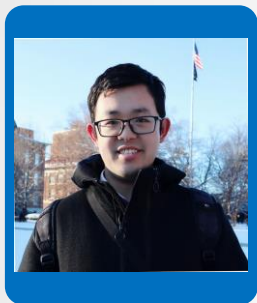


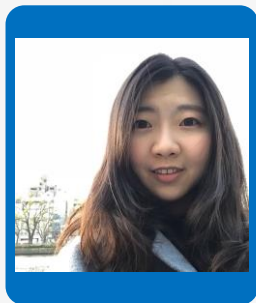
# How food delivery time affect your willingness to place an order?

Yulong Gong, Tzuhua Huang, Chenzhi Pan, Muyan Xie, Yichi Zhang, Yangyang Zhou

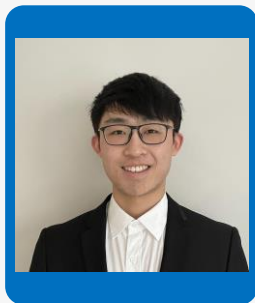
# Our Researchers



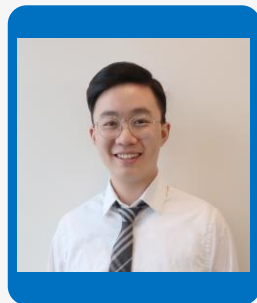
Yulong Gong



Tzuhua Huang



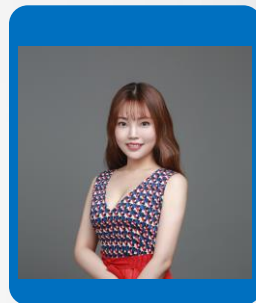
Chenzhi Pan



Muyan Xie



Yichi Zhang



Yangyang Zhou

# Agenda



## Introduction



## Experiment Design



## Analysis

- Balance check
- ATE & CATE & Heterogeneity
- Cuisine Analysis

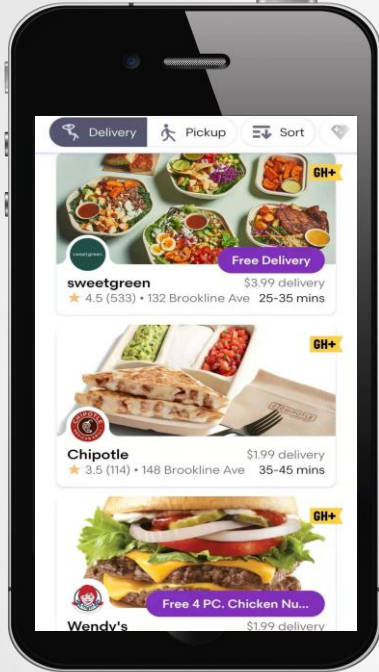


## Conclusion

- limitation
- Future research
- Bibliography



# Introduction



## Research Question

When everything holds constant, how will the food delivery time interval affect a consumer's willingness to place an order?

- According to Resendes (2020), 33% of customers are willing to pay more in exchange for faster delivery speed.
- From Feb.2020 to Apr.2020, the restaurants who actively use online ordering increase 169% and weekly sales increase 840%.



## Hypothesis

Under the same ordering time condition, the shorter the delivery time period is, the more willingly the consumer is to place the order.



## Implications

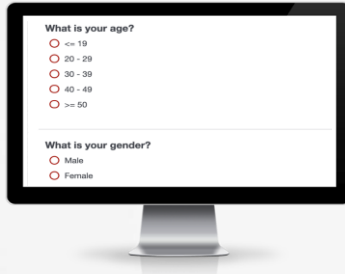
- Have a better understanding of the influence of wait time on consumers' willingness to place an order.
- Help to develop an win-win environment for consumers and businesses entities.

# Experiment Design



# Questionnaire Design

## Step 1: Collect users' general information.



What is your age?

- ☐ <= 19
- ☐ 20 - 29
- ☐ 30 - 39
- ☐ 40 - 49
- ☐ >= 50

What is your gender?

- ☐ Male
- ☐ Female

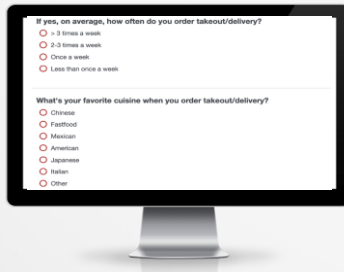
What is your age?

What is your gender?

Are you a student?

Do you currently work/study from home?

## Step 2: Understand users' experience of using food delivery service app.



If yes, on average, how often do you order takeout/delivery?

- ☐ > 3 times a week
- ☐ 2-3 times a week
- ☐ Once a week
- ☐ Less than once a week

What's your favorite cuisine when you order takeout/delivery?

- ☐ Chinese
- ☐ Fastfood
- ☐ Mexican
- ☐ American
- ☐ Japanese
- ☐ Italian
- ☐ Other

How often do you order takeout/delivery?

