Las Vegas:
The Strip or Downtown?
Comparative Analysis of
Restaurants in Old and
New Las Vegas

Group O
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Agenda

Old & New Las Vegas

A Map of Las Vegas

Review of key research questions

Analysis:

Overview of Yelp dataset

Some findings from exploratory analysis

Topic modeling applied to reviews

Consumer preference models by geographic location

Implications

Next Steps

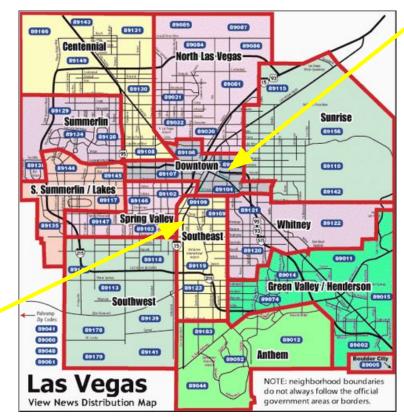
Appendix

Old and New Las Vegas

- There are two main districts that travelers/gamblers to Las Vegas visit:
 - Downtown or The Strip in Las Vegas:
 - Downtown Las Vegas (Old Las Vegas)
 - Historic center of Las Vegas, Nevada.
 - All the casinos and hotels are relatively close together.
 - Less expensive that those in the Strip Las Vegas as it requires less minimum bet for different table games.
 - Popular across the budget minded traveler and the serious gambler
 - The Las Vegas Strip (New Las Vegas)
 - Features mega resorts that one often sees in television shows or movies.
 - Popular across the high-end sightseers or less serious gamblers

A Map of Las Vegas

Downtown, "Old Vegas"



The Strip, "New Vegas"

Review of Key Research Questions

- 1. How restaurants are visually distributed in the map in Las Vegas?
- 2. How high/low rated restaurants in Old and New Las Vegas differ in terms of their business attributes?
- 3. Would the sentiment toward key business attribute differ in two regions, due to different preferences of the traveler groups in each region?

Analysis

Yelp Dataset

Yelp Dataset Challenge - Round 9

Size:

4.1 million reviews from 1 million users for 144,000 businesses

4 countries (US, UK, Germany, Canada) and 15 cities

Variety of businesses: Restaurants, Beauty & Spas, Pet Services, Home Cleaning, etc.

Business Dataset

Name of business (with business ID), Categories, Attributes, Star ratings, Review Count

Review Dataset

Review text, Star rating, user ID

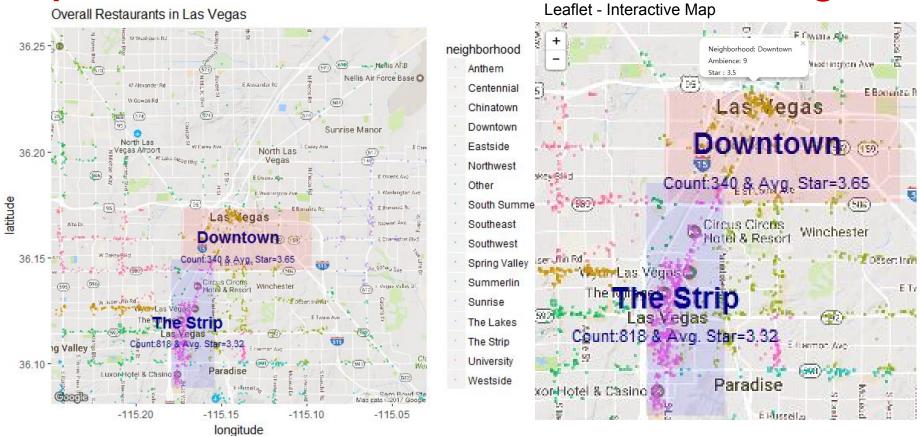
Interactive Business Data in Las Vegas

how 10 \checkmark entries				Search:		
	neighborhood $\mbox{$\phi$}$	name	postal_code	categories	stars	
1	Downtown	Robo Duck Truck	89101	[u'Food', u'Restaurants', u'Food Trucks', u'Asian Fusion']	4.5	
2	Downtown	El Ausente	89104	[u'Mexican', u'Restaurants']	5	
3	Downtown	Lola's A Louisana Kitchen	89102	[u'Cajun/Creole', u'Restaurants']	4	
4	Downtown	Jimmy John's	89102	[u'Delis', u'Food Delivery Services', u'Food', u'Sandwiches', u'Restaurants']	3.5	
5	Downtown	Rachel's Kitchen	89106	[u'Restaurants', u'Juice Bars & Smoothies', u'American (New)', u'Food', u'Cafes', u'Sandwiches']	4.5	
6	Downtown	Cilantro Taco Grill	89101	[u'Restaurants', u'Mexican']		
7	Downtown	Jimmy John's	89101	[u'Food Delivery Services', u'Restaurants', u'Fast Food', u'Sandwiches', u'Food']		
8	Downtown	Magnolia's Veranda	89101	[u'American (Traditional)', u'Restaurants']		
9	Downtown	Top of Binion's Steakhouse	89101	[u'Steakhouses', u'Restaurants', u'Bars', u'Wine Bars', u'Seafood', u'Nightlife']		
10	Downtown	Pura Vida Bakery & Bystro	89102	[u'Food', u'Caribbean', u'Restaurants', u'Vegan', u'Bakeries']		
how	ing 1 to 10 of 1,158 e	ntries		Previous 1 2 3 4 5 116	Next	

