

Optimal Incentives in the Presence of Social Norms: Experimental Evidence from Kenya

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Motivation

- Markets often fail to achieve socially optimal outcomes.
 - Governments shape economic incentives - cost and benefits of actions - to realign individual choices.
- Yet, these very individual choices are frequently also governed by social norms: they carry reputational costs and benefits.
 - Individuals take visible actions to signal their type. [DellaVigna et al. 2017; Perez-Truglia et al. 2017; Bursztyn et al. 2017, 2018; Karing 2021]
- Reputational incentives can interact with economic incentives, mitigating or amplifying their effects. [Bénabou and Tirole, 2012]
 - Governments can leverage these interactions for optimal policy design.

Research question

- How do changes in economic incentives interact with reputational incentives? What does it mean for optimal policy at scale?
- **Emerging theoretical literature**
- **Lack of empirical evidence:** so far, challenging to randomize *both* economic incentives and social norm concerns.

This paper.

This paper: what we do not do

- We do not study crowding out of intrinsic motivation in response to material rewards or punishments.

This paper: what we do - field experiment

Setting: deworming treatment in Kenya, increase take-up among adults.

- Vary social norm concerns.

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- Implement experiment at scale. Create common knowledge and shift equilibrium level of take-up.

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- Create experimental variation in the cost of deworming. Vary the distance people have to travel to receive treatment.
- Implement experiment at scale. Create common knowledge and shift equilibrium level of take-up. At large-scale: randomize 144 points of treatment and their communities, 200,000 adults targeted.

This paper: what we do - structural model

- Take theory to data. Estimate counterfactuals that account for endogenous social norm responses.

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This paper: what we do - structural model

- Take theory to data. Estimate counterfactuals that account for endogenous social norm responses. **Build a structural model to identify social multiplier effects.**
- Solve for optimal allocation of points of treatment. **Combine parameter estimates with geographic location data.**

This paper: what we ask specifically

- ① How does the opportunity to signal take-up affect individuals' decision to deworm?
- ② How does changing distance affect take-up and the reputational returns from deworming?
 - Do these changes mitigate or amplify the impact of cost on take-up?
- ③ What is the optimal allocation of deworming treatment locations in the presence of social multiplier effects?

This paper: what we find

- Increasing the visibility of actions through bracelets, take-up of deworming treatment \uparrow from 34 to 42 percent.
- Increasing the travel distance by 1km leads to a decline in take-up by 15 percentage points in the absence of signals.
- Bracelets as signals ATE twice as large at far distances.
⇒ increases in reputational returns mitigate the negative impact of distance on take-up by 4 pp per km (social multiplier > -1).
- Optimal policy leverages endogenous social norm responses: with the same number of treatment locations serve a larger population.

