


A light gray world map serves as the background. Numerous small, colorful location pins (blue, orange, green, pink, and light blue) are scattered across the map, primarily concentrated in North America, Europe, and Asia, representing popular travel destinations. The pins are used to illustrate the data points for the clustering analysis.

CLUSTERING POPULAR TRAVEL DESTINATIONS BASED ON LEISURE ACTIVITIES

By Isabelle Morose



Almost everyone enjoys going on vacation but very few get excited about planning their trips.

The first step in planning is choosing a destination. Often, that's a time-consuming process as it can take hours to do research.



Being spontaneous has its advantages. But imagine going to a city only to find out that you don't like the activities in the area.

Now, imagine if you could know beforehand what kind of activities you might find without doing hours of research.

In this presentation, you will find destination recommendations based on your interests.



You will be able to:

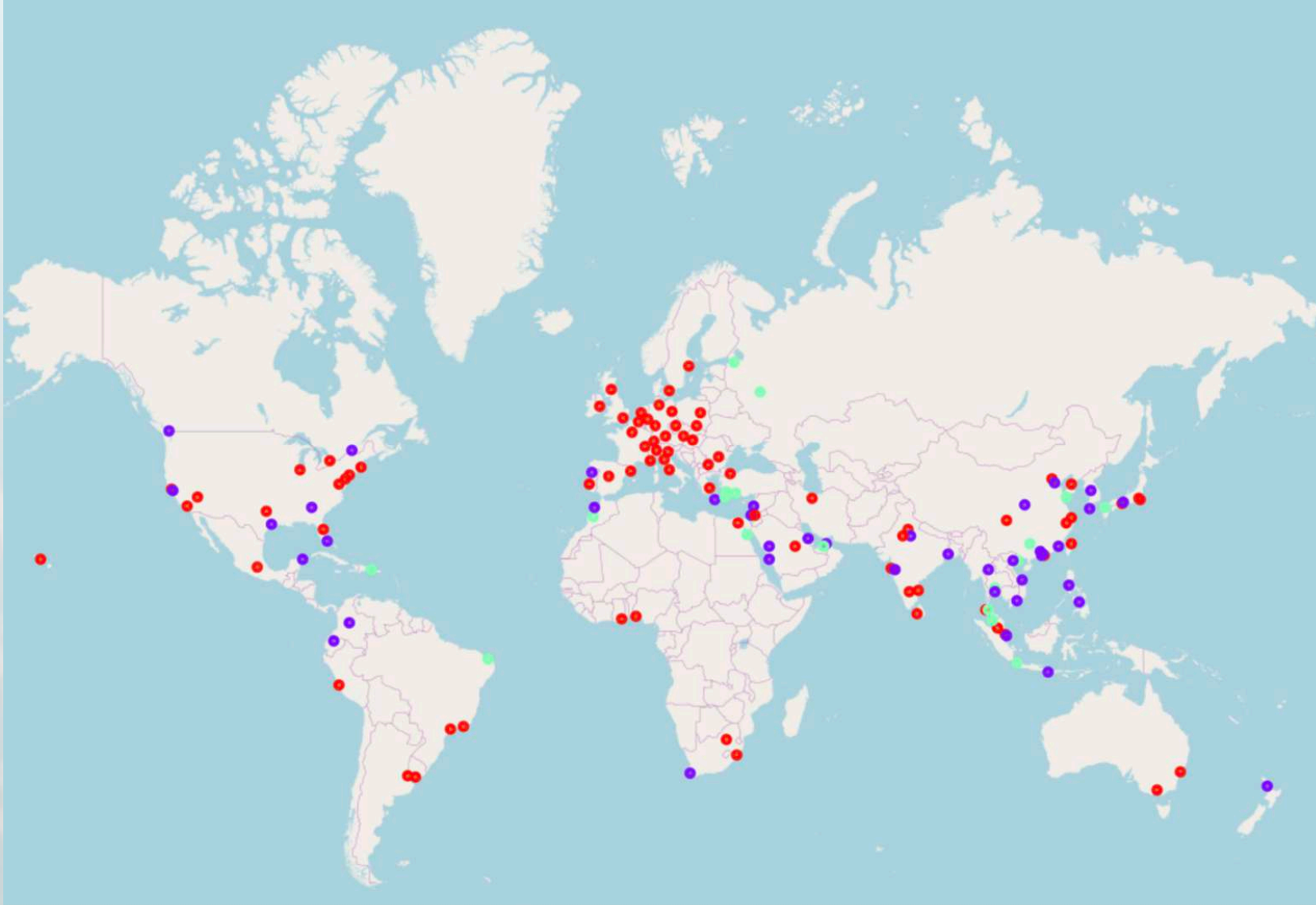
- Choose an interest, then pick a city offering activities related to it.
- Choose a city that you like, then pick another city offering the same kind of experience.