Interactive Review Counts/Average Rating per Restaurant in Downtown and the Strip

Show	10 • entries		Search:		
	Neighborhood †	Restaurant Name	Review Counts *	Average Rating \$	
70	Downtown	Pizza Rock	5	4.0	
233	The Strip	Pizzeria Fracesco's	5	3.8	
12	Downtown	Cadillac To Go	4	3.3	
65	Downtown	Ogden Mart	4	3.5	
92	Downtown	Tortas El Rey	4	3.8	
126	The Strip	Burger Lounge	4	4.0	
130	The Strip	California Pizza Kitchen	4	3.5	
191	The Strip	Johnny Rockets	4	4.0	
199	The Strip	Lasalsa Fresh Mexican Grill	4	4.8	
210	The Strip	McDonald's	4	4.5	

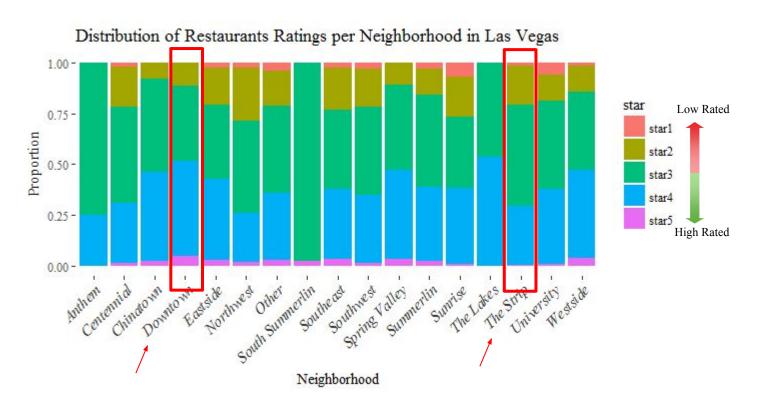
Spatial Distribution of Restaurants in Las Vegas



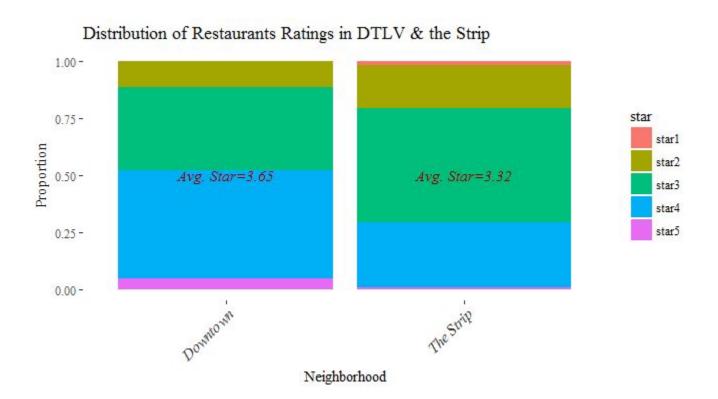
Spatial Distribution of Restaurants in Las Vegas



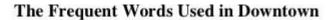
Varied Restaurant Ratings per Neighborhood in LV

