Ice Cream Shops are some of the most popular categories across the country among others



From this chart, we understand that most venues were acquired from more populated cities like Chennai, Vadodara, Pune, Mysore, Mumbai, Hyderabad etc.

# 4. Clustering

Finally, I cluster all the venues based on their price range, location and more to identify similar venues and the relationship amongst them. I used KMeans clustering and decided to cluster the venues into two separate groups.

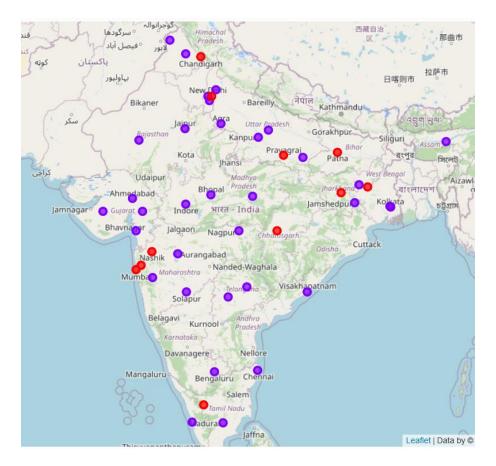


Fig. Clustered cities based on popular eating spots

From the map, we see the two clusters:

- 1. The first cluster is very sparsely spread and has very limited venues.
- 2. The second cluster is spread across country and includes the major cities.

I'll also check the venues of the two clusters.

Cluster 1: This cluster seems to contain cities that have Indian Restaurants, Fast Food Restaurants, Pizza Places and Hotels as their most popular venues. In terms of population, apart from Mumbai, they are not that populated. Seems like the inhabitants don't explore much variety.

	city	lat	population	population_proper	Cluster Labels	Most Common Venue no. 1	Most Common Venue no. 2	Most Common Venue no. 3	Most Common Venue no. 4	Most Common Venue no. 5
0	Mumbai	18.987807	18978000.0	12691836.0	0	Indian Restaurant	Restaurant	Hotel	Ice Cream Shop	Café
14	Patna	25.615379	2158000.0	1599920.0	0	Indian Restaurant	Fast Food Restaurant	Pizza Place	Hotel	Ice Cream Shop
18	Coimbatore	11.005547	1696000.0	959823.0	0	Indian Restaurant	Hotel	Pizza Place	Fast Food Restaurant	Café
21	Kalyān	19.243703	1576614.0	1576614.0	0	Indian Restaurant	Hotel	Fast Food Restaurant	Café	Restaurant
24	Nāsik	19.999963	1473000.0	1289497.0	0	Indian Restaurant	Hotel	Restaurant	Pizza Place	Fast Food Restaurant

Cluster 2: In this second cluster, other restaurant categories like Chinese restaurants, Italian restaurants, Sandwich Places are seen to be popular options among the citizens. This cluster mostly contains most populated cities of India and we can clearly see that people here are very diverse in choosing their food eating hotspots. Even though Indian Restaurants take the major chunk as most popular venue in both clusters, this particular cluster has a bit more variety.

city	lat								
		population	population_proper	Cluster Labels	Most Common Venue no. 1	Most Common Venue no. 2	Most Common Venue no. 3	Most Common Venue no. 4	Most Common Venue no. 5
Delhi	28.651952	15926000.0	7633213.0	1	Indian Restaurant	Hotel	Chinese Restaurant	Italian Restaurant	Café
Kolkata	22.562627	14787000.0	4631392.0	1	Indian Restaurant	Sandwich Place	Chinese Restaurant	Fast Food Restaurant	Café
Chennai	13.084622	7163000.0	4328063.0	1	Indian Restaurant	Ice Cream Shop	Hotel	Pub	Café
Bengalūru	12.977063	6787000.0	5104047.0	1	Indian Restaurant	Café	Hotel	Fast Food Restaurant	Coffee Shop
Hyderabad	17.384052	6376000.0	3597816.0	1	Indian Restaurant	Hotel	Fast Food Restaurant	Vegetarian / Vegan Restaurant	Pizza Place
Ahmadābād	23.025793	5375000.0	3719710.0	1	Indian Restaurant	Fast Food Restaurant	Pizza Place	Café	Tea Room
Hāora	22.576882	4841638.0	1027672.0	1	Hotel	Indian Restaurant	Café	Restaurant	BBQ Joint
Pune	18.513271	4672000.0	2935744.0	1	Indian Restaurant	Coffee Shop	Pizza Place	Café	Fast Food Restaurant
Sūrat	21.195944	3842000.0	2894504.0	1	Indian Restaurant	Café	Fast Food Restaurant	Pizza Place	Coffee Shop
Mardānpur	26.430066	3162000.0	2823249.0	1	Pizza Place	Sandwich Place	Hotel	Ice Cream Shop	Indian Restaurant
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### **Results**

Indian Restaurants continue to be the heart of most Indian cities around the country, serving as the most popular choice. International cuisine options though present are very rare. Cafes and Fast Food restaurants are also some options frequented upon. So even though Indian Restaurants are top priority, we can easily say judging from the clusters that the cities are seeing a moving trend in making cafes and fast food restaurants among the more popular options.

A large number of the most populated cities appear in the second cluster where a variety of eating options ensue compared to the first cluster that is mostly stuck on Indian restaurants being the most popular choices. The first cluster contains more traditional spots like Coimbatore, Patna and Nasik thus Indian restaurants are easily the most loved option there. The second cluster majorly contains emerging cities like Bangalore, Delhi, Chennai that embark newer trends and hence have a wave of popular options ranging from Multi cuisine spots, sandwich spots and delis.