# MINING YELP REVIEW DATA FROM LATENT RATINGS TO A RECOMMENDATION SYSTEM

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# YELP DATASET

## **Review Object**

Field	Description
user_id	Unique user id
business_id	Unique business id
stars	Star rating
date	date
text	Review text

## Restaurant Object

Field	Description
business_id	Unique business id
name	Business name
city	city
is_open	0 or 1 for closed or open
stars	Star rating
attributes	Business attributes
categories	Categories business belongs to

# YELP REVIEWS



Jae L. Elite '20

**256** ★ 196 **2** 150

5 STARS

★ ★ ★ ★ 9/20/2020

This place is rich with history as well as rich with delicious flavor. Ive been to Mexico a few times (from the city to southern region of Veracruz and puebla) and each place i went to, Ive always tried tacos. This place is the exact type of flavor and texture as i had back in the native land.

Read more



Johnny L. Elite '20



9/15/2020

tried the amazing, notoriously good lamb tacos.. one question, have you had a lamb taco before? I have because I went to this place and it was tender, not too gamey.. pretty interesting

the only thing is it could've used a little more salt for the meat.. but indeed a goo... Read more

4 STARS

# PROBLEMS WITH THE RAW STAR RATING

- 1. User give rating based on number latent criterias
  - a. Opinion about aspects of restaurant experience (e.g. location, quality of food)
- 2. Star rating cannot reflect those criteria
- 3. Need a way to extract useful information about different aspects of restaurant experience from text

**<u>GOAL</u>**: Come up with a recommender system that incorporates user importance on different aspects

# WORD CLOUDS OF TEXT REVIEW

#### 1-Star Review

#### 5-Star Review

```
place plate MexicanName bar another money service Maybe fo fami basement food try will save lunch Worst went re Well Today tell dtype restaurant standards defiantly overpriced fastreview_text long pic bought object line Hopefully
```

```
describe the place perfect super gr object sauce words friend of the place object sauce words homemade loved time find Name excited stay due
```

# TOPIC MODELING OF FOOD CATEGORIES

15 CATEGORIES

Pizza

Breakfast Sandwich

> Thai Beer

Sweets

Mexican Vegetarian

> Buffet Greek

Drinks American

Italian

Vietnamese

Japanese

# TOPIC MODELING OF LATENT ASPECTS

#### PRICE

Worth Check Price Reasonable Pay Size

Small

#### AMBIENCE

Atmosphere
Vibe
Spot
Clean
Location
Decor
smell

#### SERVICE

Time
Service
Slow
Fast
Bartender
Seat
Waitress

#### FOOD

Quality Order Appetizer Delicious Chicken Dish Meal

## TOPIC MODELING OF LATENT ASPECTS



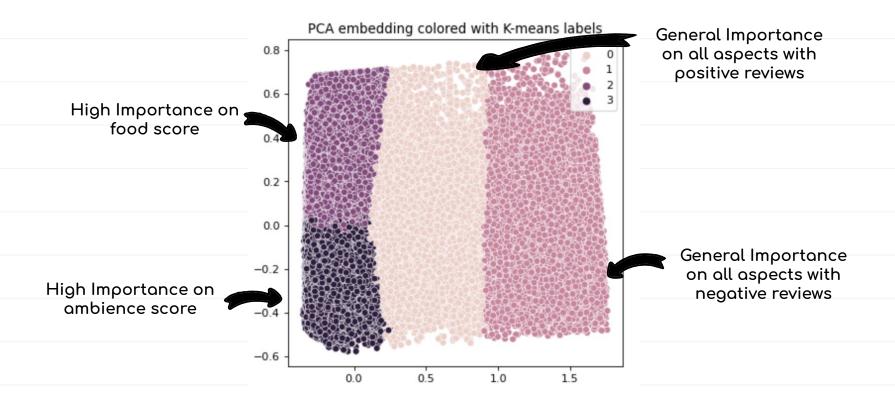
I have always found the Toro & Maguro very fresh here.
The smoked Salmon is always delight as well as the oysters.

Food

The Tempura is plentiful yet never greasy.

Food: 0.52 Service: 0.25 Ambience: 0.22 Price: 0

# K-MEANS CLUSTERING AND PCA



# RECOMMENDATION SYSTEM

- 1. User picks a type of food from 15 categories
- 2. User ranks the 4 criteria (aspects) on a scale of 0-5 for importance
- 3. Recommend Top N restaurants

# LOOKING AT SPECIFIC USER



# RECOMMENDED TOP 5 AMERICAN RESTAURANTS

BISTROS, FOOD: 0.52 SERVICE: 0.4 AMBIENCE: 0.36 PRICE: 0.14 BISTRO 19 AMERICAN BURGERS, DIVE BAR AND FOOD: 0.44 SERVICE: 0.39 PRICE: 0.19 AMBIENCE: 0.47 AMERICAN GRILLE PATRICK'S PUB AMERICAN, SERVICE: 0.53 PRICE: O.Z FOOD: 0.57 AMBIENCE: 0.25 AND GRILLE BAR5 AMERICAN, FOOD: 0.49 SERVICE: 0.41 SAVOY AMBIENCE: 0.39 PRICE: 0.14 BARS SUNSERI JIMMY AMERICAN, AMBIENCE: 0.38 FOOD: 0.51 SERVICE: 0.51 PRICE: 0.15 + NINO SANDWICH

# THANK YOU!

# **slides**go