

# Government Advertising in Market-Based Public Programs: Evidence from the Health Insurance Marketplace<sup>1</sup>

Naoki Aizawa

University of Wisconsin-Madison and NBER

You Suk Kim

Federal Reserve Board

July 24, 2020

---

<sup>1</sup> The analysis and conclusions set forth are those of the authors and do not indicate concurrence by other members of the staff, by the Board of Governors, or by the Federal Reserve System.

# Motivation

- ▶ Government conducts marketing and outreach activities for public programs.
  - ▶ Rationale of gov marketing in *traditional* public programs (e.g., food stamp): transaction cost/lack of information.
  - ▶ In *market-based* programs (e.g., health insurance), firms participating in the programs also conduct marketing.
- ▶ What are appropriate policy interventions in the presence of *private marketing activities*?

The answer depends on how private marketing works:

- ▶ Is private marketing much more effective than government?
- ▶ Positive spillover vs business stealing?
- ▶ Lack of economy of scale? (e.g., fixed cost of marketing)
- ▶ Does government have different (e.g., redistributive) tastes?

# Overview of This Paper

- ▶ We study TV advertising in ACA marketplaces:
  - ▶ Characterize targeting of TV ads by different sponsors (federal, state, private).
  - ▶ Estimate effects of TV ads on consumer demand via border discontinuity design.
  - ▶ Estimate an equilibrium model to illustrate mechanisms how gov ads can address inefficiency in market-based programs.
- ▶ Preview of Findings:
  - ▶ Private ads are **not** more effective than federal ads in increasing the total program enrollment.
  - ▶ Private ads increase insurer's own enrollment but do **not** have positive spillover to rivals.
  - ▶ Federal gov ads **can** simultaneously increase enrollment and mitigate excessive private ads competition.

## Data and Descriptive Evidence

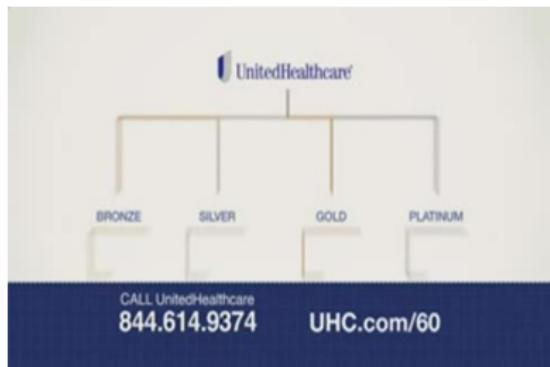
## Data

- ▶ TV ad data from Kantar Media (Campaign Media Analysis Group):
  - ▶ Occurrence-level advertising information including spending and actual TV ad video.
- ▶ Example: federal ads.



# Data

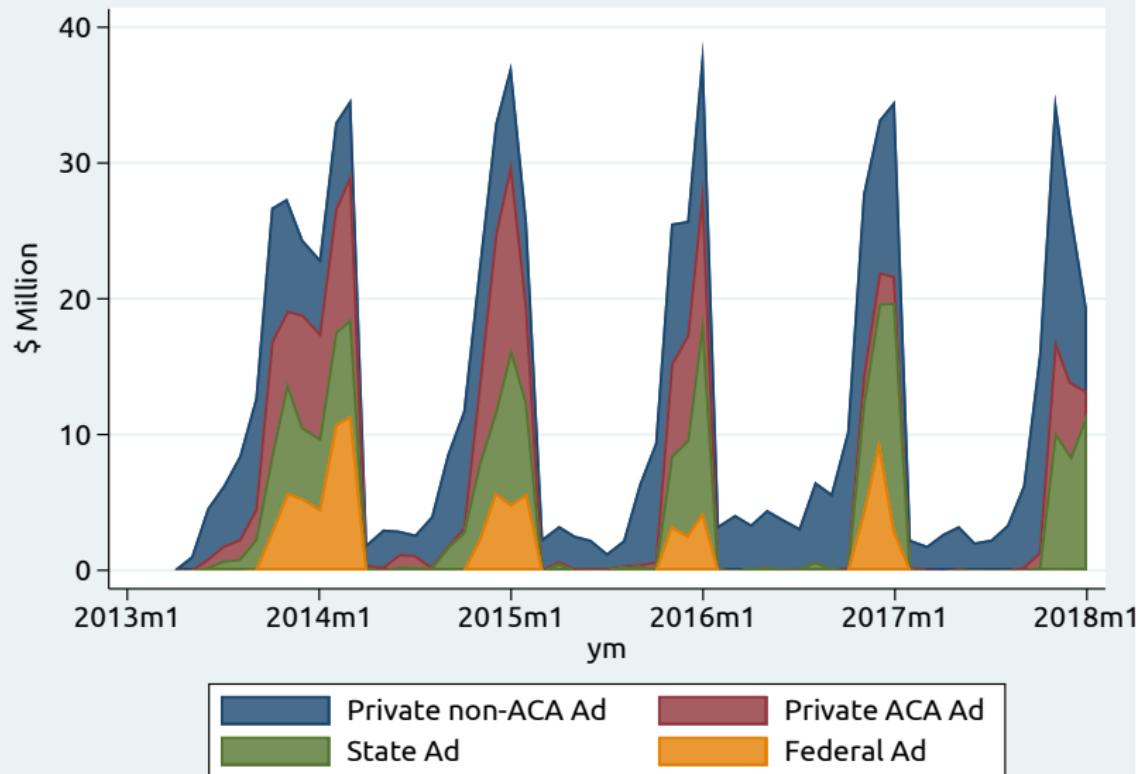
- ▶ Example: private ads by Molina and UnitedHealth.



