# Price Controls in a Multi-Sided Market

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# Digital platforms and platform regulation

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- Few settings with comparable, distinct platform markets that are differentially regulated
- One such setting: the US food delivery industry
  - · Many cities have capped commissions that delivery platforms charge to restaurants
  - 22% of restaurants affected by April 2021
  - · Intended to benefit restaurants; proponents argue that platforms reduce restaurant profits

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  - · benefits consumers who value variety of restaurants



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  - · but restaurants may prefer lower platform ordering
- Net effects of caps on restaurant and consumer welfare are thus uncertain



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- Approach
  - Assemble rich collection of data
  - · Estimate effects of caps via differences-in-differences event study
  - Formulate model of platform & restaurant competition
  - Use estimated model for policy evaluation

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- · Cap on both consumer fees and restaurant commissions may hurt restaurants
- · Rise of platforms has benefitted consumers but reduced restaurant profits
  - Platform membership is a prisoner's dilemma for restaurants

# Contributions



Estimate effects of price controls in a platform market

- Literature largely focuses on payment card interchange fees [Evans et al. 2015, Manuszak and Wozniak 2017, Kay et al. 2018, Chang et al. 2005, Wang 2023]
- · Li and Wang (2021) estimate effects of commission caps on delivery fees

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- · Li and Wang (2021) estimate effects of commission caps on delivery fees
- 2 Evaluate impacts of food delivery platforms on restaurant industry
  - Work on welfare consequences of digital platforms focuses on ride-hailing, accomodations [Castillo 2022, Calder-Wang 2022, Schaefer and Tran 2020, Farronato and Fradkin 2022]
  - Build upon literature on estimation of network-effects [Rysman 2004, Lee 2013, Farronato et al. 2020, Cao et al. 2021 Kaiser and Wright 2006, Fan 2013, Ivaldi and Zhang 2020, Sokullu 2016, Natan 2021]

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2 Evaluate impacts of food delivery platforms on restaurant industry

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8 Analyze decentralized pricing by sellers who set separate prices on and off platforms

- Empirical platform pricing literature focuses on fee/commission setting by platforms rather than pricing by platform users [Rosaia 2020, Ho and Lee 2017, Argentesi and Filistrucchi 2007]
- Complements Robles-Garcia (2022) (decentralized pricing without online/offline distinction) and Gaineddenova (2022) (efficiency of centralized vs. decentralized pricing)



# Setting and data

#### 2 Three empirical findings

#### Model





# Setting and data

- Main players:
  - 🚺 DoorDash
  - Ø Uber Eats
  - 6 Grubhub
  - 4 Postmates (owned by Uber)
- Staggered adoption of commission caps by cities, counties, states
- Typical cap level is 15% (84% of policies)
  - 30% without cap





# Price structure of delivery platforms

Consumer Bill = p + c

Restaurant Revenue = (1 - r)p

Platform Revenue = c + rp

where

- *p* = price of restaurant meal
- c = platform's consumer fees
  - · Focus on fixed fees, which responded to caps
- r = platform's restaurant commission rate



#### Consumer choices

- · Panel of itemized receipts from Numerator;
- + pprox 600k orders/month, 2019–21
- Includes platform, pick-up, first-party delivery, & on-premises orders
- Matches census, credit-card data
- Supplement with ZIP/month panel of sale & fee estimates

Paid with Visa Ending in 4073 Sushi Mizu Total: \$16.98

#### Your receipt

224 Park St, New Haven, CT 06511, USA

#### - For: Rolland Sullivan -

- 1x Any Favorite 3 Rolls (Sushi Bar Lunch) \$12.95
  - Salad
  - Peanut Avocado
  - Mango Avocado
  - Vegetable

| Get Order Help |         |
|----------------|---------|
| Total Charged  | \$16.98 |
| Tip            | \$1.00  |
| Service Fee    | \$1.94  |
| Delivery Fee   | \$0.00  |
| Taxes          | \$1.09  |
| Subtotal       | \$12.95 |

- Consumer choices
- Restaurants
  - Characteristics of restaurants on each platform and offline, 2020–21



Platform

- Both
- Doordash
- Uber Eats

- Consumer choices
- Restaurants
- Platform consumer fees and wait times
  - Scrape platform websites in Q2 2021 for 14 large metro areas
  - Use to construct platform/ZIP-level fee & wait time indices

# DoorDash's response to Chicago's commission cap

| Subtotal  | \$16.00 |
|---|---------|
| Chicago Fee 🛈   | \$1.50  |
|   | \$2.99  |
| Chicago has temporarily capped<br>the fees that we may charge local<br>restaurants. To continue to offer                                | \$3.96  |
| you convenient delivery while<br>ensuring that Dashers are active<br>and earning, you will now see a<br>charge added to Chicago orders. | \$4.00  |
|   | Other   |

Caps raise consumer fees, reduce platform sales, raise platform update by restaurants

