Regulation of and with Digital Platforms: An Empirical Perspective

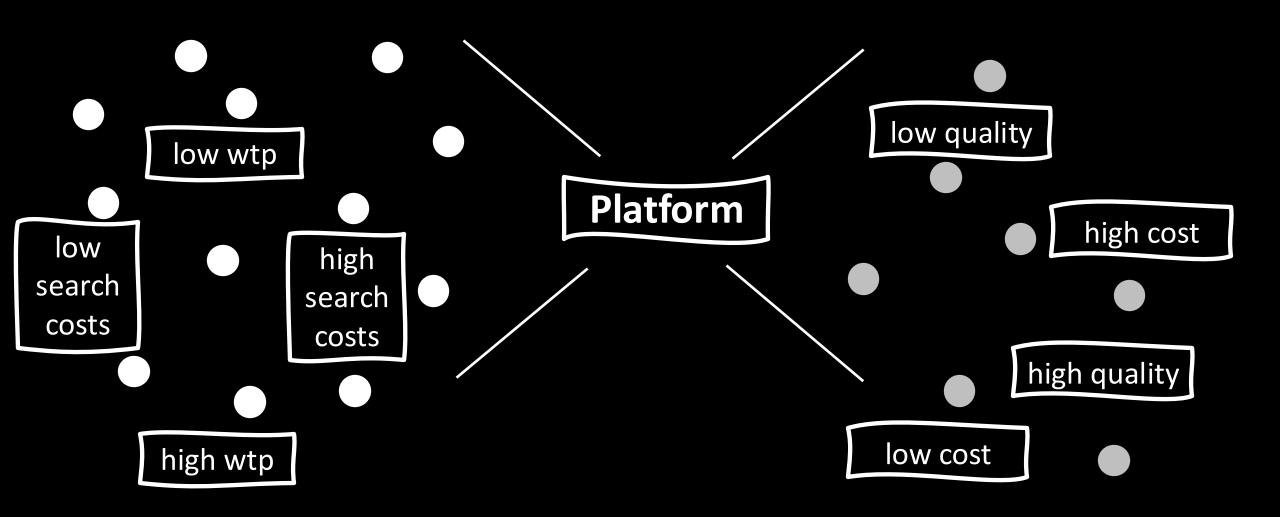
Chiara Farronato (Harvard, CEPR, NBER)

NBER Digital Economics and Al Tutorial Stanford, February 12, 2025





Digital Platforms as Information Aggregators



Digital Platforms as Information Aggregators

Information as a double-edged sword:

- Can be valuable to reduce market inefficiencies.
- → PART 1: Consumer protection with the help of digital platforms.
- But can also be a source of market power.
- → PART 2: Antitrust regulation of digital platforms.



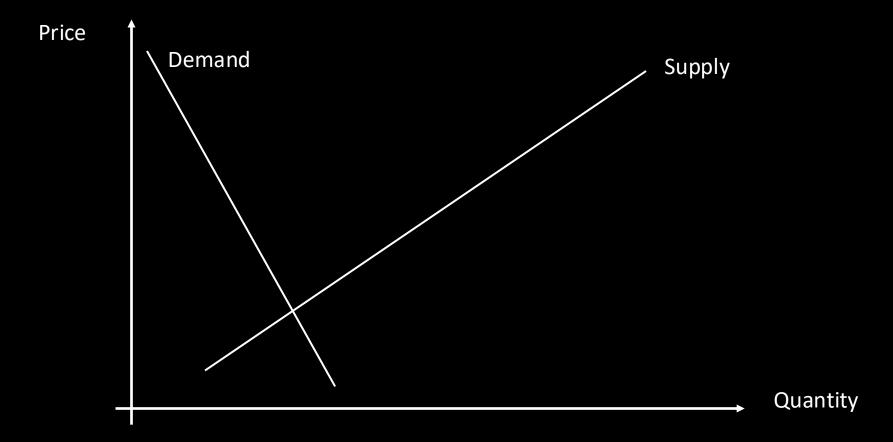
Regulating Consumer Protection With the Help of Digital Platforms.

• Most digital platforms enter existing markets, which are already subject to regulation...

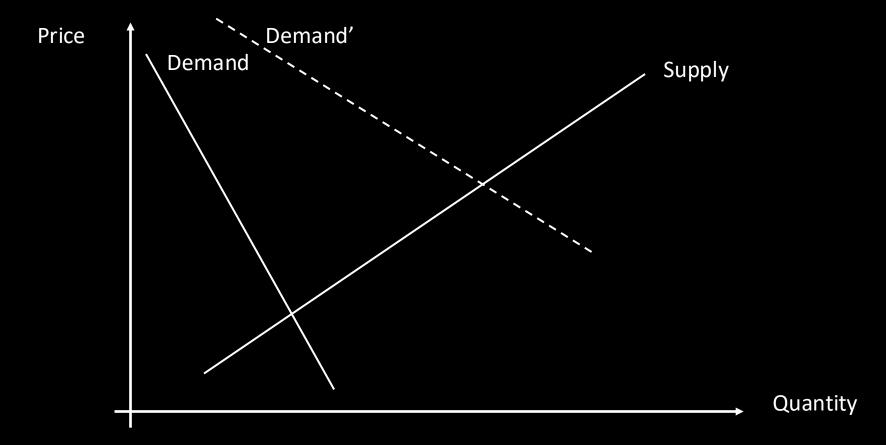
- Occupational Licensing.
- Certifications.
- Health and Safety Inspections.



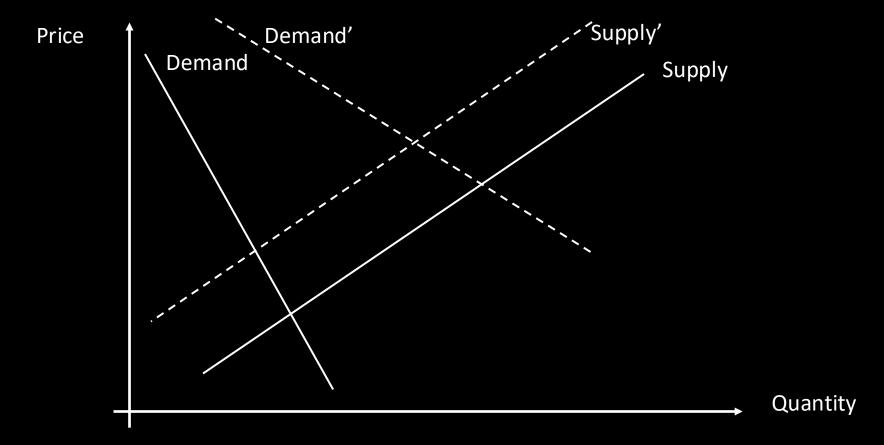
• Most digital platforms enter existing markets, which are already subject to regulation... designed to address asymmetric information.



