

# **On the Preferred Location of a Multifaceted Bar Business in Paris**

---

IBM Data Science Professional Certificate

March 2020

# Outline

---

- Background and business problem
- Data
- Methods
- Results and Discussion
- Conclusion



# Background and business problem

- Paris: the most visited city in the world
  - 16 million foreign visitors a year
  - 450 million nights spent for accommodation
- Paris: the most expensive city in the world
- Business problem: **what is the best location(s) for opening a bar/coffee shop business in Paris that would tap both tourist and local populations, during day and nighttime?**



# Data

---

- 16 variables covering **location, socioeconomic, demographic, and tourism** data
- 5 **location variables** sourced in Foursquare
  - Bars
  - Restaurants
  - Theaters and comedy clubs
  - Hotels
  - Museum and monuments



# Data (cont'd)

---

- **Wealth variables** (poverty rate, median annual income, percentage of taxable income households)
- **Population variables** (total population, population density, and percentage variation of population over 2013-2016)
- **Real-estate prices data** (2018 square meter price in euro, percentage change of that price over 2018–2019)
- **15–64 age category population density**, as a proxy for “youth” clientele
- **Tourism data** of 15 most visited sites

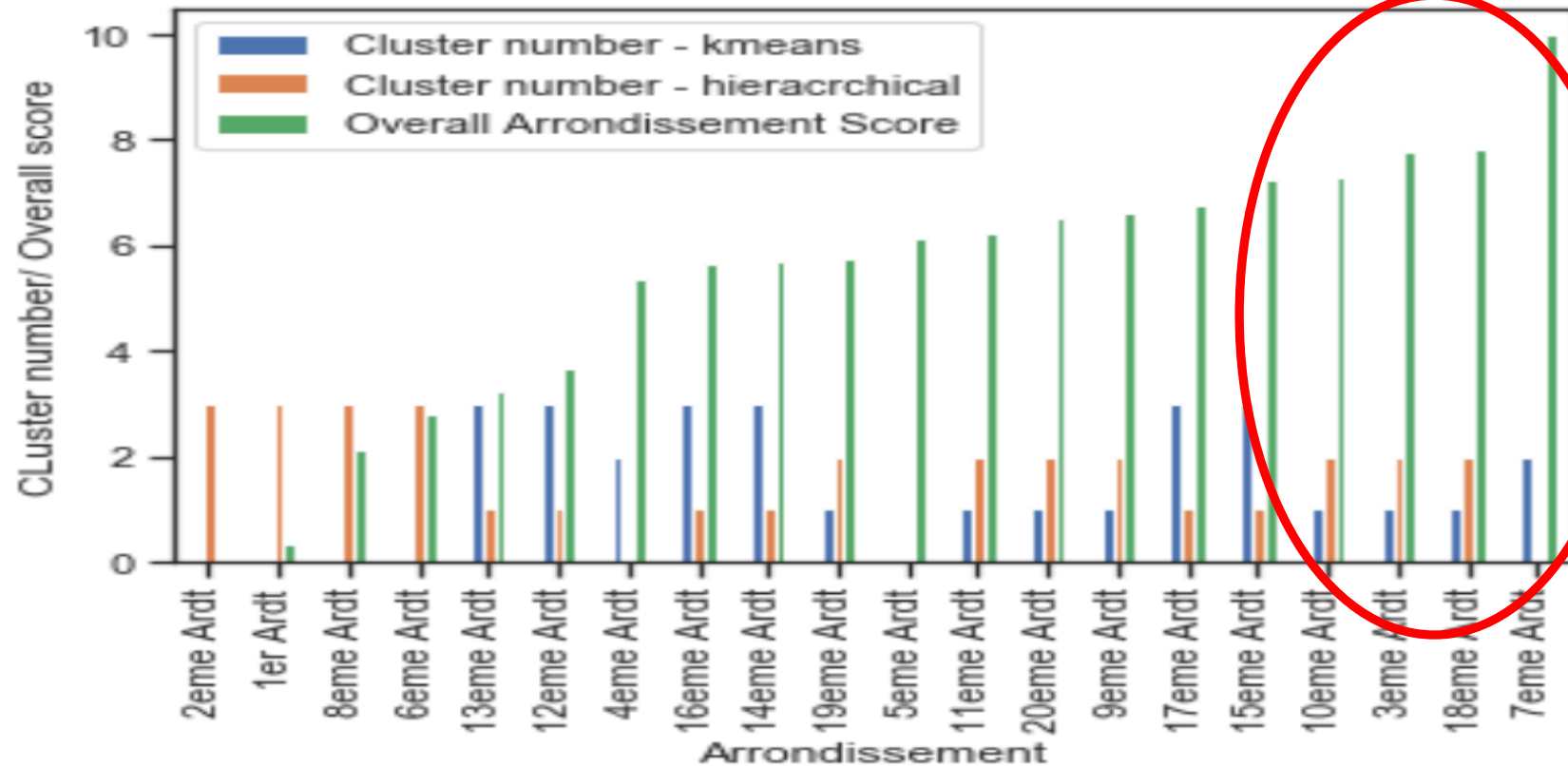
# Methods

---

- Analysis at the *arrondissement* level
- **Multipronged quantitative approach**
  - **Yields more assurance in final recommendations** based on the comparison of three widely used alternative ranking and clustering methodologies