- Estimate effects of 15% cap by diff-in-diff
- Platform consumer fees rise by 9–22%
- Platform orders fall by 6%
- Share of restaurants on a platform rises by 8%



#### **Modelling choice**

Endogenous fees, ordering, platform adoption

#### Effect on DoorDash consumer fees

Caps raise consumer fees, reduce platform sales, raise platform update by restaurants

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Effect on DoorDash sales

#### **Modelling choice**

Endogenous fees, ordering, platform adoption

1) Caps raise consumer fees, reduce platform sales, raise platform update by restaurants

2 Restaurants charge higher prices on platforms

- · On average, a restaurant charges 26% more on a platform than for a direct order
- Full pass-through under 30% commission  $= 0.3/(1-0.3) \approx 42\%$

#### Modelling choice

Restaurant pricing with online/offline distinction, commission pass-through

- 1) Caps raise consumer fees, reduce platform sales, raise platform update by restaurants
- 2 Restaurants charge higher prices on platforms
- 3 Both consumers and restaurants multihome

- Over half of restaurants on DoorDash are on Uber Eats
- Consumers order from the same platform across consecutive orders pprox 80% of the time

#### **Modelling choice**

Flexible multihoming on both sides



Your cost

30% Delivery Commission Payment processing included

Platforms set

Your cost

**30%** Delivery Commission Payment processing included







Platforms set commission rates

Restaurants sign up for platforms





Platform commission setting

Restaurant platform adoption

Restaurant price and platform fee setting

Onsumer choice

# Model of consumer eating

- Consumers *i* in ZIPs *z* of metros *m*
- Each consumer makes T choices/month
- Eating options:
  - 1 home-made meal (j = 0)
  - 2 order meal directly from a restaurant j (f = 0)
  - **(3)** order meal from a restaurant *j* using a platform  $f \neq 0$
- Platform sales depend on...
  - # of restaurants on each platform
  - platforms' consumer fees c
  - restaurant prices *p* of standardized meal



# **Consumer preferences**

• Consumer *i* chooses a restaurant/platform pair (j, f) to maximize

$$\mathbf{v}_{ijft} = \begin{cases} \psi_{if} - \alpha_i \mathbf{p}_{jf} + \eta_i + \nu_{ijt}, & j \neq \mathbf{0} \\ \nu_{i0t}, & j = \mathbf{0} \end{cases}$$
(Restaurant meal) (Home-prepared meal)

among restaurants within five miles of consumer's ZIP, where

- $\psi_{if}$  = utility index for platform f
- $p_{jf}$  = restaurant j's price on platform f
- $\eta_i$  = tastes for restaurant food
- $\nu_{ijt}$  = tastes for restaurant j

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- $\nu_{ijt}$  = tastes for restaurant *j*
- Specify consumer i's taste for platform f as



Network effects, consumer information, and restaurant discovery Details

Platform commission setting

Restaurant platform adoption

8 Restaurant price and platform fee setting

Consumer choice

# Restaurant price setting and platform fee setting

· Restaurants set prices for direct orders and on each platform to maximize profits

Details

• Platform f sets consumer fees  $c_{fz}$  in ZIP z to maximize its profits in z:



Marginal costs represent payments to couriers



#### Platform commission-setting

#### 2 Restaurant platform adoption

Restaurant price and platform fee setting

#### Consumer choice

· Restaurants simultaneously join platforms:

$$\underbrace{\mathcal{G}_{j}}_{\text{Chosen set of platforms}} = \arg \max_{\mathcal{G}} \underbrace{\mathbb{E}\left[\bar{\Pi}_{j}(\mathcal{G}, \mathcal{J}_{m,-j})\right]}_{\text{Expected variable profits}} - \underbrace{\mathcal{K}_{m}(\mathcal{G})}_{\text{Fixed costs of of platform adoption}} + \underbrace{\omega_{j}(\mathcal{G})}_{\text{Choice disturbance}}$$

where  $\mathcal{J}_{m,-i}$  = platform adoption of rival restaurants

#### Platform commission setting

- Profit-maximization
- · Account for dynamic considerations in reduced-form fashion

Restaurant platform adoption

Restaurant price and platform fee setting

#### Consumer choice



# Overview of estimation

#### Consumer preferences

- Estimate via MLE on Q2 2021 consumer panel for 14 large metros
- · Specify platform/metro fixed effects & exploit within-metro variation
- · When Uber Eats raises fees in Chicago,
  - 31% of lost consumers substitute to direct-from-restaurant ordering
  - 30% to other platforms
  - 38% to homemade meal
- Restaurant marginal costs
  - Recover from first-order conditions
- Restaurant platform adoption model
  - Estimate via GMM on restaurant platform adoption data
- Platform costs
  - Recover from first-order conditions

#### Consumer preferences

Estimate via MLE on Numerator transactions panel for Q2 2021

#### 2 Restaurant marginal costs

- Recover from first-order conditions
- 15% commission cap raises restaurants' markups on platforms by 89%