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- Given it already exists, we could simply extend existing regulation to "online providers." E.g.:
 - Extend safety/accessibility regulation for hotels to Airbnb hosts.
 - Extend taxi medallion requirements for taxis to Uber/Lyft drivers.

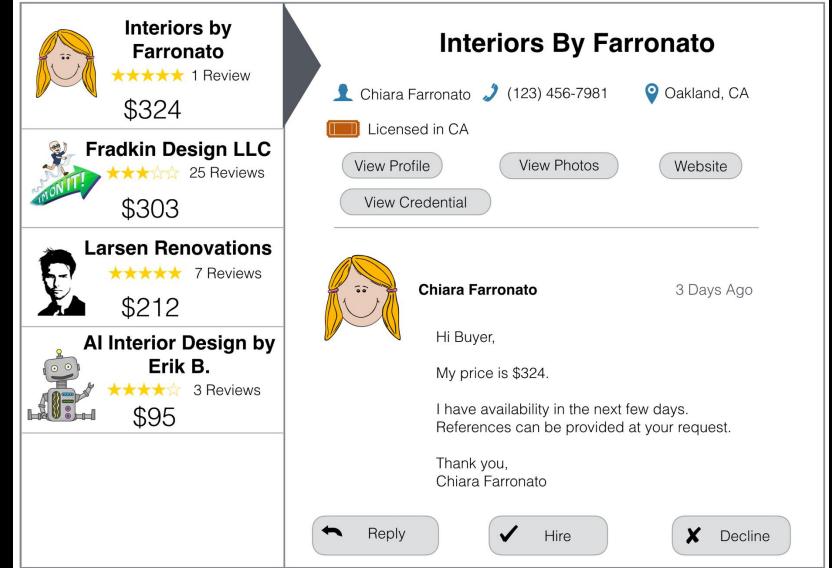
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 - Extend safety/accessibility regulation for hotels to Airbnb hosts.
 - Extend taxi medallion requirements for taxis to Uber/Lyft drivers.
- 1. Is existing regulation justified in the first place?
- 2. Does fundamentally different supply warrant different regulation?
- 3. What other options are available to address asymmetric information?

1.Is Existing Regulation Justified in the First Place?

- Online platforms are becoming the primary way of finding professionals in many industries:
 - Platforms track transactions and reviews.
 - Platforms provide a new way to measure the effects of existing regulation.

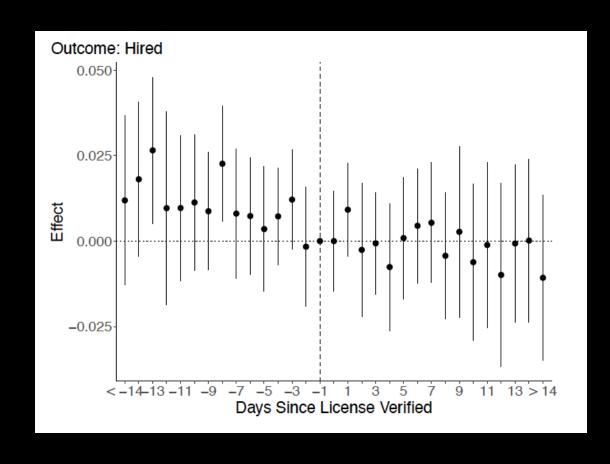
Consumer Protection in an Online World: An Analysis of Occupational Licensing (`24, joint work with Fradkin, Larsen, and Brynjolfsson)

Platform for Home Improvement Services

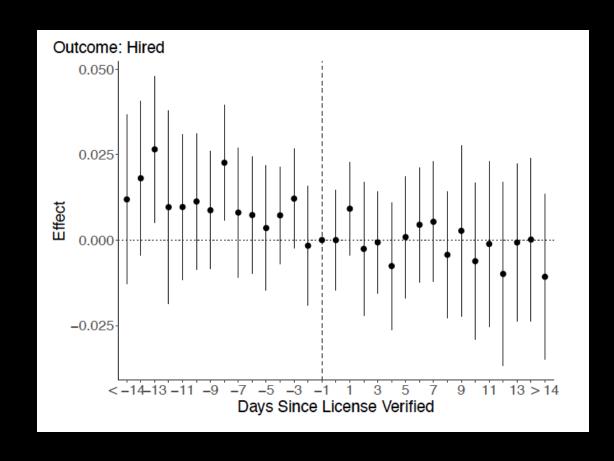


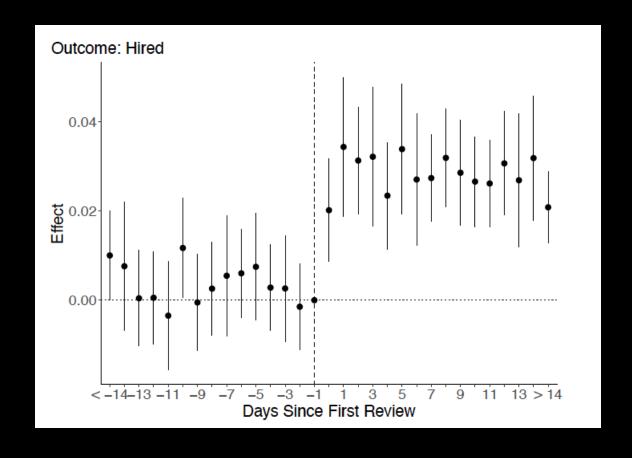
Signaling Value of Licenses v. Reviews

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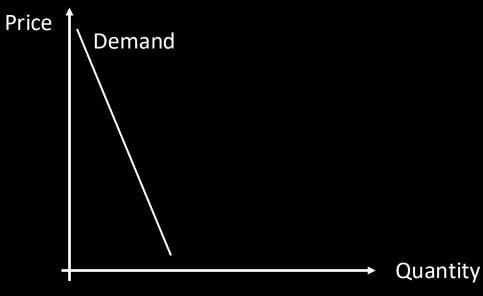
Signaling Value of Licenses v. Reviews



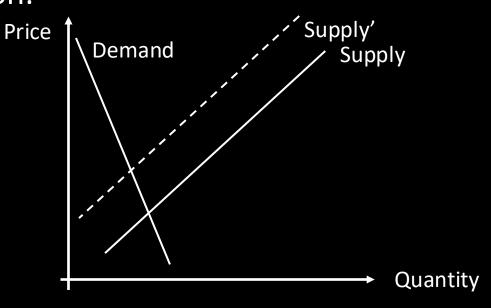


• Exploit variation in licensing laws across US states and home improvement occupations.

