

# COURSERA CAPSTONE

## IBM APPLIED DATA SCIENCE CAPSTONE

OPENING A NEW SHOPPING MALL IN BALI, INDONESIA

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# BUSINESS PROBLEM

- Location of the shopping mall is one of the most important factors in determining the Return of Investment (ROI) of a property or mall
- Objective: To analyse and recommend locations in Bali to open a new shopping mall
- Business question
  - In Bali, a popular destinations for tourists and local to improve their lives, which region would you recommend to build a new one?

# DATA

- Data required
  - List of neighbourhoods in Bali, Indonesia
  - Latitude and longitude coordinates of the neighbourhoods
  - Venue data, particularly data related to shopping malls
- Sources of data
  - Wikipedia page for Bali neighbourhoods ([https://en.wikipedia.org/wiki/List\\_of\\_districts\\_of\\_Bali](https://en.wikipedia.org/wiki/List_of_districts_of_Bali))
  - Geocoder package for latitude and longitude coordinates
  - Foursquare API for venue data

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# METHODOLOGY

- Web scraping Wikipedia for neighbourhood list
- Get latitude and longitude coordinates using geocoder
- Use Foursquare API to get venue data
- Group data by neighbourhood and taking the mean of frequency of occurrence of each venue category
- Filter venue category by Shopping mall
- Perform clustering on the data by using k-means clustering based on frequency of 'Shopping mall'
- Visualize the clusters in a map using Folium

# RESULTS

- Categorized the neighbourhoods into 3 clusters
  - Cluster 0: Neighbourhoods with low number to no shopping malls
  - Cluster 1: Neighbourhoods with moderate number of shopping malls
  - Cluster 2: Neighbourhoods with high concentration of shopping malls

Note: Cluster 0 -> Red dots  
Cluster 1 -> Purple dot  
Cluster 2 -> Green dot





## DISCUSSIONS

- Most shopping malls are concentrated near local tourist attractions i.e. Kuta or Jimbaran areas.
- Highest number in cluster 2 and lowest number in cluster 0
- Oversupply of shopping malls at tourist attractions while suburb areas to cater local residents have very few shopping malls.



## RECOMMENDATIONS

- Open new shopping mall in cluster 0 to cater to local entertainment needs
- Little competition is expected in cluster 0 as malls are concentrated in cluster 1 and 2
- With unique stand out features of the new shopping mall. People are willing to travel for experience



# CONCLUSION

- Answer to business question: Cluster 0 neighbourhoods are potential locations to build and open a new shopping mall
- Conclusions of this project will assist relevant stakeholders to capitalize on opportunities and enjoy first mover advantage to gain profit