#### Restaurant platform adoption model

- Estimate via GMM on restaurant platform adoption data
- Platform costs
  - · Recover from first-order conditions

# Overview of estimation

#### Consumer preferences

Estimate via MLE on Numerator transactions panel for Q2 2021

#### Restaurant marginal costs

Recover from first-order conditions

#### 3 Restaurant platform adoption model

- · Estimate via GMM on restaurant platform adoption data
- · Match observed patterns of platform adoption

#### Platform costs

· Recover from first-order conditions

## Estimates of restaurants' fixed costs of platform adoption

- Decreasing incremental costs for joining platforms (\$'000s)
- Elasticity of # of restaurants on DoorDash with respect to DoorDash's commission rate
  - $\bullet = -0.52$  for Chicago metro area



Compare to mean monthly profits of \$12.6k for restaurant on no platform

# Overview of estimation

#### Consumer preferences

- Estimate via MLE on Numerator transactions panel for Q2 2021
- Restaurant marginal costs
  - Recover from first-order conditions
- Restaurant platform adoption model
  - Estimate via GMM on restaurant platform adoption data

#### 4 Platform costs

- Interquartile range of DoorDash delivery cost is \$7.08–9.72
  - DD pays couriers \$2–10/delivery

# Counterfactuals

#### Assess

- 15% commission cap
- 2 15% commission cap + cap on consumer fee increases
- 3 Commission tax Here
- 4 Elimination of platforms

## 15% commission caps benefit restaurants but reduce total welfare



Participant surplus = sum of consumer and restaurant surplus from platforms

## 15% commission caps benefit restaurants but reduce total welfare



# Could consumer fee caps solve commission caps' problems?

- Simulate a 15% commission cap with consumer fee hikes capped at \$1.00
- Policy restrains platform market power
  - Total welfare rises
  - % of restaurants on a platform rises by 10
  - # restaurant orders rises by 6%
- · But restaurants slightly worse off
  - Policy reduces share of orders placed directly by consumers by 12%



- Cap proponents caps argue that the rise of platforms has hurt restaurants
- Effects of platforms on restaurants depend on
  - Market expansion by how much do platforms raise the total # of restaurant orders vs. cannibalize direct-from-restaurant orders?
  - Membership costs by how much do commissions & adoption costs reduce profits?
- Evaluate by simulating platform elimination

# Platforms reduce restaurant profits despite increasing sales

- $\approx \frac{1}{2}$  of orders on platforms would not be placed if platforms did not exist
- · Yet platforms reduce restaurant profits
- Platform membership is a prisoner's dilemma for restaurants

Effects of eliminating platforms

(dollars per capita, annual)

| Outcome                    | Effect  |
|----------------------------|---------|
| Consumer welfare           | -66.98  |
| Restaurant profits         | 17.88   |
| Platform variable profits  | -58.06  |
| Total welfare: lower bound | -107.16 |
| Total welfare: upper bound | -49.10  |

Total welfare bounds:

- Lower  $\Rightarrow$  no platform fixed costs
- Upper  $\Rightarrow$  no platform profits

- 1 Expect seesaw effects in multi-sided markets
- Direct effects of policies targeting platforms may be counteracted by seller responses
  Sellers compete away their benefit from caps by lowering prices, joining more platforms
- 3 Less online business can help platform sellers due to online/offline substitution

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- Platform f's tax payments when commission revenue taxed at rate t
- Set rate t so that revenue equals restaurant gain from 15% cap (before restaurant response to tax)

• Yields tax rate t = 1.8%

Back

Effects of a 15% commission cap and a commission tax, Los Angeles

| Change in                       | Сар    | Tax   |
|---------------------------------|--------|-------|
| Avg. ordering cost (\$)         | 0.52   | 0.05  |
| Avg. commission rate (p.p.)     | -15.00 | -1.36 |
| Shr. adopting a platform (p.p.) |        |       |
| Platform orders (%)             |        |       |
| Restaurant profits (\$ p.c.)    |        |       |
| Platform profits (\$ p.c.)      |        |       |
| Consumer welfare (\$ p.c.)      |        |       |

\$ p.c. = dollars per capita, annual

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| Shr. adopting a platform (p.p.) | 1.93   | 0.18  |
| Platform orders (%)             | -3.17  | -0.26 |
| Restaurant profits (\$ p.c.)    |        |       |
| Platform profits (\$ p.c.)      |        |       |
| Consumer welfare (\$ p.c.)      |        |       |

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| Platform orders (%)             | -3.17  | -0.26 |
| Restaurant profits (\$ p.c.)    | 3.18   | 3.05  |
| Platform profits (\$ p.c.)      | -2.45  | -2.10 |
| Consumer welfare (\$ p.c.)      | -3.25  | -0.25 |

\$ p.c. = dollars per capita, annual