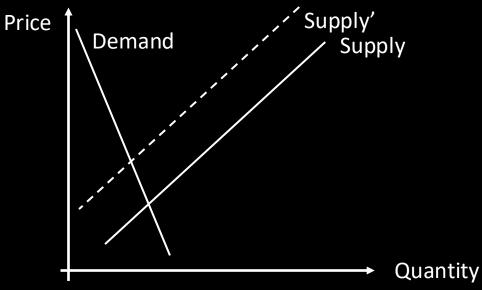
- Exploit variation in licensing laws across US states and home improvement occupations.
- Effect of more stringent licensing regulation on:
 - Demand:
 - No change in aggregate demand
 - No change in customer satisfaction



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- Effect of more stringent licensing regulation on:
 - Demand:
 - No change in aggregate demand
 - No change in customer satisfaction
 - Supply:
 - Reduction in number of options
 - Increase in price
- Open Q:
 - How can we better measure quality we should care about?
 - Which requirements (school, on job training) have largest net benefits?

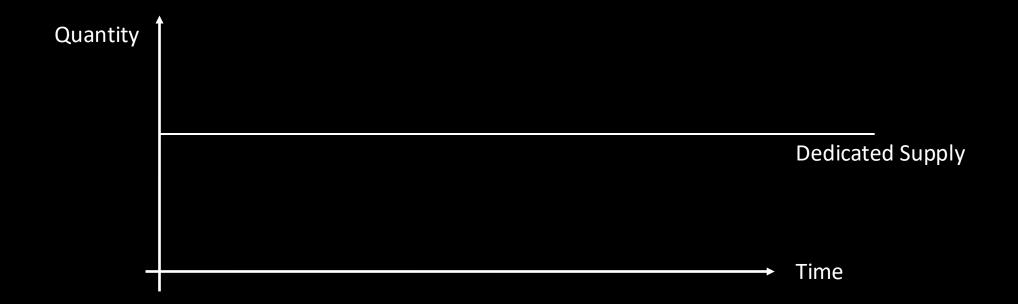


2.Does Fundamentally Different Supply Warrant Different Regulation?

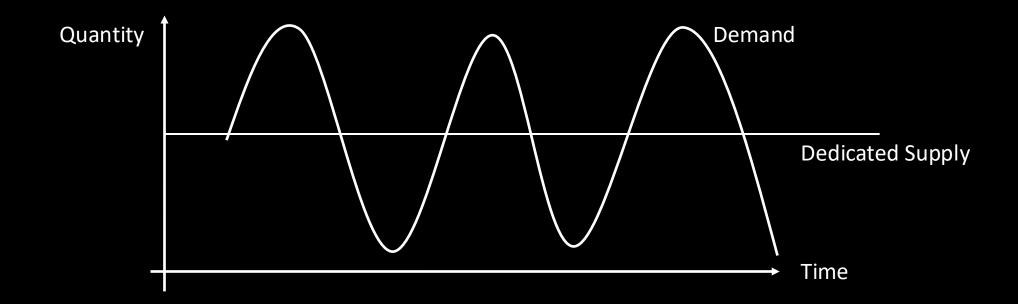
- Existing regulation is designed for "professional providers."
- This tends to generate "dedicated supply:"
 - Hotels whose rooms are available ~365 days a year;
 - Taxis who are available in ~8-hour shifts.

The Welfare Effects of Peer Entry: The Case of Airbnb and the Accommodation Industry (`22, joint with Fradkin)

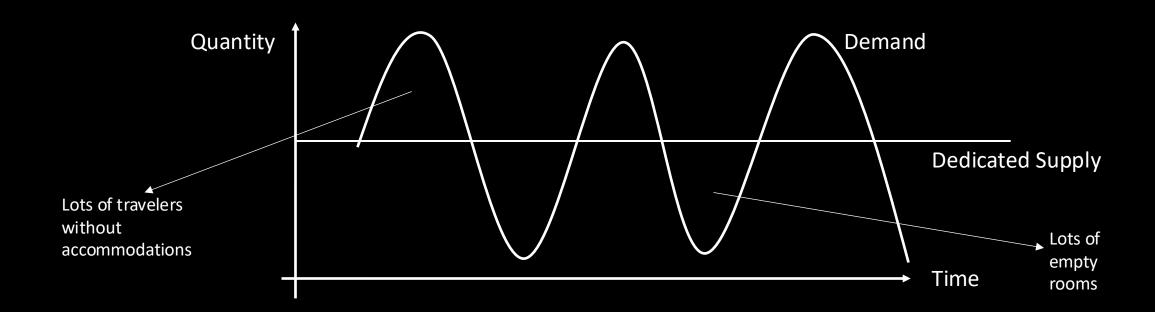
The Accommodations Market Before Airbnb



The Accommodations Market Before Airbnb



The Accommodations Market Before Airbnb



Airbnb Facilitates Entry of "Flexible Supply"

 Flexible supply is responsive to demand fluctuations, by entering when demand is high and contracting when demand is low.

• Large welfare benefits for consumers, by expanding choice set and reducing prices in periods when demand is highest and dedicated capacity is sold out.

Open Q: How to Adapt Regulation to a Mix of Flexible & Dedicated Supply?

 How should we design a two-part regulatory system while maintaining fair competition?

- How do we distinguish between "flexible" and "dedicated" supply?
 - In some cities, home-sharing hosts are subject to fewer restrictions than hotels but cannot rent to travelers for more than a few nights a year.
 - In others, ridesharing drivers are subject to fewer restrictions than taxi drivers, but also cannot perform the same pick-up/drop-offs as taxis (e.g., airports).

3. Other Options to Address Asymmetric Information?

- Existing regulation often relies on *experts' evaluations* of providers' quality.
- Can digital traces/online reputation substitute experts (Shapiro, 1986)?

Consumer Reviews and Regulation: Evidence from NYC Restaurants (WP, joint with Zervas)





halfway finishing my pho , FOUND COCKROACH inside the pho broth and had big fight with server(seems like one of the owner) after he insist on me paying for the pho.. not even apologying , told me I still have to pay for other pho which I can almost guess that it was made from same dirty pot..

WILL DEFINITELY CALL HEALTH DEPT. and most DEFINITELY they wont see me again!

freakin, disgusting S#\$&!









- On one hand:
 - Online reviews contain informative signals of restaurant hygiene.
 - These signals are effective at driving demand away from dirty restaurants.

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 - Online reviews can be informative about some hygiene dimensions (pests and food handling practices) but not others (worker hygiene).

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• On the other hand:

 Online reviews can be informative about some hygiene dimensions (pests and food handling practices) but not others (worker hygiene).

• Open Q:

• How can we leverage useful quality information to improve regulatory monitoring (i.e., achieve same quality with less expert effort or increasing quality with same expert effort)?



Antitrust Regulation Of Digital Platforms.

What Makes Digital Platforms Different?

