



The New York Times

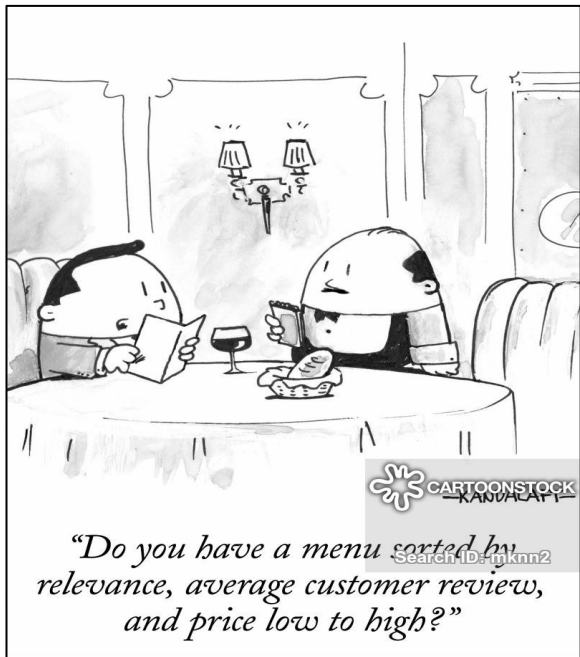
Restaurant Reviews



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Influence of Restaurant Reviews



CNN travel

DESTINATIONS FOOD & DRINK

FOOD & DRINK

Cheese soufflé at heart of trial over French chef's lost Michelin star

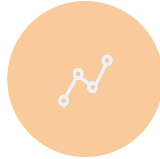
LIFE & STYLE

A Reckoning With the Dark Side of the Restaurant Industry

In the wake of Anthony Bourdain's suicide, chefs and restaurateurs speak out about rampant stress, depression in the field and ways to fight back