What's your favorite cuisine when you order takeout/delivery?

Do you currently have an account on the following platforms?

Are you a prime member of these platforms?

# Questionnaire Design

Step 3: Simulate two interfaces and randomly assign one of them to the participants.

## Treatment



**TGI Fridays**  
\$0.49 Delivery Fee  
15-25 min

Suppose you are about to have lunch, according to the information we provide in the image, will you order this restaurant?



**Kaze Shabu Shabu**  
\$0.49 Delivery Fee  
35-45 min

☐ Yes  
☐ No

Suppose you are about to have lunch, according to the information we provide in the image, will you place an order?



**Smokey Bones**  
\$0.49 Delivery Fee  
25-35 min

☐ Yes  
☐ No

Suppose you are about to have lunch, according to the information we provide in the image, will you place an order?



**TGI Fridays**  
\$0.49 Delivery Fee  
15-25 min

☐ Yes  
☐ No

Suppose you are about to have lunch, according to the information we provide in the image, will you place an order?



**Dumpling Kitchen**  
\$0.49 Delivery Fee  
35-45 min

☐ Yes  
☐ No

Suppose you are about to have lunch, according to the information we provide in the image, will you place an order?



**Pepi's Pizzeria**  
\$0.49 Delivery Fee  
30-40 min

☐ Yes  
☐ No

Suppose you are about to have lunch, according to the information we provide in the image, will you place an order?



**TGI Fridays**  
\$0.49 Delivery Fee  
10-40 min

☐ Yes  
☐ No

Suppose you are about to have lunch, according to the information we provide in the image, will you place an order?



**Kaze Shabu Shabu**  
\$0.49 Delivery Fee  
20-60 min

☐ Yes  
☐ No

Suppose you are about to have lunch, according to the information we provide in the image, will you place an order?



**Pepi's Pizzeria**  
\$0.49 Delivery Fee  
10-60 min

☐ Yes  
☐ No

Suppose you are about to have lunch, according to the information we provide in the image, will you place an order?



**Dumpling Kitchen**  
\$0.49 Delivery Fee  
20-60 min

☐ Yes  
☐ No

Suppose you are about to have lunch, according to the information we provide in the image, will you place an order?



**Smokey Bones**  
\$0.49 Delivery Fee  
10-50 min

☐ Yes  
☐ No



**TGI Fridays**  
\$0.49 Delivery Fee  
10-40 min

## Control

# Analysis:Balance Check

Dependent variable:					
	wfh (1)	student (2)	member (3)	frequency (4)	chinese (5)
any_treatment	0.044 (0.067)	-0.067 (0.057)	0.156 (0.098)	0.111 (0.101)	0.044 (0.097)
Constant	0.867*** (0.047)	0.956*** (0.040)	0.600*** (0.069)	0.600*** (0.071)	0.689*** (0.068)
Observations	90	90	90	90	90
R2	0.005	0.015	0.028	0.014	0.002
Adjusted R2	-0.006	0.004	0.017	0.002	-0.009
Residual Std. Error (df = 88)	0.317	0.269	0.466	0.477	0.458
F Statistic (df = 1; 88)	0.442	1.390	2.510	1.220	0.212

Note:

\*p<0.1; \*\*p<0.05; \*\*\*p<0.01



Are you a student?



Do you currently work/study from home?



Are you a member of any food delivery platforms?



How often do you order delivery?



What's your favorite cuisine ?

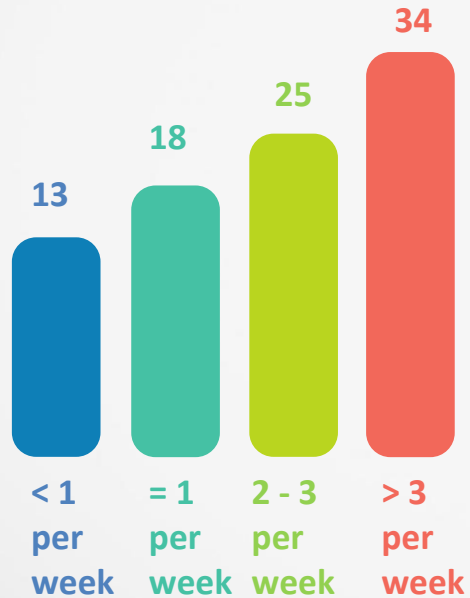


When you order takeout/delivery?