After analyzing the top 140 most popular travel destinations¹, it was found that, in terms of activities they offer, the most popular cities are quite similar to each other. In fact, they can be clustered into 3 groups.

¹Based on Euromonitor and Mastercard rankings of cities by the number of international visitors





- The largest cluster (C1) has 79 countries
- The second largest (C2) cluster has 41 countries
- The smallest cluster (C3) has 20 countries

Cities in First Cluster

| | |
|------------------------------|----------------------------|
| Hong Kong, Hong Kong/China | Chennai, India |
| London, United Kingdom | Vienna, Austria |
| Paris, France | Johor Bahru, Malaysia |
| New York City, United States | Jaipur, India |
| Kuala Lumpur, Malaysia | Berlin, Germany |
| Istanbul, Turkey | Cairo, Egypt |
| Delhi, India | Athens, Greece |
| Mumbai, India | Orlando, United States |
| Phuket, Thailand | Venice, Italy |
| Rome, Italy | Madrid, Spain |
| Tokyo, Japan | Riyadh, Saudi Arabia |
| Taipei, Taiwan | Dublin, Ireland |
| Prague, Czech Republic | Florence, Italy |
| Amsterdam, Netherlands | Toronto, Canada |
| Osaka, Japan | Johannesburg, South Africa |
| Las Vegas, United States | Sydney, Australia |
| Shanghai, China | Munich, Germany |
| Barcelona, Spain | Beijing, China |
| Los Angeles, United States | Brussels, Belgium |
| Milan, Italy | Budapest, Hungary |

Cities in this cluster have more activities than average, although these activities are in the **Shopping** and **Arts & Entertainment** categories.

Cities in **First Cluster** (*continued...*)

| | |
|--------------------------------|-----------------------------|
| Lisbon, Portugal | Düsseldorf, Germany |
| Copenhagen, Denmark | Boston, United States |
| San Francisco, United States | Chengdu, China |
| Melbourne, Australia | Edinburgh, United Kingdom |
| Warsaw, Poland | Tehran, Iran |
| Honolulu, United States | Hamburg, Germany |
| Kraków, Poland | Geneva, Switzerland |
| Buenos Aires, Argentina | Colombo, Sri Lanka |
| Chiba, Japan | Bucharest, Romania |
| Frankfurt am Main, Germany | Sofia, Bulgaria |
| Stockholm, Sweden | Dalian, China |
| Lima, Peru | Montevideo, Uruguay |
| Nice, France | Amman, Jordan |
| Rio de Janeiro, Brazil | Hangzhou, China |
| Bangalore, India | Durban, South Africa |
| Mexico City, Mexico | Dallas, United States |
| São Paulo, Brazil | Accra, Ghana |
| Zürich, Switzerland | Philadelphia, United States |
| Washington D.C., United States | Lagos, Nigeria |
| Chicago, United States | |

Cities in this cluster have more activities than average, although these activities are in the **Shopping** and **Arts & Entertainment** categories.