Agenda

Data



Findings



Objective



Analysis



Next Steps

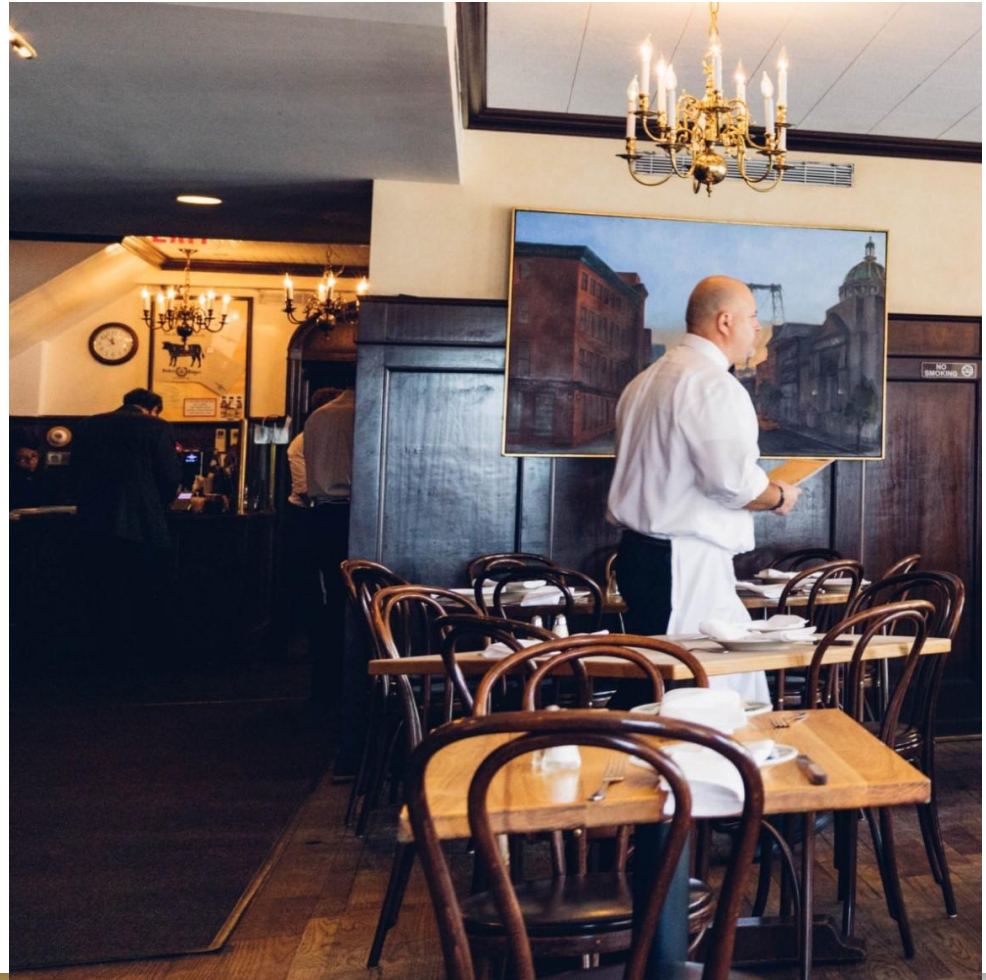
Background

The *New York Times* (NYT) has a large reader base and plays an important role in shaping public opinion and setting the tone of the public discourse, especially in the U.S.

“I had steak at Peter Luger after The New York Times gave it a scathing zero-star review, and it didn’t live up to the hype”

Objective

Understand the influence of NY reviews on restaurant perceptions



Data Summary



**Scraping
Yelp and NYT
Reviews**



**Sanity
Check**



**Filtering
relevant
data**



- > List of 19 restaurants
- > Data filtered for different dates as per the New York Times review (6 months before and 6 months after)
- > Average 600 reviews per restaurant



Topic Modelling



Sentiment Analysis



Evaluation

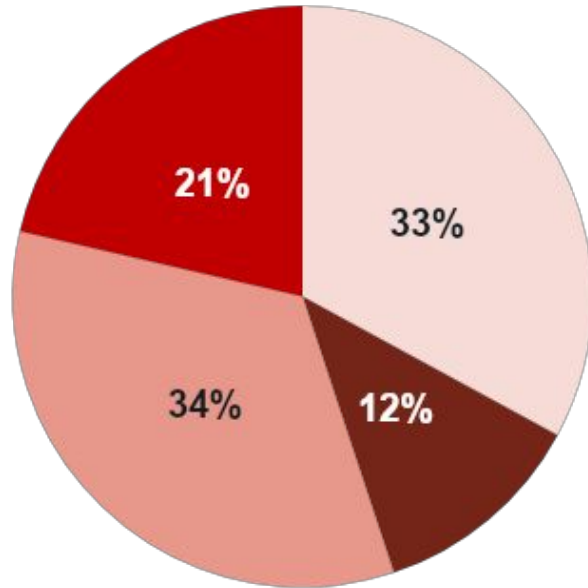


Popular Keywords in Yelp Restaurant Reviews



Topic Modeling

What topics mattered the most?