Confluence of:

- Marginal and distribution costs ~ 0.
- Strong economies of scale and scope.
- Increasing marginal returns to data.
- Strong network effects.

What Makes Digital Platforms Different?

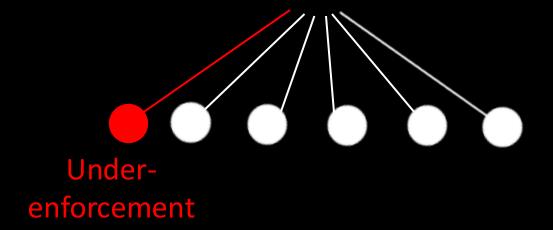
Confluence of:

- Marginal and distribution costs ~ 0.
- Strong economies of scale and scope.
- Increasing marginal returns to data.
- Strong network effects.
 - Outside of the Big 5, unlikely to be strong enough to justify concentration of activity on a single platform ("Dog Eat Dog: Balancing Network Effects and Differentiation in a Digital Platform Merger," '24, with Fong and Fradkin).

Antitrust Regulation of Digital Platforms until Recently



Antitrust Regulation of Digital Platforms going Forward



Incredibly Exciting Time to Study Platform Antitrust, but How?

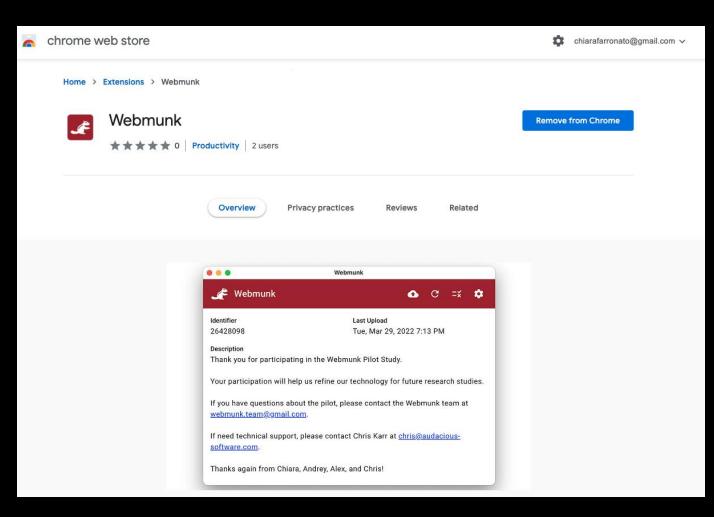
- We need more work quantifying the trade-offs of various policy recommendations.
- Platforms are information aggregators, so they have plenty of data to look at.
- Heightened scrutiny of digital platforms' practices:
 - Digital Markets Act in EU;
 - DOJ and FTC lawsuits in the US.
- Try knocking on Amazon's door: "I'd like to use your data to study whether you give priority to your products..."

Webmunk: A New Tool for Studying Online Behavior and Digital Platforms ('24, with Fradkin and Karr)

A browser extension that can:

- Manipulate your browsing experience;
- Track your browsing behavior;
- Prompt you to complete additional tasks.

webmunk.org



Application of Webmunk: <u>Self-Preferencing at Amazon: Evidence</u> from Search Rankings ('23, with Fradkin and MacKay) + ongoing work (same authors)

Recruited participants through Facebook:

- Ask them to install Webmunk and keep it installed for a few weeks.
- ~1,200 Amazon users tracked for ~8 weeks.
- Collect a combination of:
 - Incentive-compatible browsing,
 - Organic browsing.

Research Questions:

- What is the (short-run) effect of Amazon offering own brands that compete with third-party products on consumer choices and satisfaction?
- Are outcomes influenced by self-preferencing practices?

RESULTS



Energizer AAA Batteries, Triple A Long-Lasting Alkaline Power Batteries, 32 Count (Pack of 1) 32 Count (Pack of 1)

\$2298 (\$0.72/Count) \$21.83 with Subscribe & Save discount /prime Same-Day FREE delivery Today 2 PM - 6 PM on \$25

of qualifying items

**** ~ 9,566



Amazon Basics 36 Pack AAA High-Performance Alkaline Batteries, 10-Year Shelf Life, Easy to Open Value... 36 Count (Pack of 1) **** ~ 661,764

\$13⁷⁰ (\$0.38/Count) \$13.02 with Subscribe & Save discount prime Same-Day FREE delivery Today 2 PM - 6 PM on \$25 of qualifying items



Duracell Coppertop AA Batteries with Power Boost Ingredients, 20 Count Pack Double A Battery with Long-... 20 Count (Pack of 1) **** ~ 45,560

\$19⁸⁶ (\$0.99/Count) \$20.99 \$18.87 with Subscribe & Save discount ime Same-Day FREE delivery Today 2 PM - 6 PM on \$25

of qualifying items



Amazon Basics 24 Count AA & AAA High-Performance Batteries Value Pack - 12 Double AA Batteries and 1 1 Count (Pack of 1) **** ~ 2,640

\$14⁸⁴ (\$14.84/Count) \$14.10 with Subscribe & Save discount prime One-Day FREE delivery Tomorrow, Apr 18 Or FREE delivery Overnight 7 AM - 11 AM on \$25 of qualifying items



Duracell Coppertop AAA Batteries with Power Boost Ingredients, 20 Count Pack Triple A Battery with... 20 Count (Pack of 1) **** ~ 59,771

\$1799 (\$0.90/Count) rime Same-Day

\$17.09 with Subscribe & Save discount FREE delivery Today 2 PM = 6 PM on \$25 of qualifying items

FREE delivery Today 2 PM - 6 PM on \$25 of qualifying items



Amazon Basics 9 Volt Performance

Shelf Life, Easy to Open, Packaging.

8 Count (Pack of 1)

*** · 146.964

Energizer AA Batteries and AAA Batteries, 24 Max Double A Batter and 24 Max Triple A Batteries Com 48 Count (Pack of 1) **** ~ 54.646

Duracell Coppertop AA Batteries 28

Count Pack Double A Battery with

\$22.03 with Subscribe & Save discount

FREE delivery Today 2 PM - 6 PM on \$25

Power Boost Ingredients, Long-...

\$23¹⁹ (\$1.16/Count) \$25.99

ime Same-Day

20 Count (Pack of 1)

**** ~ 613

of qualifying items

\$32⁷⁵ (\$0.68/Count) \$39.98 \$31.11 with Subscribe & Save discor orime Same-Day FREE delivery Today 2 PM - 6 PM \$31.42 (13 new offers)

AA-32 Energize.