Cities in Second Cluster

| | |
|-----------------------------|------------------------|
| Dubai, United Arab Emirates | Cancún, Mexico |
| Shenzhen, China | Hanoi, Vietnam |
| Pattaya, Thailand | Dammam, Saudi Arabia |
| Mecca, Saudi Arabia | Heraklion, Greece |
| Guangzhou, China | Kyoto, Japan |
| Medina, Saudi Arabia | Zhuhai, China |
| Seoul, South Korea | Vancouver, Canada |
| Agra, India | Chiang Mai, Thailand |
| Miami, United States | Kolkata, India |
| Ho Chi Minh City, Vietnam | Cebu City, Philippines |
| Denpasar, Indonesia | Auckland, New Zealand |
| Tel Aviv, Israel | Xi'an, China |
| Da Nang, Vietnam | Beirut, Lebanon |
| Batam, Indonesia | Xiamen, China |
| Jeju, South Korea | Casablanca, Morocco |
| Porto, Portugal | Atlanta, United States |
| Montreal, Canada | Pune, India |
| San Jose, United States | Quito, Ecuador |
| Houston, United States | Tianjin, China |
| Cape Town, South Africa | Bogota, Colombia |
| Manila, Philippines | |

Cities in this cluster have more activities related to **food** than average.



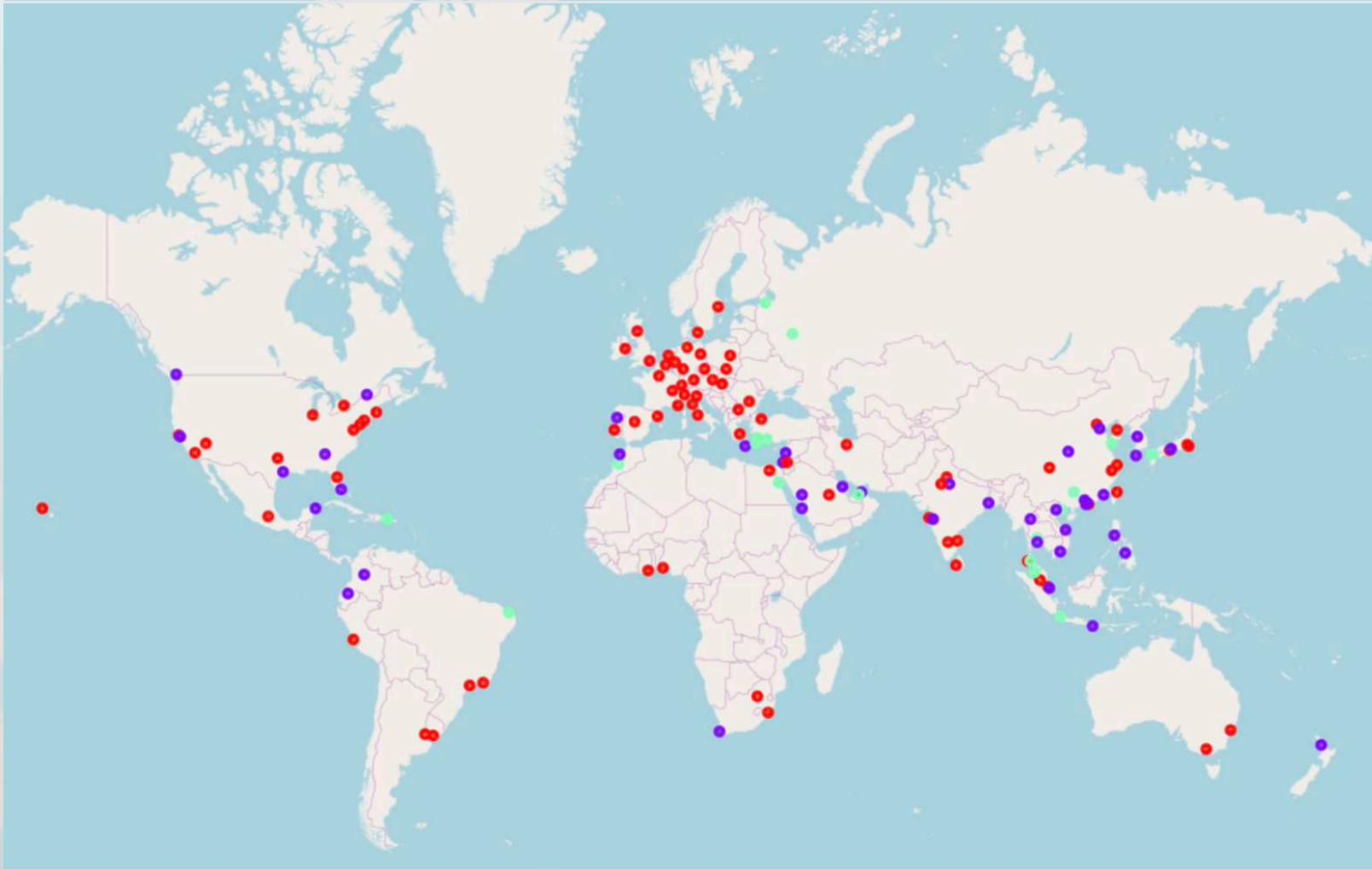
Cities in Third Cluster

| | |
|-----------------------------|------------------------|
| Dubai, United Arab Emirates | Cancún, Mexico |
| Shenzhen, China | Hanoi, Vietnam |
| Pattaya, Thailand | Dammam, Saudi Arabia |
| Mecca, Saudi Arabia | Heraklion, Greece |
| Guangzhou, China | Kyoto, Japan |
| Medina, Saudi Arabia | Zhuhai, China |
| Seoul, South Korea | Vancouver, Canada |
| Agra, India | Chiang Mai, Thailand |
| Miami, United States | Kolkata, India |
| Ho Chi Minh City, Vietnam | Cebu City, Philippines |
| Denpasar, Indonesia | Auckland, New Zealand |
| Tel Aviv, Israel | Xi'an, China |
| Da Nang, Vietnam | Beirut, Lebanon |
| Batam, Indonesia | Xiamen, China |
| Jeju, South Korea | Casablanca, Morocco |
| Porto, Portugal | Atlanta, United States |
| Montreal, Canada | Pune, India |
| San Jose, United States | Quito, Ecuador |
| Houston, United States | Tianjin, China |
| Cape Town, South Africa | Bogota, Colombia |
| Manila, Philippines | |