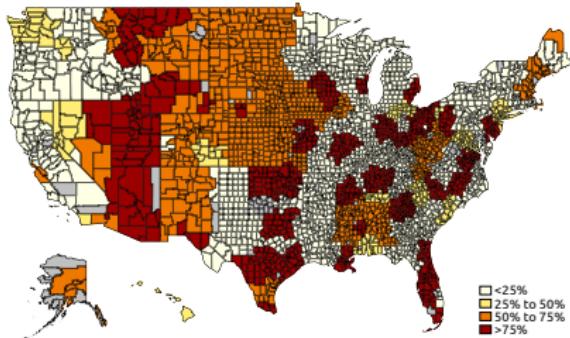
# Data

- ▶ TV ad data from Kantar Media (Campaign Media Analysis Group):
  - ▶ Ad spending by different sponsors;
  - ▶ Ad contents via actual ad TV.
    - ▶ We document ad transcript (via Amazon Transcribe) and identify which information each ad contains:
    - ▶ e.g., subsidy, penalty, open enrollment, etc.
- ▶ Enrollment data from Center for Medicare and Medicaid Services 2014-2018.
  - ▶ Market- and plan-level enrollment data for federal & state-federal partnership marketplaces.
  - ▶ We supplement enrollment data of CA and NY state marketplaces.

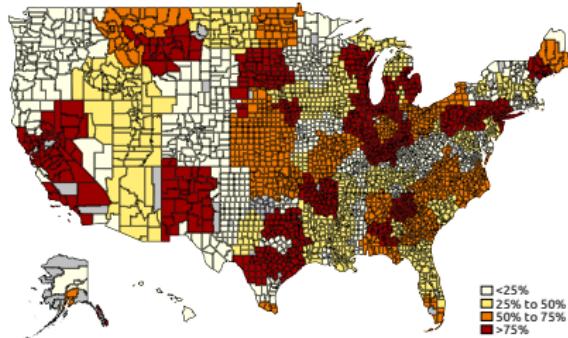
## Monthly Ad Spending



# Geographical Targeting



(a) Fed Ad per Capita



(b) Private Ad per Capita

- We also regress ad on market characteristics:

$$\log(1 + ad_{mt}^{\tau}) = X_{mt}\gamma + \xi_t + \epsilon_{mt}.$$

- Both priv and gov ads are larger in markets with more insurers.
- Priv ads are especially larger in markets with more potential enrollees or with Medicaid expansion.