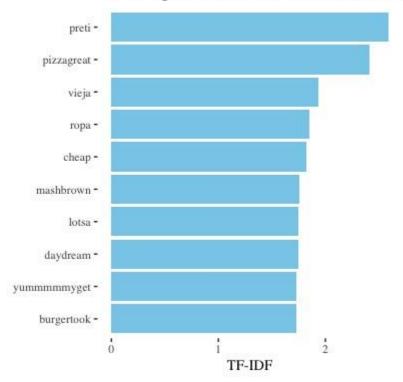


Downtown has Higher Ratings than The Strip

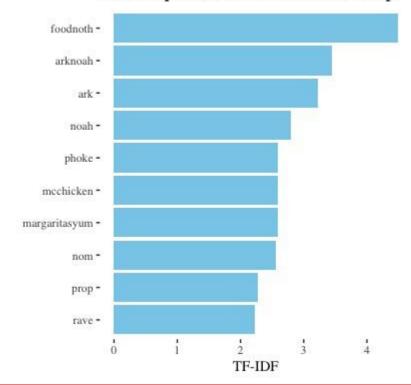


Frequent Words Used in Each Neighborhood





The Frequent Words Used in The Strip

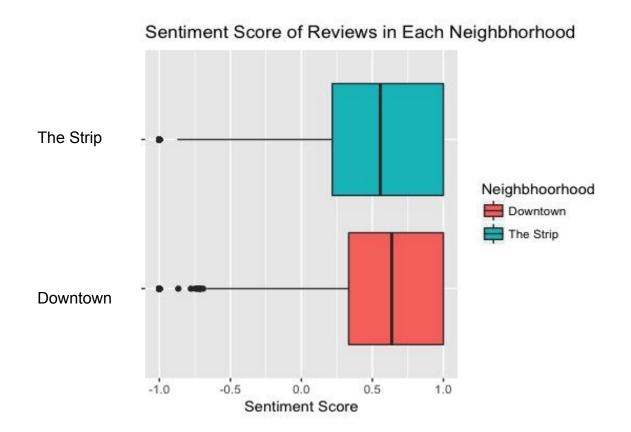


Different wordcloud of The Strip vs. Downtown

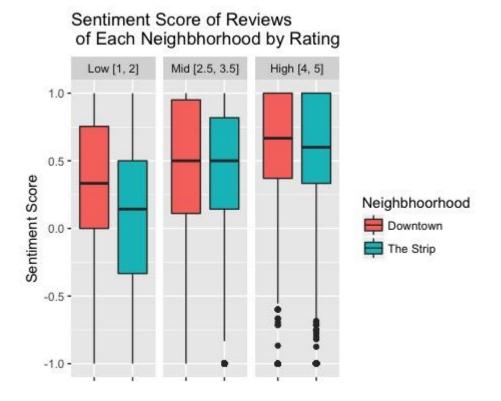
Downtown The Strip

mason hot

Sentimental score of The Strip vs. Downtown in General are similar



Sentiment Analysis of The Strip vs. Downtown by Star Rating



Next, We Built a Consumer Preference Model

Review Topics

Review Attributes
(Sentiment,
Number of Words,
Total Reviews)

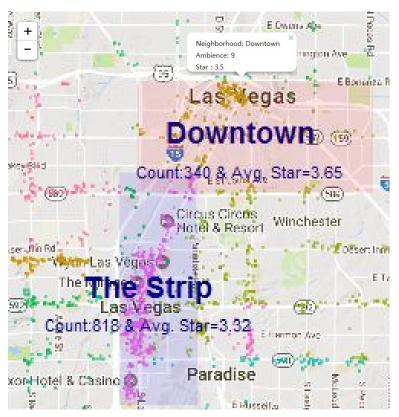
Restaurant
Attributes
(Cuisine, Dietary
Restrictions,
Setting)

Restaurant Rating

Next, We Built a Consumer Preference Model

46				
Alcohol	Caters	RestaurantsTakeOut		
Ambience	Corkage	background_music		
BikeParking	DietaryRestrictions	DietaryRestrictions		
BusinessAcceptsCreditCards	RestaurantsCounterService	WheelchairAccessible		
BusinessParking	RestaurantsReservations	classy		
DriveThru	BestNights	AgesAllowed		
GoodForKids	CoatCheck	AcceptsInsurance		
GoodForMeal	GoodForDancing	HairSpecializesIn		,
HasTV	HappyHour	# Binary Variables_	hc Category	Category_keyword
NoiseLevel	Music	1 Alcohol. none	Alcohol	none
OutdoorSeating	Smoking	2 Ambience.roman	N. W. C.	
RestaurantsAttire	None	3 Ambience.intima		ALCOHOLOGICA PAR
		4 Ambience.classy	10.000.0000.0000	
RestaurantsPriceRange	breakfast	5 Ambience.hipste	r Ambience	hipster
RestaurantsTableService	RestaurantsDelivery	6 Ambience.divey	Ambience	divey
WiFi	RestaurantsGoodForGroups	7 Ambience.tourist	ty Ambience	touristy
		8 Ambience.trendy	Ambience	trendy
BYOB BusinessAcceptsBitcoin		9 Ambience.upscal	e Ambience	upscale
BYOBCorkage	ByAppointmentOnly	10 Ambience.casual		

Spatial Distribution of Restaurants in Las Vegas



Leaflet - Interactive Map

Neighborhood: Downtown

Ambience: 9

Star: 3.5

Ratings per Ambiance of Restaurants in Old and New Vegas





Overall, similar trend of ratings per ambiance, but restaurant customers in the Strip prefers "Classy" and "Upscale" restaurants a bit more.

Ratings per Alcohol attribute of Restaurants in Old and New Vegas





The Strip region's restaurants are high-rated if they sell alcohol drinks

Downtown restaurants slightly have this trend, too, but boozy option is more popular in the Strip.

Implications & Next Steps

Implications

- More spatial clusters of restaurants in New Vegas
- High-End \$\$\$ Restaurants are preferred and exist more in New Vegas
- Overall sentiment score for two regions are similarly distributed and somewhat popular
- However, consumers in the Strip are more likely to get negative sentiment in low rated restaurants
- Casual restaurants are welcomed in both areas
- Up-scaled/romantic restaurants are welcomed in both areas

Consumers in Old Vegas is more budget-minded than those of New Vegas Consumers in New Vegas are more likely to be the traveler for specific events, funs, and traveling

Next Steps

Include more business attributes for restaurants (e.g. Wi-Fi, attributes, price range etc.) to improve consumer preference models in Leaflet

Publish our work in HTML public webpage

Thank you!

Appendix

Source

GitHub:

https://github.com/Columbia-University-QMSS/QMSS_G4063_final_project_V eronica_Eileen.git

Dataset: https://www.yelp.com/dataset_challenge