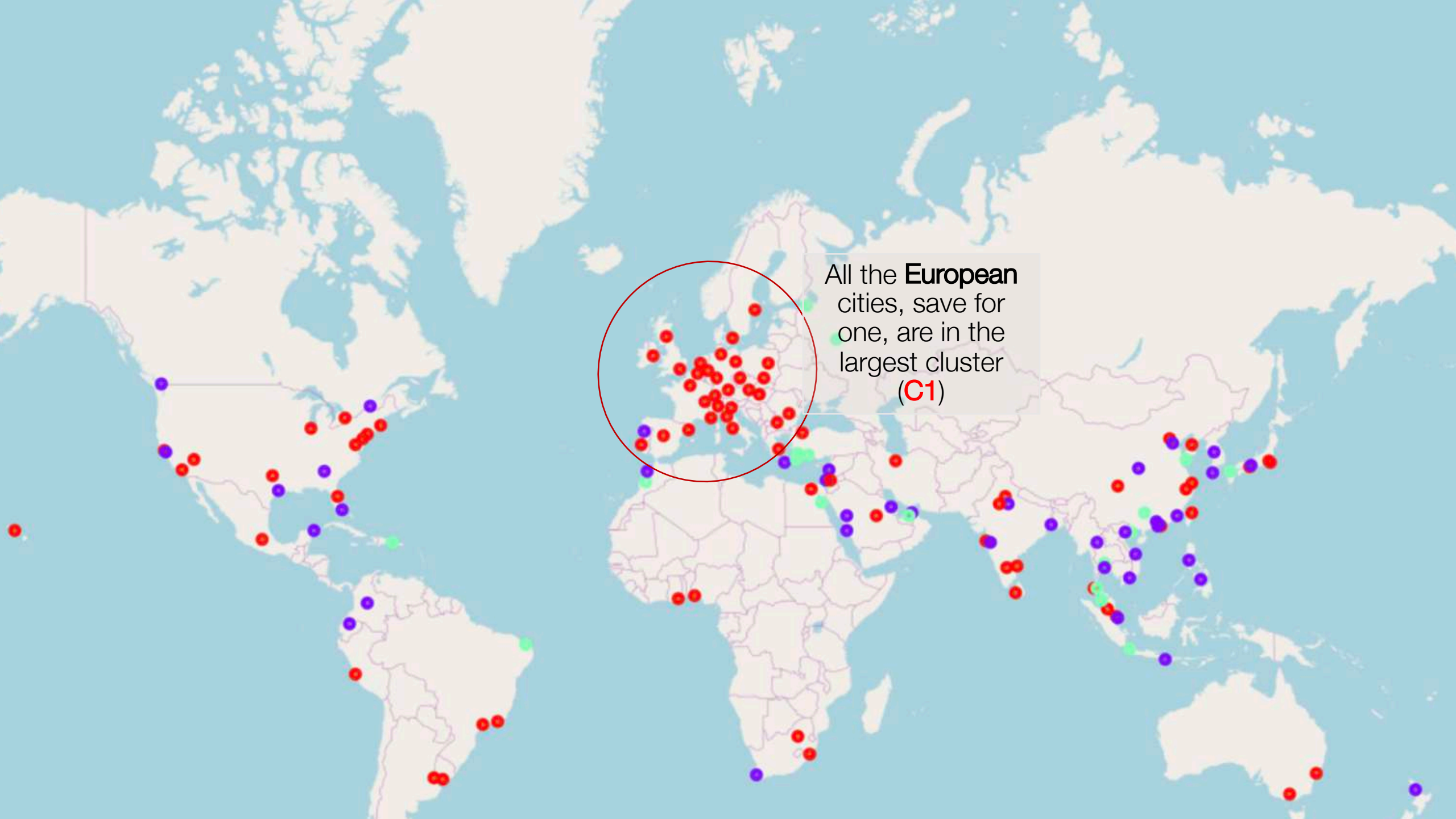
Cities in this cluster have more **outdoors** activities than average.



All 3 clusters are geographically spread all over the world



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All the **European** cities, save for one, are in the largest cluster (C1)