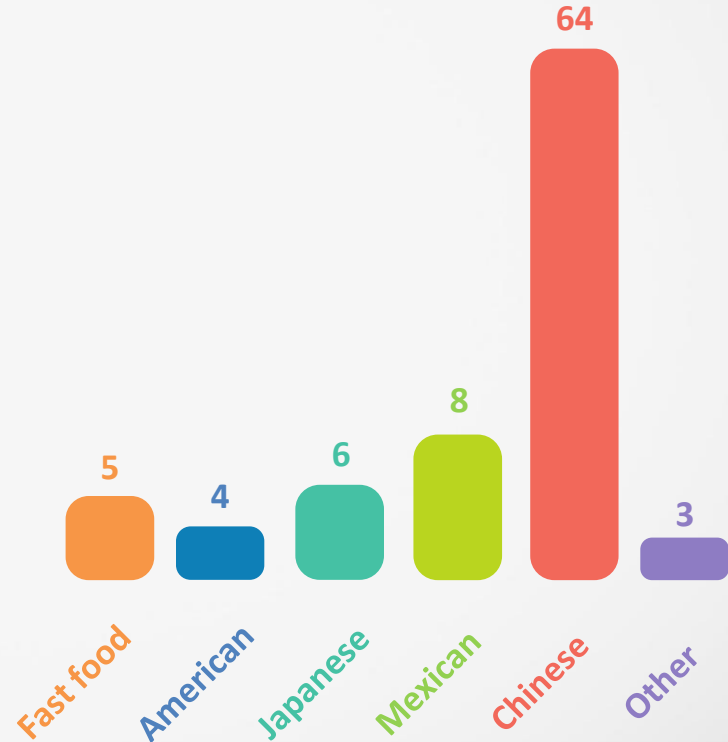


# Analysis:EDA

Order Frequency Distribution



Food Preference Distribution



# Analysis: ATE & Heterogeneity

## ATE

- **Probability of ordering ~ any\_treatment**
  - Treatment group is 13 % more likely to order
  - Significant at 95% level

## Heterogeneity

- **Favor Cuisine**
  - **probability of ordering ~ any\_treatment \* favor cuisine (Chinese / non-Chinese)**
    - CATE for Chinese: 13.2%
    - CATE for non-Chinese: 11.2%
- **Order Frequency**
  - **probability of ordering ~ any\_treatment \* order frequency (> 2 times a week/ otherwise)**
    - CATE for High-frequency user: 16.4%
    - CATE for Low-frequency user: 4%

# Analysis: Cuisine

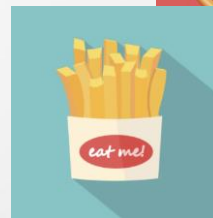


## restaurants ~ any\_treatment

- Fast Food and Italian Food: the difference between treatment group and control group is statistically significant at 90% confidence level.
- The result might implies that people who order from a fast food restaurant or a pizzeria are more time sensitive. They want their delivery time range as short as possible.

Dependent Var.:	American	Japanese	Italian
(Intercept)	0.5556*** (0.0749)	0.6889*** (0.0698)	0.3778*** (0.0731)
any_treatment	-0.0222 (0.1062)	0.1333 (0.0905)	0.2000. (0.1043)
S.E. type	Heteroskedas.-rob.	Heteroskedas.-rob.	Heteroskedas.-rob.
Observations	90	90	90
R2	0.00050	0.02406	0.04008
Adj. R2	-0.01086	0.01297	0.02917

Dependent Var.:	Chinese	Fast
(Intercept)	0.7111*** (0.0683)	0.5333*** (0.0752)
any_treatment	0.1556. (0.0854)	0.2000* (0.1005)
S.E. type	Heteroskedas.-rob.	Heteroskedas.-rob.
Observations	90	90
R2	0.03632	0.04306
Adj. R2	0.02537	0.03219



# Conclusion

## Conclusion:



ATE: 13%, Significant at 95% level

CATE: Chinese(13.2),  
Non-Chinese(11.2%);  
High-

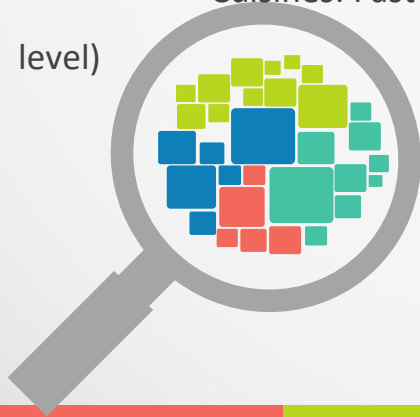
frequency(16.4%),



Low-frequency(4%).

Cuisines: Fast and Italian(90%

level)



## Limitation:

Questionnaire design:



Incomprehensive food type



Wording issue



Picture choosing



Distribution

## Future research:



Distributed in a large scale, to find out block-wise characteristics.



Add a question about the price to test the relationship between waiting time and spending price.

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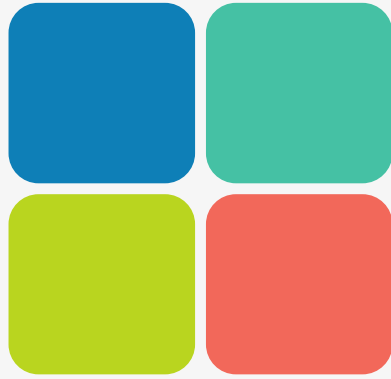
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Q&A





Thanks!