Energizer AA Batteries, Double A Long-Lasting Alkaline Power Batteries, 32 Count (Pack of 1) 32 Count (Pack of 1) **** ~ 18,424

\$12⁹⁹ (\$1.62/Count) \$12.34 with Subscribe & Save discount prime One-Day /prime Same-Day FREE delivery Tomorrow, Apr 18 of qualifying items Bundles available



Amazon Basics 48 Pack AA High-

48 Count (Pack of 1)

√prime Same-Day

**** ~ 693,388

\$15⁶⁷ (\$0.33/Count) \$16:49

Performance Alkaline Batteries, 10-

Year Shelf Life, Easy to Open Value...

\$14.89 with Subscribe & Save discount

All-Purpose Alkaline Batteries, 5-Year \$23⁰⁶ (\$0.72/Count) \$21.91 with Subscribe & Save discount FREE delivery Today 2 PM - 6 PM on \$25



Energizer AAA Batteries, Triple A

Batteries, 32 Count (Pack of 1)

FREE delivery Today 2 PM - 6 PM on \$25

Long-Lasting Alkaline Power

32 Count (Pack of 1)

**** ~ 9.566

\$22⁹⁸ (\$0.72/Count)

prime Same-Day

of qualifying items

RESULTS



20 Count (Pack of 1)

**** ~ 45.560



Power Boost Ingredients, 20 Count Pack Double A Battery with Long-... 20 Count (Pack of 1) **** ~ 613

\$19⁸⁶ (\$0.99/Count) \$20.99 \$2319 (\$1.16/Count) \$25.99 \$18.87 with Subscribe & Save discount \$22.03 with Subscribe & Save discou rime Same-Day rime Same-Day FREE delivery Today 2 PM - 6 PM on \$25 of qualifying items of qualifying items



Count Pack Double A Battery with Power Boost Ingredients, Long-...

\$17⁹⁹ (\$0.90/Count) orime Same-Day FREE delivery Today 2 PM - 6 PM on \$25 of qualifying items



Duracell Coppertop AAA Batteries with Power Boost Ingredients, 20 Count Pack Triple A Battery with... 20 Count (Pack of 1) **** ~ 59.771

\$17.09 with Subscribe & Save discour FREE delivery Today 2 PM - 6 PM on \$25



Energizer AA Batteries and AAA Batteries, 24 Max Double A Batteries and 24 Max Triple A Batteries Comb... 48 Count (Pack of 1) **** * 54.646

\$3275 (\$0.68/Count) \$39.98 \$31.11 with Subscribe & Save discount FREE delivery Today 2 PM - 6 PM \$31.42 (13 new offers)

HIGHLY RATED



Energizer AAA Batteries, Triple A Long-Lasting Alkaline Power Batteries, 32 Count (Pack of 1)

32 Count (Pack of 1) **** * 9.566

\$22⁹⁸ (\$0.72/Count) \$21.83 with Subscribe & Save discoun /orime Same-Day FREE delivery Today 2 PM - 6 PM on \$25 of qualifying items



Energizer AA Batteries, Double A Long-Lasting Alkaline Power Batteries, 32 Count (Pack of 1) 32 Count (Pack of 1) **** ~ 18.424

\$23⁰⁶ (\$0.72/Count) \$21.91 with Subscribe & Save discoun nrime Same-Day FREE delivery Today 2 PM - 6 PM on \$25 of qualifying items



Duracell Coppertop AA Batteries with Power Boost Ingredients, 20 Count Pack Double A Battery with Long-.. 20 Count (Pack of 1) **** 45.560

\$19⁸⁶ (\$0.99/Count) \$20.99 \$18.87 with Subscribe & Save discount orime Same-Day FREE delivery Today 2 PM - 6 PM on \$25 of qualifying items



Lasting Alkaline Power Batteries 12 Count(Pack of 1) ***** *3.118 \$22⁹⁹ (\$1.92/Count) \$21.84 with Subscribe & Save discount

✓prime Two-Day FREE delivery Wed, Apr 19



Duracell Coppertop AAA Batteries with Power Boost Ingredients, 20 Count Pack Triple A Battery with... 20 Count (Pack of 1) **** × 59.771

\$17⁹⁹ (\$0.90/Count) \$17.09 with Subscribe & Save discount /orime Same-Day FREE delivery Today 2 PM - 6 PM on \$25 of qualifying items

RESULTS AAA-32 Energize

Energizer AAA Batteries, Triple A Long-Lasting Alkaline Power Batteries, 32 Count (Pack of 1) 32 Count (Pack of 1) **** - 9,566

\$2298 (\$0.72/Count) \$21.83 with Subscribe & Save discount FREE delivery Today 2 PM = 6 PM on \$25 of qualifying items

Bundles available

Bundles available



Amazon Basics 36 Pack AAA High-Amazon Basics 24 Count AA & AAA Performance Alkaline Batteries, 10-High-Performance Batteries Value Year Shelf Life, Easy to Open Value... Pack - 12 Double AA Batteries and 1 1 Count (Pack of 1)

36 Count (Pack of 1) **** ~ 661,764

\$13⁷⁰ (\$0.38/Count) \$14⁸⁴ (\$14.84/Count) \$13.02 with Subscribe & Save discount \$14.10 with Subscribe & Save discount /prime Same-Day rime One-Day FREE delivery Today 2 PM - 6 PM on \$25 REE delivery Tomorrow, Apr 18 of qualifying items Or FREE delivery Overnight 7 AM - 11 AM on \$25 of qualifying items Amazon brand



Duracell Coppertop AA Batteries wit

Power Boost Ingredients, 20 Count

Pack Double A Battery with Long-.

\$18.87 with Subscribe & Save discount

FREE delivery Today 2 PM - 6 PM on \$25

20 Count (Pack of 1)

**** ~ 45,560

**** ~ 2.640

\$19⁸⁶ (\$0.99/Count) \$20.99

Duracell Coppertop AA Batteries 28 Count Pack Double A Battery with Power Boost Ingredients, Long-... 20 Count (Pack of 1) **** × 613

\$23¹⁹ (\$1.16/Count) \$25.99 prime Same-Day of qualifying items

\$22.03 with Subscribe & Save discount FREE delivery Today 2 PM - 6 PM on \$25

FREE delivery Today 2 PM - 6 PM on \$25



ergizer AA Batteries and AAA atteries, 24 Max Double A Batteri nd 24 Max Triple A Batteries Com 8 Count (Pack of 1) 8 Count (Pack of 1)

*** - 54,646

32⁷⁵ (\$0.68/Count) \$39.98 \$1.11 with Subscribe & Save discour me Same-Day REE delivery Today 2 PM - 6 PM 31.42 (13 new offers)



DURACELL

Duracell Coppertop AAA Batteries

with Power Boost Ingredients, 20

\$17.09 with Subscribe & Save discount

Count Pack Triple A Battery with...

20 Count (Pack of 1)

**** ~ 59,771

\$1799 (\$0.90/Count)

rime Same-Day

nazon Basics 48 Pack AA High-

Performance Alkaline Batteries, 10-

Year Shelf Life, Easy to Open Value..