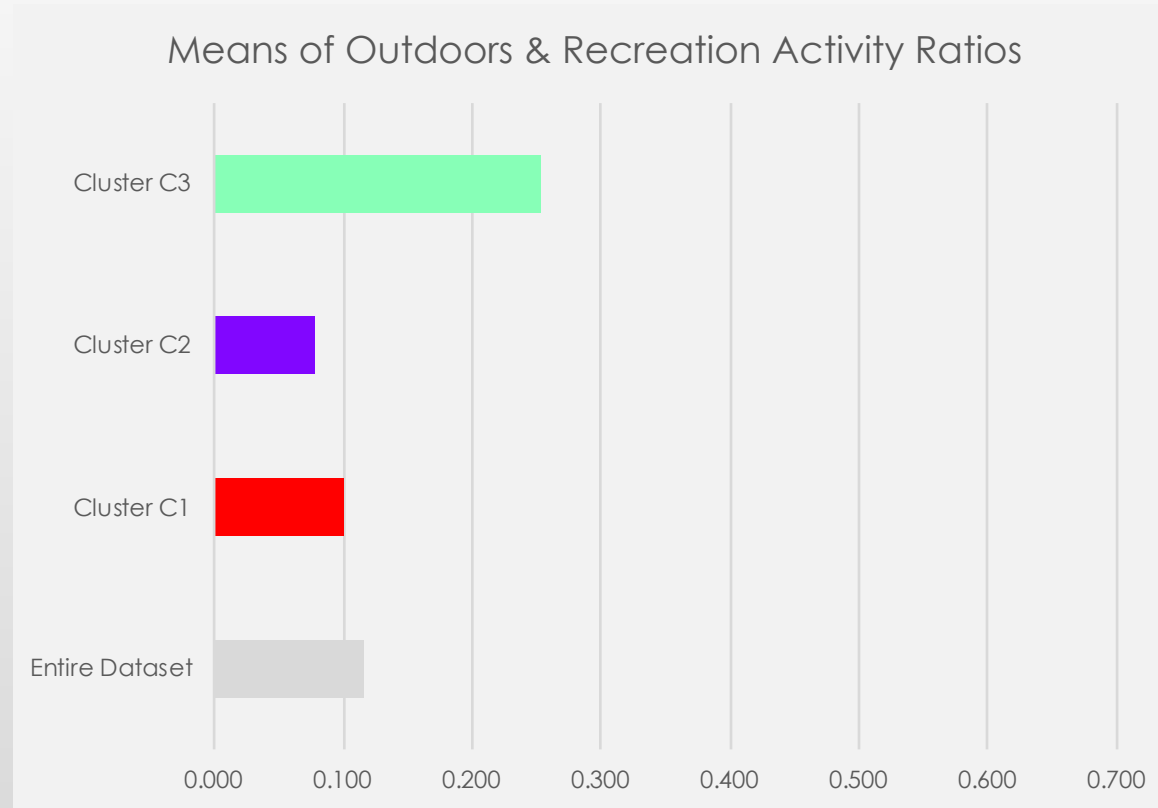
There is more diversity among cities in the Americas and in Asia than in Europe

A world map with city locations marked by colored dots. A large red oval encircles the Americas, and a smaller red oval encircles a large portion of Asia. The dots are color-coded: red for Europe, purple for Asia, and green for the Americas. The map shows a high density of red dots in Europe, a high density of purple dots in East and Southeast Asia, and a more dispersed distribution of green dots across the Americas.

The most prominent cluster on the **American continent** is the largest one (**C1**).

Most **Asian** cities belong to the second largest cluster (**C2**).