Target Regression

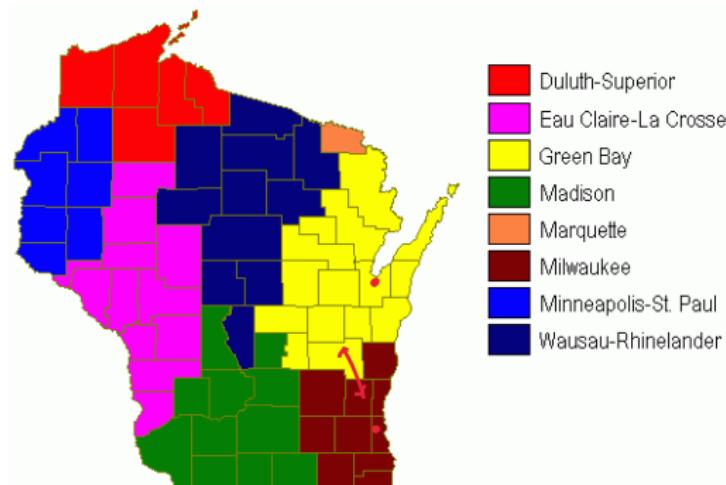
# The Impact of Advertising on Consumer Demand

# Effects of Advertising on Consumer Demand

- ▶ Estimate consumer demand at the level of
  - ▶ Market (county)-level enrollment
  - ▶ Insurer-level enrollment.
- ▶ Identification challenge: advertising is endogenous.
  - ▶ Potential correlation between ads and consumer preference.
- ▶ Our approach: TV ad border strategy: utilize pairs of adjacent border counties that belong to different DMAs (TV ad markets).

# Identification Strategy

## Wisconsin TV Markets



- ▶ Identifying condition: within each border pair, time varying unobserved demand between counties is uncorrelated with TV ad growth.
  - ▶ Control border x year FE, county FE, and rating area x year FE.
  - ▶ Border sample is balanced, regardless of ad spending.

Comparison across Borders

More on Border Strategy

# Market-Level Enrollment

	(1)	(2)	(3)	(4)
Fed Spend (\$)	0.041 (0.027)	0.041*** (0.015)	0.050** (0.022)	0.050** (0.022)
State Spend (\$)	-0.028 (0.024)	0.019 (0.023)	-0.011 (0.030)	-0.008 (0.029)
Priv Spend (\$)	0.006 (0.011)	0.011 (0.012)	0.023 (0.019)	0.024 (0.018)
Navi Spend (\$)				-0.055 (0.120)
Dem Spend (\$)				0.049*** (0.017)
Rep Spend (\$)				-0.015* (0.008)
BorderYear FE	Y	Y	Y	Y
County FE		Y	Y	Y
RatingYear FE			Y	Y
N. Obs.	18,862	18,812	18,154	18,154
Adj. $R^2$	0.707	0.911	0.916	0.916

$$\ln(s_{bct}) = \sum_{k \in K} \ln(1 + ad_{bm(c)t}^k) \beta_k + \mathbf{x}_{bct} \gamma + \xi_{bt} + \xi_{r(c)t} + \xi_c + \epsilon_{bct}$$

$s_{bct}$ : county-level take-up rate.

- ▶ Federal gov ads double  $\Rightarrow$  take up increases by 5% (1.0 pp from 19%).
- ▶ State ads not effective on average: but very effective in CA.
- ▶ We **reject**  $\beta_{mpri} > \beta_{fed}$ .

# Consumer's Plan Choice Model

- ▶ Consumer  $i$ 's indirect utility from a plan by insurer  $j$ :

$$u_{ijct} = \sum_{k \in K} \ln(1 + ad_{jm(c)t}^k) \beta_k + \xi_{jct} + \epsilon_{ijct}$$

- ▶  $K = \{\text{fed, state, private own, rival, navigators, Republican, and Democrat}\}$ .
- ▶ Rival ads determine whether private ads have a positive spillover or business-stealing effect.
  - ▶ Positive spillover if  $\beta_{rival} >> 0$ .

- ▶ Outside option is to stay uninsured.
- ▶ Endogeneity of advertising: apply the border approach.