48 Count (Pack of 1)

**** - 693,388

me Same-Day

\$15⁶⁷ (\$0.33/Count) \$16.49

\$14.89 with Subscribe & Save discount

FREE delivery Today 2 PM - 6 PM on \$25 qualifying items

> **AA-32** Energize.

ergizer AA Batteries, Double A

Long-Lasting Alkaline Power

32 Count (Pack of 1)

**** ~ 18,424

Batteries, 32 Count (Pack of 1)

Amazon Basics 9 Volt Performance All-Purpose Alkaline Batteries, 5-Year Shelf Life, Easy to Open, Packaging... **** ~ 146.964 \$12⁹⁹ (\$1.62/Count)

\$23⁰⁶ (\$0.72/Count) \$12.34 with Subscribe & Save discount \$21.91 with Subscribe & Save discount Inrime One-Day rime Same-Day FREE delivery Tomorrow, Apr 18 REE delivery Today 2 PM - 6 PM on \$25 of qualifying items ndles available



Count Pack Double A Battery with Power Boost Ingredients, 20 Count Power Boost Ingredients, Long-... 20 Count (Pack of 1)

**** ~ 613

\$23¹⁹ (\$1.16/Count) \$25.99

rime Same-Day

of qualifying items

03 with Subscribe & Save discou

FREE delivery Today 2 PM - 6 PM on \$25

Pack Double A Battery with Long-... 20 Count (Pack of 1) **** ~ 45.560 \$1986 (\$0.99/Count) \$20.99

\$18.87 with Subscribe & Save discour rime Same-Day FREE delivery Today 2 PM - 6 PM on \$25 of qualifying items





with Power Boost Ingredients, 20 Count Pack Triple A Battery with. 20 Count (Pack of 1) **** ~ 59.771 \$17⁹⁹ (\$0.90/Count) \$17.09 with Subscribe & Save disco

rime Same-Day FREE delivery Today 2 PM - 6 PM on \$25



Energizer AA Batteries and AAA Batteries, 24 Max Double A Batteries and 24 Max Triple A Batteries Comb... 48 Count (Pack of 1)

**** * 54.646 \$32⁷⁵ (\$0.68/Count) \$39.98 \$31.11 with Subscribe & Save discount FREE delivery Today 2 PM - 6 PM \$31.42 (13 new offers)

HIGHLY RATED

RESULTS



Energizer AAA Batteries, Triple A

Batteries, 32 Count (Pack of 1)

FREE delivery Today 2 PM - 6 PM on \$25

Long-Lasting Alkaline Power

32 Count (Pack of 1)

**** ~ 9.566

\$2298 (\$0.72/Count)

prime Same-Day

of qualifying item

Energizer AAA Batteries, Triple A Long-Lasting Alkaline Power Batteries, 32 Count (Pack of 1) 32 Count (Pack of 1) **** ~ 9.566

\$2298 (\$0.72/Count) \$21.83 with Subscribe & Save discour /orime Same-Day FREE delivery Today 2 PM - 6 PM on \$25 of qualifying items



orimo Same-Day

of qualifying items

Energizer AA Batteries, Double A Duracell Coppertop AA Batteries with Long-Lasting Alkaline Power Power Boost Ingredients, 20 Count Batteries, 32 Count (Pack of 1) Pack Double A Battery with Long-32 Count (Pack of 1) 20 Count (Pack of 1) **** ~ 18.424 **** 45.560 \$23⁰⁶ (\$0.72/Count)

\$19⁸⁶ (\$0.99/Count) \$28.99 \$21.91 with Subscribe & Save discour \$18.87 with Subscribe & Save discoun orime Same-Day REE delivery Today 2 PM - 6 PM on \$25 FREE delivery Today 2 PM - 6 PM on \$25 of qualifying items



Energizer D Batteries, D Cell Long-Lasting Alkaline Power Batteries 12 Count(Pack of 1) ***** *3.118 \$22⁹⁹ (\$1.92/Count)

\$21.84 with Subscribe & Save discount prime Two-Day FREE delivery Wed, Apr 15 /orime Same-Day



Duracell Coppertop AAA Batteries with Power Boost Ingredients, 20 Count Pack Triple A Battery with... 20 Count (Pack of 1) **** × 59.771

\$17⁹⁹ (\$0.90/Count) \$17.09 with Subscribe & Save discount FREE delivery Today 2 PM - 6 PM on \$25 of qualifying items



RESULTS

Energizer AAA Batteries, Triple A Long-Lasting Alkaline Power Batteries, 32 Count (Pack of 1) 32 Count (Pack of 1) **** ~ 9,566

\$22⁹⁸ (\$0.72/Count) \$21.83 with Subscribe & Save discour √prime Same-Day FREE delivery Today 2 PM - 6 PM on \$25 of qualifying items Bundles available

HIGHLY RATED



Duracell Coppertop AA Batteries 28 Count Pack Double A Battery with Power Boost Ingredients, Long-... 20 Count (Pack of 1) **** × 613

\$15⁶⁷ (\$0.33/Count) \$16,49 \$14.89 with Subscribe & Save discr \$22.03 with Subscribe & Save discoun /prime Same-Day orime Same-Day FREE delivery Today 2 PM - 6 PM on \$25 of qualifying items

48 Count (Pack of 1)

**** ~ 693,386



Amazon Basics 48 Pack AA High-Amazon Basics 36 Pack AAA High-Performance Alkaline Batteries, 10-Performance Alkaline Batteries, 10-Year Shelf Life, Easy to Open Value... Year Shelf Life, Easy to Open Value... 36 Count (Pack of 1) ***** ~ 661.76

\$13⁷⁰ (\$0.38/Count) prime Same-Day of qualifying items

Amazon Basics 24 Count AA & AAA High-Performance Batteries Value Pack - 12 Double AA Batteries and 1 1 Count (Pack of 1)

\$1484 (\$14.84/Count) \$14.10 with Subscribe & Save discoun rime One-Day

FREE delivery Tomorrow, Apr 18 Or FREE delivery Overnight 7 AM - 11 AM on \$25 of qualifying items





Energizer AAA Batteries, Triple A

Batteries, 32 Count (Pack of 1)

\$21.83 with Subscribe & Save discour prime Same-Day

FREE delivery Today 2 PM - 6 PM on \$25

Long-Lasting Alkaline Powe

32 Count (Pack of 1)

**** 9,566

of qualifying items

\$22⁹⁸ (\$0.72/Count)