RECOMMENDATIONS BY ACTIVITY CATEGORY

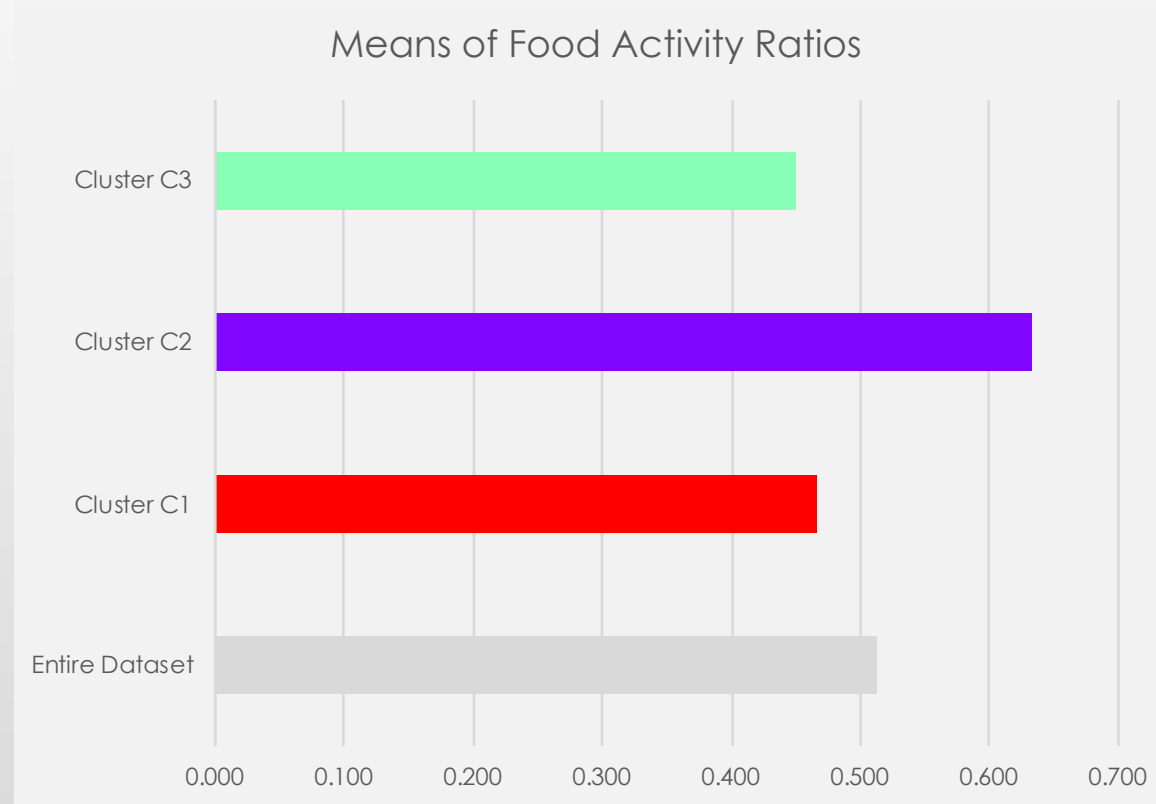


If you are into **outdoors activities...**

you should visit cities in **Cluster 3**

but not cities in **Cluster 2**

RECOMMENDATIONS BY ACTIVITY CATEGORY

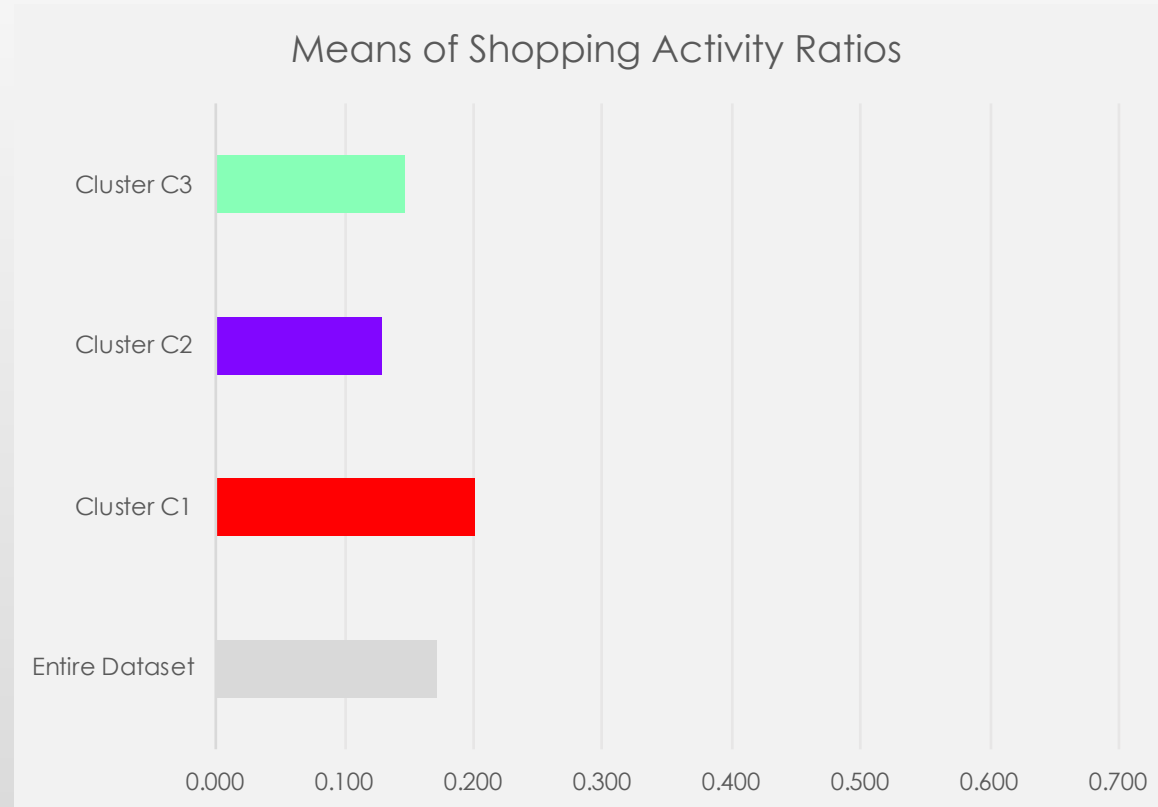


If you are a **foodie**...