[Link to the specification](#)

# Estimates from Insurer-Level Choice Model

	(1)	(2)	(3)	(4)	(5)	(6)
Fed Spend (\$)	-0.009 (0.059)	0.079 (0.050)	0.132*** (0.049)	0.125** (0.055)	0.126** (0.054)	0.129** (0.055)
State Spend (\$)	0.012 (0.042)	-0.050 (0.056)	-0.032 (0.059)	-0.033 (0.068)	-0.029 (0.067)	-0.028 (0.066)
Priv Spend (\$)	0.217*** (0.034)	0.307*** (0.049)	0.148*** (0.040)	0.093** (0.046)	0.092** (0.046)	0.090** (0.046)
Rival Spend (\$)					-0.037 (0.047)	-0.043 (0.046)
Navi Spend (\$)						-0.390 (0.265)
Dem Spend (\$)						0.049 (0.036)
Rep Spend (\$)						0.017 (0.019)
FirmBorderYear FE	Y	Y	Y	Y	Y	Y
County FE		Y	Y			
FirmCounty FE				Y	Y	Y
FirmRatingYear FE			Y	Y	Y	Y
N. Obs.	39,782	39,750	38,296	36,558	36,558	36,558
Adj. $R^2$	0.791	0.822	0.895	0.942	0.942	0.942

- ▶ Own private ads are effective in all specifications: elas.=0.03.
- ▶ We **reject**  $\beta_{rival} >> 0$ .
  - ▶ Insurer-level reduced-form enrollment regression suggests a significant negative effect of rival ads in certain markets.

## Additional Results

- ▶ Federal ads emphasizing open enrollment and financial assistance are very effective.
  - ▶ more effective than priv ads emphasizing open enrollment and financial assistance.

[Link to Ad Content Analysis](#)

- ▶ We do **not** find robust evidence of significant heterogeneous (selection) effects of advertising (based on income and age).

[Link to more demand results](#)

- ▶ Results are robust to different functional forms.
  - ▶ Ad effectiveness does not decay over years.
- ▶ Modest dependence on state's Medicaid expansion status.
- ▶ Ad effectiveness of federal gov does not appear to depend on private ads (no complementarity).
  - ▶ From insurer's perspective, ads between federal and private can be substitutes.

[Link to Interaction](#)

# Counterfactual Experiments

## Counterfactual Experiment: Motivation

- ▶ Our demand estimates suggest that gov ads can be a useful policy intervention in marketplaces:
  - ▶ The lack of positive spillover of private ads.
  - ▶ Private ads are not more effective than federal ads.
  - ▶ Some (small) insurers did not advertise likely due to the fixed cost of advertising.
- ▶ But gov ads may also crowd out private ads.
- ▶ We illustrate these mechanisms by setting up an equilibrium model.

## Counterfactual Experiment: Supply Side Model

- ▶ Each firm optimally chooses its ads to maximize:

$$\max_{ad_{jmt}^p} \pi_{jmt} q_{jmt}(ad_{mt}^f, ad_{mt}^s, \mathbf{ad}_{mt}^p) - C_{jmt}(ad_{jmt}^p)$$

- ▶ We characterize a Bertrand-Nash equilibrium in each market.
- ▶ We estimate  $\pi_{jmt}$  by exploiting firm's maximization problem.
  - ▶ The estimated median annual profit = \$756.
  - ▶ 15% of profit margin given that the average premium in 2017 is \$4,320.
- ▶ We simulate the effect of changing federal ads in two cases:
  - ▶ (Partial eqm.) Only consumers reoptimize.
  - ▶ (Full eqm.) Both consumers and insurers reoptimize.

# Simulation Result

		Benchmark	Fed Ad $\times 0$		Fed Ad $\times 3$	
			Partial	Full	Partial	Full
All Markets	Enroll (%)	18.98	18.64	18.65	19.55	19.54
	Priv Ad (\$)	1.43	1.43	1.51	1.43	1.35
Market w. Large Fed Ad Spend (top 10%)	Enroll (%)	17.87	16.66	16.72	19.22	19.17
	Priv Ad (\$)	1.65	1.65	2.22	1.65	1.38

- ▶ Priv ads respond to changes in gov ads, but its response has a small effect on market-level enrollment.
- ▶ Private ads are excessive (prisoner's dilemma).
- ▶ Crowding out of private ads may reduce switching to better insurers.
  - ▶ But such welfare effects are much smaller than welfare effects from expanding market size (Finkelstein et al. 2019).

# Conclusion

- ▶ Private ads are targeted differently from gov ads.
- ▶ Private ads are **not** more effective than federal ads in increasing the total program enrollment.
- ▶ Private ads increase insurer's own enrollment but do **not** have positive spillover effects.
- ▶ With an estimated equilibrium model, we illustrate that gov ads **can** simultaneously increase enrollment and mitigate excessive private ads competition.