Energizer AA Batteries, Double A Long-Lasting Alkaline Power Batteries, 32 Count (Pack of 1) 32 Count (Pack of 1) ***** ~ 18,424 \$23⁰⁶ (\$0.72/Count)

of qualifying items

FREE delivery Today 2 PM - 6 PM on \$25

Pack Double A Battery with Long-.. 20 Count (Pack of 1) **** ~ 45,560 \$1986 (\$0.99/Count) \$20.99 \$18.87 with Subscribe & Save discount

of qualifying items

Duracell Coppertop AA Batteries with

Power Boost Ingredients, 20 Count

FREE delivery Today 2 PM - 6 PM on \$25



Energizer D Batteries, D Cell Long-Lasting Alkaline Power Batteries 12 Count(Pack of 1)

***** 3.118 \$22⁹⁹ (\$1.92/Cou \$21.84 with Subscribe & Save discount FREE delivery Wed, Apr 15

Duracell Coppertop AAA Batteries with Power Boost Ingredients, 20 Count Pack Triple A Battery with... 20 Count (Pack of 1) ★★★★★~59,771

DURACELL

\$1799 (\$0.90/Count) \$17.09 with Subscribe & Save discount FREE delivery Today 2 PM - 6 PM on \$25 of qualifying items

How Does Amazon Rank Products?

- Strongest predictors of higher position:

 - Number of ratings
 - Best Seller badge

 Best Seller
 - Sponsored

How Does Amazon Rank Products?

- Strongest predictors of higher position:

 - Number of ratings
 - Best Seller badge

 Best Seller
 - Sponsored
 - ... and Amazon Brand



Effect of Amazon Brands on Consumer Choice

	Amazon Brand	Price	Reviews	Stars	Major Brand	Prime Eligible	Sponsored
	(1)	(2)	(3)	(4)	(5)	(6)	(7)
Hide Amazon	-0.076***	-0.758	-9,049.732***	0.030	0.044***	-0.006	-0.028
	(0.007)	(0.402)	(1,669.677)	(0.015)	(0.013)	(0.021)	(0.018)
R ²	0.085	0.109	0.111	0.077	0.296	0.116	0.032
Observations	5,200	5,120	5,135	5,193	4,789	4,734	3,482
Mean of Y	0.092	21.083	27930.659	4.538	0.36	0.603	0.416
Category fixed effects	Yes	Yes	Yes	Yes	Yes	Yes	Yes

Treatment is effective at removing Amazon brands from consumer choices...

Effect of Amazon Brands on Consumer Choice

	Amazon Brand (1)	Price (2)	Reviews (3)	Stars (4)	Major Brand (5)	Prime Eligible (6)	Sponsored (7)
Hide Amazon	-0.076*** (0.007)	-0.758 (0.402)	-9,049.732*** (1,669.677)	0.030 (0.015)	0.044*** (0.013)	-0.006 (0.021)	-0.028 (0.018)
R ² Observations Mean of Y	0.085 5,200 0.092	0.109 5,120 21.083	0.111 5,135 27930.659	0.077 5,193 4.538	0.296 4,789 0.36	0.116 4,734 0.603	0.032 3,482 0.416
Category fixed effects	Yes	Yes	Yes	Yes	Yes	Yes	Yes

Treatment is effective at removing Amazon brands from consumer choices...

But substitute products are fairly comparable, except for reviews and major brands.

Effect of Amazon Brands on Consumer Choice

	Amazon Brand	Price	Reviews	Stars	Major Brand	Prime Eligible	Sponsored
	(1)	(2)	(3)	(4)	(5)	(6)	(7)
Hide Amazon	-0.076***	-0.758	-9,049.732***	0.030	0.044***	-0.006	-0.028
	(0.007)	(0.402)	(1,669.677)	(0.015)	(0.013)	(0.021)	(0.018)
R ²	0.085	0.109	0.111	0.077	0.296	0.116	0.032
Observations	5,200	5,120	5,135	5,193	4,789	4,734	3,482
Mean of Y	0.092	21.083	27930.659	4.538	0.36	0.603	0.416
Category fixed effects	Yes	Yes	Yes	Yes	Yes	Yes	Yes

Treatment is effective at removing Amazon brands from consumer choices...

But substitute products are fairly comparable, except for reviews and major brands.

No change in: search effort, propensity to use Amazon again, customer satisfaction.

These Choices Allow Testing for Self-Preferencing

Based on Becker 1957 (+ Aguiar et al. `21 and Reimers & Waldfogel `23):

"A platform is biased in favor of a product if the product attains **smaller success** conditional on **ex-ante assessment.**"

- **Ex-ante assessment:** assigned product rank
- Success: demand

 $product\ selected_{isj} = \alpha\ amazon_{isj} + \mu_{isj} + \gamma X_{isj} + \epsilon_{isj}$

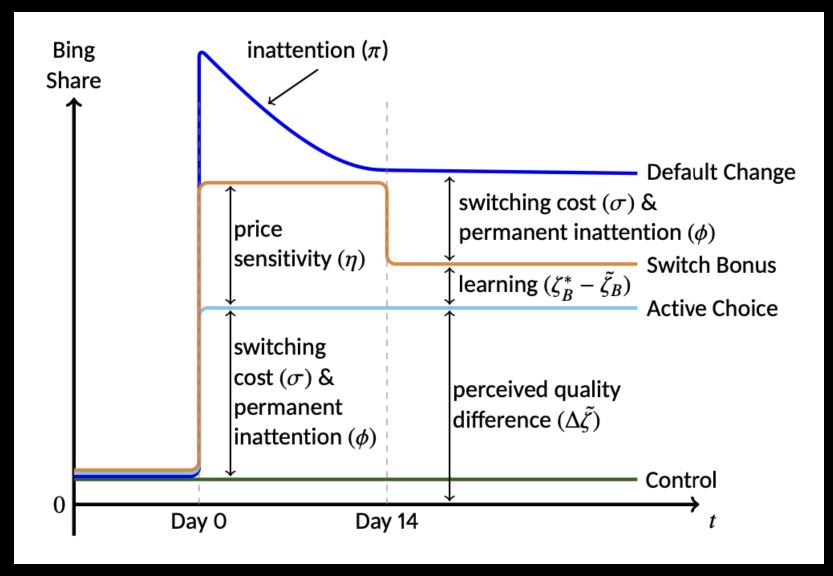
No Evidence of Self-Preferencing in Search