you should visit cities in **Cluster 2**

but not cities in **Cluster 1** nor **Cluster 3**

RECOMMENDATIONS BY ACTIVITY CATEGORY

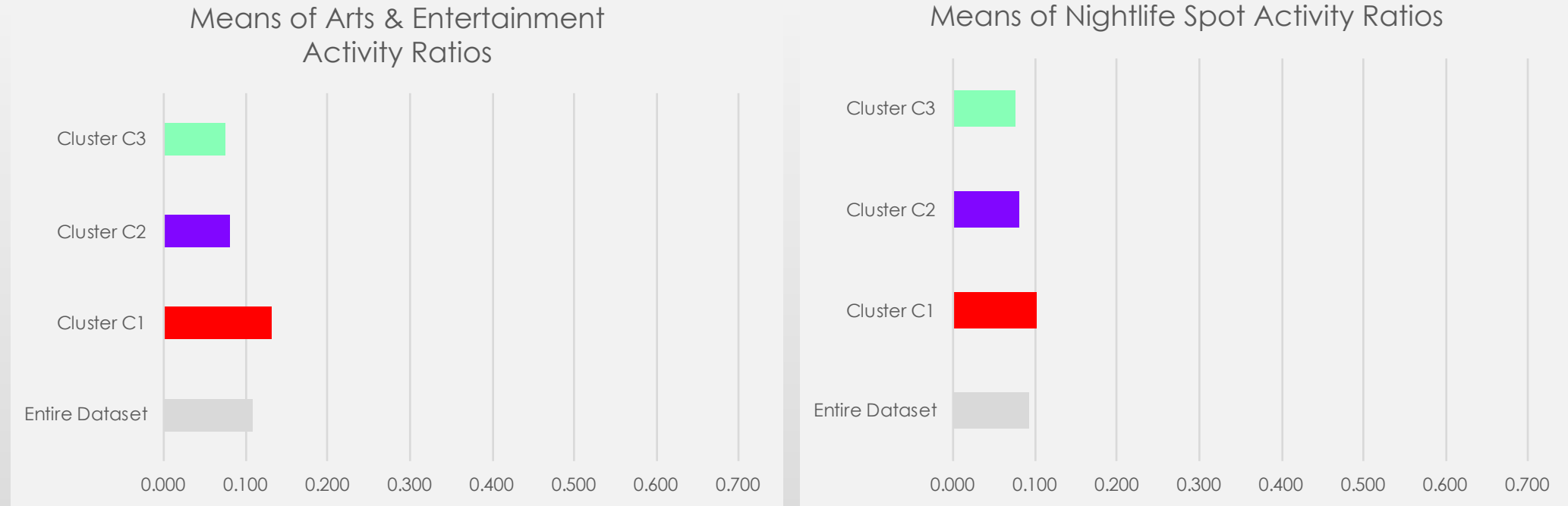


If you are into **shopping**...

you should visit cities in **Cluster 1**

but not cities in **Cluster 2** nor **Cluster 3**

RECOMMENDATIONS BY ACTIVITY CATEGORY



For **nightlife** and **arts & entertainment** activities, the cluster doesn't matter, although **Cluster 1** tends to have more activities in general.

OTHER CONSIDERATIONS

It's important to note that this study focused solely on the type of leisure activities one might find in a city. To have a better picture of travelers' experience at a destination, other factors like architecture, climate, and walkability should also be taken into consideration.