■ Ambience ■ Asian ■ Food quality ■ Service

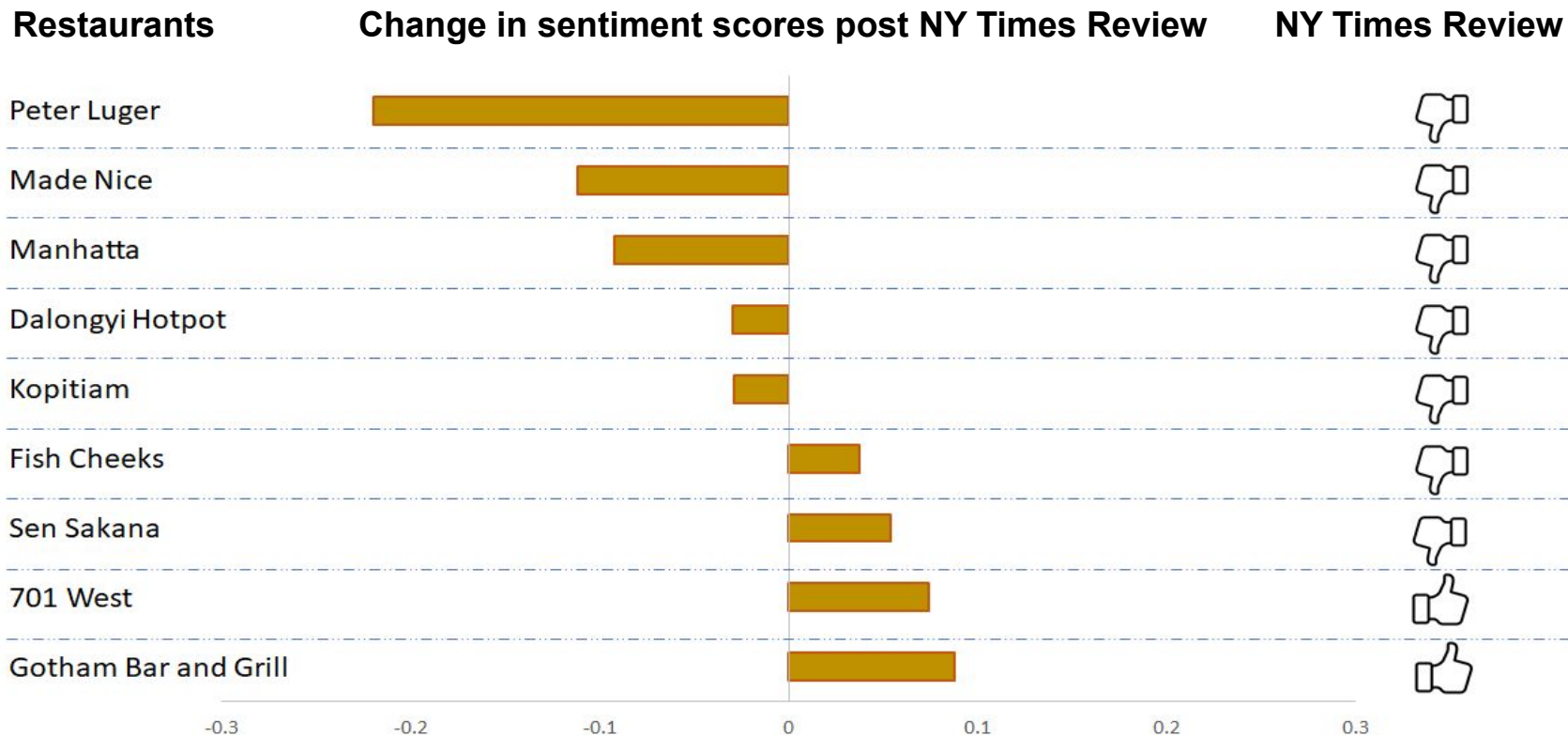
-  Ambience : Place, Experience, View
-  Asian : Kaya, Malaysian, Rice
-  Food quality : Dish, Make, Order
-  Service : Wait, Table, Place

Topics Discussed across Restaurant Reviews

Restaurant	New York Times Reviews (Topics)	Yelp Reviews (Topics)
Coco Pazzo	Food Quality	Food Quality
Dalongyi Hotpot	Food Quality	Food Quality
Fish Cheeks	Food Quality	Food Quality
Gotham Bar and Grill	Food Quality	Ambience
Kopitiam	Asian	Asian
Made Nice	Food Quality	Food Quality
Manhatta	Ambience	Ambience
Peter Luger	Service	Service
Sen Sakana	Ambience	Ambience
Tsismis	Asian	Asian
701 West	Ambience	Ambience

Sentiment Analysis

How did review shift sentiment?



How Did NYT Review Affect Peter Luger's Sentiment?



Pre NYT Review

- **86%** positive sentiment
- Popular keywords:
**Great, Amazing,
Delicious, Dessert**



NYT Review Sentiment

- **67%** negative sentiment
- Popular keywords:
**Undercooked, Modest,
Chef**



Post NYT Review

- **72%** positive sentiment
- Popular keywords:
**Bland, Poor
Mediocre, Steak**

Problem with Approximating Footfall at Restaurants

[Overview](#) [Photos](#) [Menu](#) [Specials](#) [Reviews](#) [Twitter](#)

Boulud Sud

★★★★★ 4.6 5922 Reviews \$50 and over Mediterranean

Top Tags: [Pre/Post Theatre](#) [Special Occasion](#) [Creative Cuisine](#)

Chef Daniel Boulud's vibrant Mediterranean menu offers flavors from France, Spain, Italy, Greece, North Africa and Turkey. There is an emphasis on grilled fish and meats as well as an abundance of fresh vegetables. With an entrance on West 64th Street, Boulu...

Make a reservation

Party Size

For 2

Date

Today

Time

9:30 PM

Find a Table

Booked 97 times today

Special offers available. [See details](#)

I'll reserve

- Confirmation is immediate
- No registration required
- No booking or credit card fees!

2 other people looked for your dates in the last 10 minutes

Summary



The NYC reviews do touch upon similar topics that are discussed between customers in Yelp



The reviews also catalyze the shift of sentiments across customers, thus effecting a lot on Restaurant's reputation

Future Scope



Yelp Sentiment Analyzer :

- Analysis of the topics, sentiments and trends to present a report on periodic basis
- Observing how changes in reviews and NYC article impact the business. Estimation of a dollar value



Scraping data from other webpages and observing whether these patterns are universal

Questions