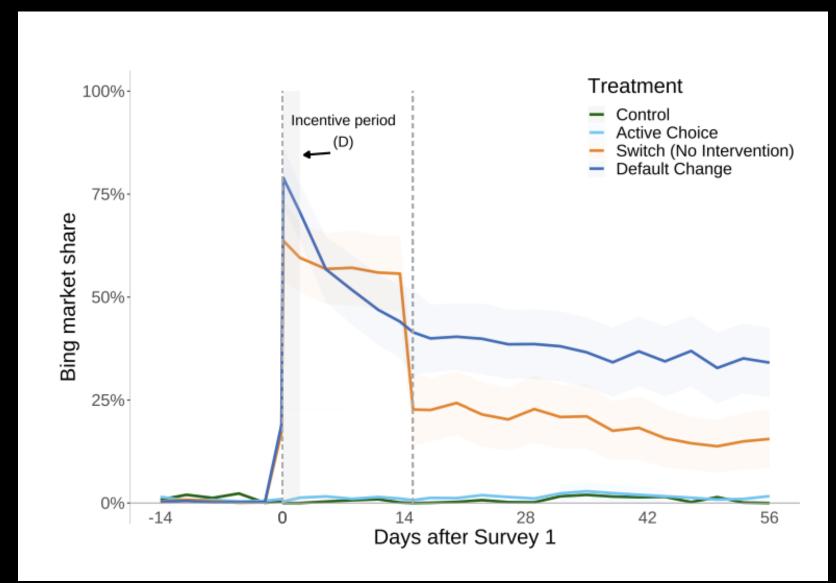
	(1)	(2)	(3)	(4)
Amazon Brand	0.013***	0.008**	0.013***	0.007*
	(0.003)	(0.003)	(0.003)	(0.003)
Log(Reviews + 1)		0.003***		0.003***
		(0.000)		(0.000)
Price			0.000**	0.000**
			(0.000)	(0.000)
Prime Eligible				0.012***
-				(0.001)
Major Brand				0.003^{*}
•				(0.001)
Star Rating				0.012***
C				(0.001)
Fast Delivery				-0.002
•				(0.002)
Free Delivery				0.005**
Ž				(0.002)
R^2	0.034	0.036	0.034	0.037
Observations	278,736	278,736	278,736	278,702
	, -	,	, •	· · · · · · · · ·
Page-User fixed effects	Yes	Yes	Yes	Yes
Realized Rank fixed effects	Yes	Yes	Yes	Yes

In the context of online search:

- True quality differences (perhaps driven by economies of scale)?
- Quality misperceptions (experience goods)?
- Default effects (switching costs and inattention), which may reinforce quality misperceptions?

<u>Sources of Market Power in Web Search: Evidence from a Field Experiment (Alcott, Castillo, Gentzkow, Musolff, Salz)</u>





			Direct effects (fixed quality)		Equilibrium effects (endogenous quality)	
Description	Switching cost & inattention?	Misper- ceptions?	Google share (%)	CS gain (\$/year)	Google share (%)	CS gain (\$/year)
Status Quo	✓	✓	88.9	0.00	88.9	0.00
No Frictions + Data Sharing			73.8	6.01	72.9 71.9	6.04 6.31
Chrome Choice Screen		✓	87.6	0.09	87.5	0.09
No Misperceptions	✓		78.4	0.46	77.9	0.47
+ Data Sharing					77.1	0.72
Bing Default	√	✓	48.9	-70.92	47.7	-70.61
+ Delayed Chrome Choice Scr.	/	✓	72.1	0.04	71.4	0.08

Information Collection and Privacy: <u>Data Sharing and Website</u> <u>Competition: The Role of Dark Patterns (WP, with Fradkin and Lin)</u>

Select your cookie preferences

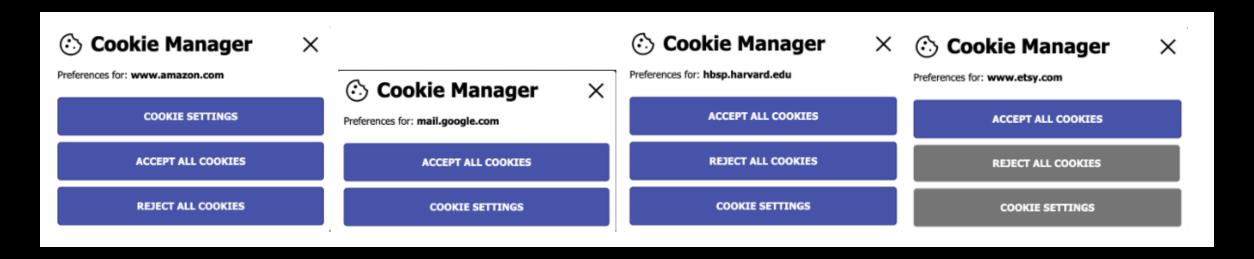
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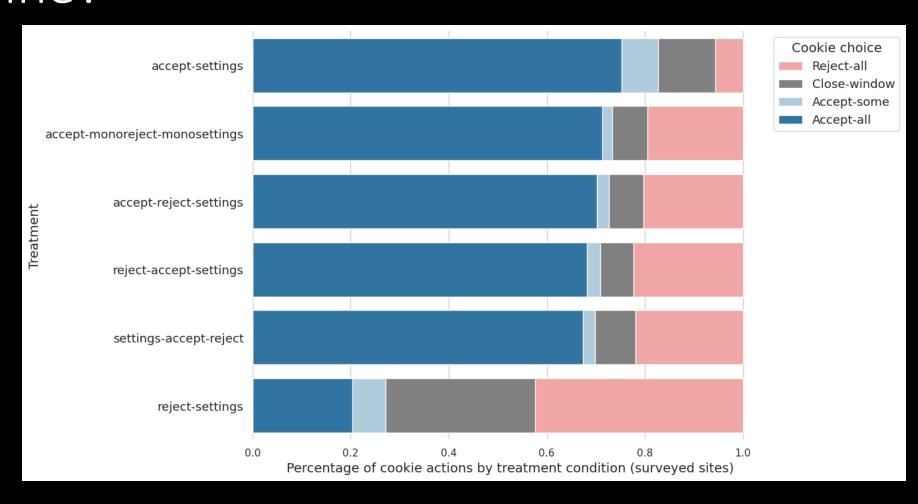
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How Do Consumers Make Privacy Choices Online?



How Do Consumers Make Privacy Choices Online?



Concluding Thoughts

- Incredibly exciting time to study regulation of digital platforms.
- Increasingly difficult to get companies to collaborate on some of these topics.
- Must be creative in data collection methods:
 - Freedom of Information Act (FOIA) requests, Article 40 of DSA;
 - Enroll study participants and track their digital behavior (but make it as realistic as possible);
 - Combine actual and hypothetical (surveys) choices;
 - Scraping (when allowed by journals and websites);
 - Access data from third parties/intermediaries (e.g., AirDNA).
- Look out for policy changes (e.g., GDPR in 2018, DMA in 2022, more to come in the US) → and don't just focus on the unintended consequences ☺

Thank you.

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[And thanks to my co-authors in these papers & ongoing work: Andrey Fradkin, Erik Brynjolfsson, Jessica Fong, Chris Karr, Bradley Larsen, Tesary Lin, Alexander MacKay, Giorgos Zervas]