- **Two classification methods:** kmeans clustering and agglomerative hierarchical clustering, and
- Construction of **a multilevel nested composite index** of the 16 indicators
-

# Results and discussion

- Cluster numbers and overall attractiveness score of the 20 arrondissements



Potential  
*arrondissements*  
for  
consideration



# Results and discussion (cont'd)

	Hotels	Museums	Bars index	Restaurants index	Theaters index	wealth zscore	realestate zscore	population zscore	15-64 population density	Cumulative_tourism_data	Arrondissement Score	Cluster number - hierarchical
Cluster number - hierarchical												
0	0.270000	0.333333	0.277000	0.411769	0.388472	0.769790	0.668508	0.178050	0.232780	0.226361	0.228500	2.4
1	0.142857	0.095238	0.621549	0.782960	0.876017	0.347663	0.749715	0.786962	0.716990	0.090053	0.685442	2.0
2	0.575000	0.388889	0.248114	0.298172	1.000000	0.822139	0.715841	0.269312	0.185426	0.972779	0.768986	0.0
3	0.166667	0.055556	0.898732	0.809020	1.000000	0.577075	0.163386	0.689791	0.355482	0.024546	0.537718	1.0

Cluster number - hierarchical	Hotels	Museums	Bars index	Cumulative_tourism_data	Cluster number - kmeans	Arrondissement Score
0	0.483333	0.592593	0.270234	0.717670	1.333333	0.71780
1	0.166667	0.055556	0.898732	0.024546	3.000000	0.53771
2	0.142857	0.095238	0.621549	0.090053	1.000000	0.68544
3	0.262500	0.166667	0.268755	0.231089	0.000000	0.13172

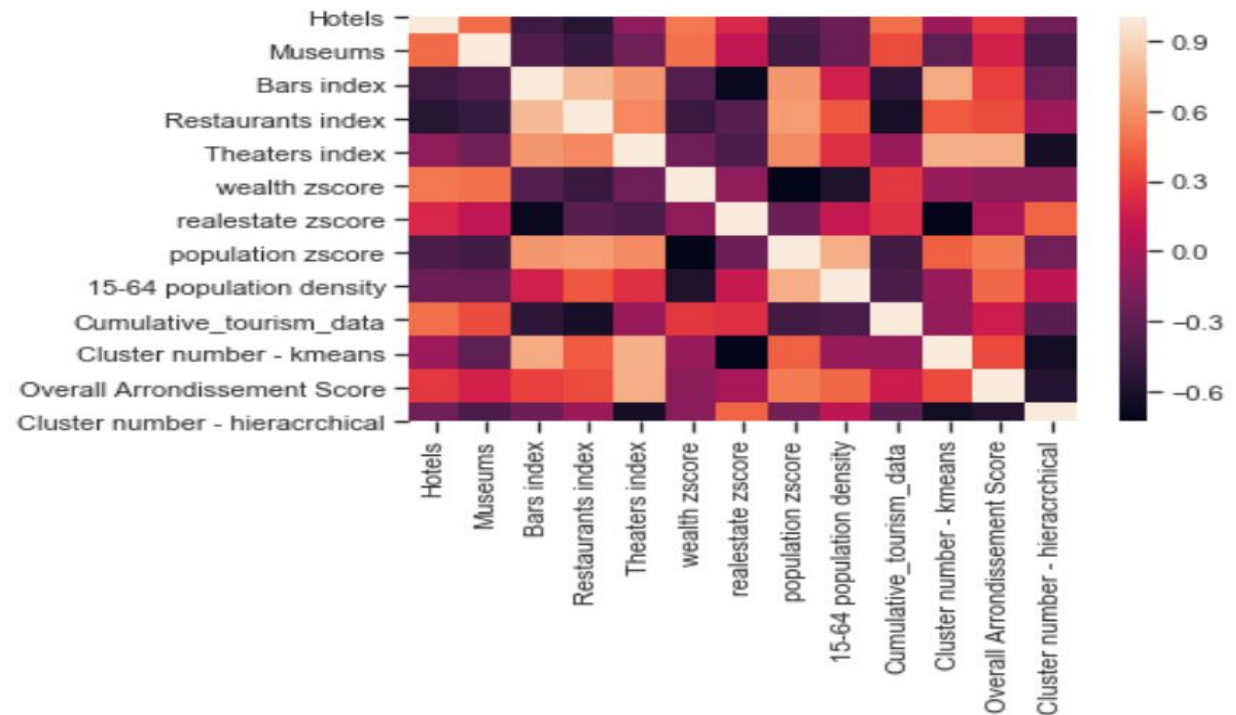
High attractiveness can build on different constituents structures:

- Tourist/local populations
- Daytime/nighttime revenues
- Higher/lower real-estate prices
- Etc.



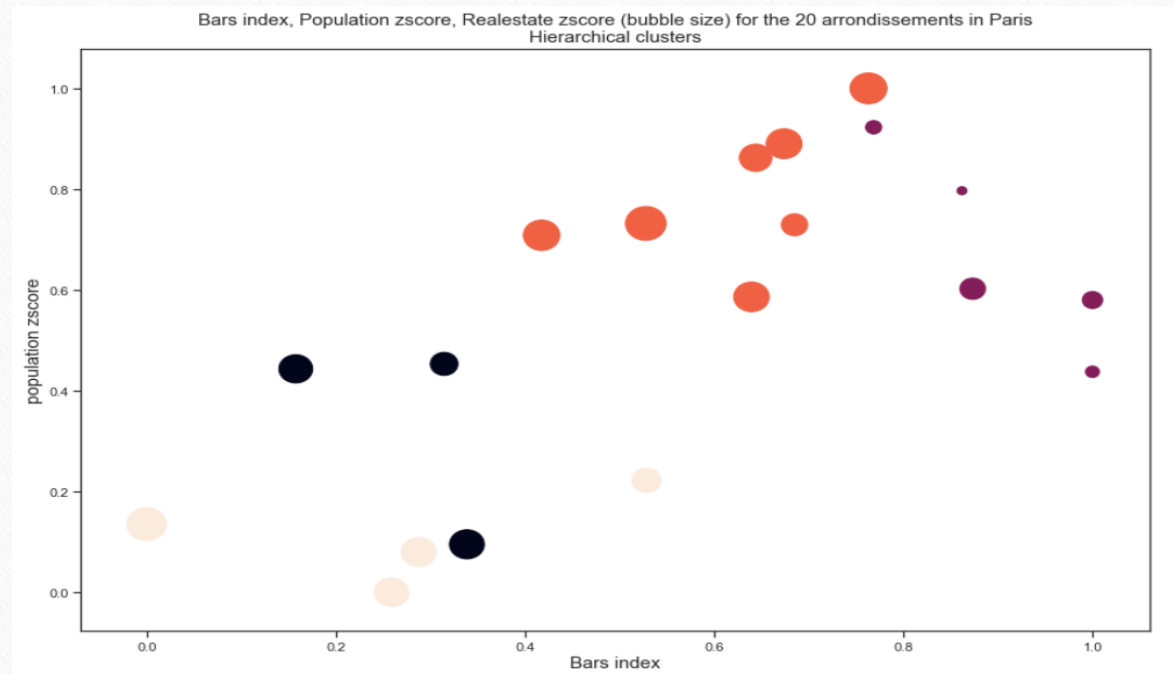
# Results and discussion (cont'd)

- Higher attractiveness tends to have:
  - ✓ less competition,
  - ✓ more favorable local population dynamics,
  - ✓ yet less favorable real-estate prices and local residents' income levels.



# Results and discussion (cont'd)

- Again, important arbitrages to consider, e.g.,
  - ✓ more favorable businesses competition
  - ✓ highly associated with favorable population dynamics
  - ✓ yet higher real-estate prices





# Results and discussion (cont'd)

---

- Final recommendation boils down to the:
- **7<sup>th</sup> *arrondissement***: relatively higher share of revenues coming from tourists during daytime, taping a wealthier local albeit less important resident population, but faces a stronger business competition
- **18<sup>th</sup> *arrondissement***: much less pronounced competition; business relies more on a younger, more important, but less wealthy resident population.

# Conclusion

---

- More refined analysis needed:
  - ✓ consider location at a lower spatial level, i.e., administrative neighborhood level (*quartiers administratifs*)
  - ✓ take into account official records regarding the numbers businesses actually established in those *arrondissements*
  - ✓ weighting of Foursqaure data used so far with clients' evaluations of the businesses.



---

THANK YOU FOR YOUR ATTENTION