Overview of talk

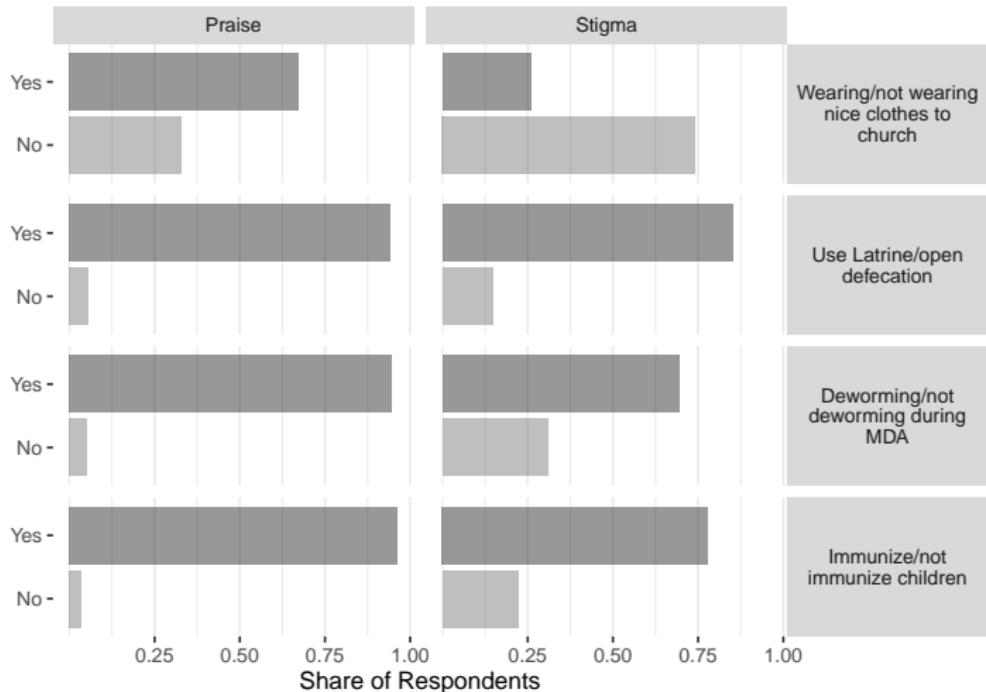
- ① Empirical context
- ② Theoretical framework
- ③ Experimental design
- ④ Reduced form results
- ⑤ Structural model → social multiplier
- ⑥ Optimal policy choice

Empirical context

- Soil-transmitted helminths (STH) refer to intestinal worms infecting humans that are transmitted through contaminated soil. 2 billion people are infected.
- Development burden for children and adults in many LICs. Mild infections often are asymptomatic. More severe infections lead to abdominal pain, iron-deficiency, anemia, malnutrition, and stunting.
- Deworming is a public good:
 - Low private returns for many individuals.
 - Most of social benefits come through reduced disease transmission.
 - Children are dewormed in schools but remaining reservoir among adult population fosters reinfection ⇒ To stop transmission, need adults to deworm.
- Cost of screening is 4 to 10 times that of treatment. Deworming drugs are safe, no side effects for uninfected. Recommended every 6-12 months.

- Worms are endemic, infection prevalence is over 20%.
- Kenyan Government deworms children for free in schools. School-based deworming is a well-known program.
- Adults can purchase deworming treatment at pharmacies and clinics for 150 KSh ~ USD 1.5.
- Baseline survey
 - 78% of adults knew about deworming treatment.
 - 68% had taken deworming treatment before.
 - 37% reported to have dewormed in the past 12 months.
 - 31% of adults had knowledge of externalities.

Social norm concerns



- ① Empirical context
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Social signaling (Bénabou and Tirole 2012)

$$U_i(y; \nu, \mu) = B_i(y; \nu) + \overbrace{\mu E_{-i}[V | y]}^{\text{reputational returns}}$$

Individuals have different *prosocial* types that are unobservable to others. Others can use i 's action to draw inferences about her type.

- Prosocial activity, $y \in \{0, 1\}$, dewormed or not.
- Net private benefit of deworming, $B_i(y; \nu)$.
- Intrinsic motivation to look after one's health and that of others, $V \sim F_V$.
- $E_{-i}[V | y]$ is the inference that others make about own type ν based on your action y .
- Visibility of y and desirability to signal, $\mu = x \cdot \lambda$.

Equilibrium with signaling

Equilibrium v^* :

$$B(y = 1; v^*) + \overbrace{\mu \Delta[v^*]}^{\text{net reputational incentive}} = 0$$

where

$$\Delta[v^*] = E[V|y=1] - E[V|y=0] = \overbrace{E[V|V > v^*]}^{\text{honor}} - \overbrace{E[V|V \leq v^*]}^{\text{stigma}}$$

is the difference in the average type based on observed actions.

Without signaling the equilibrium would be

$$B(y = 1; \tilde{v}) = 0$$

and thus, with $v^* < \tilde{v}$, signaling induces greater take-up of deworming.

Interaction of cost and norms

Let c be the cost (disutility) of deworming, and define the average take-up to be

$$\bar{y}(c) = 1 - F_V(\nu^*(c)),$$

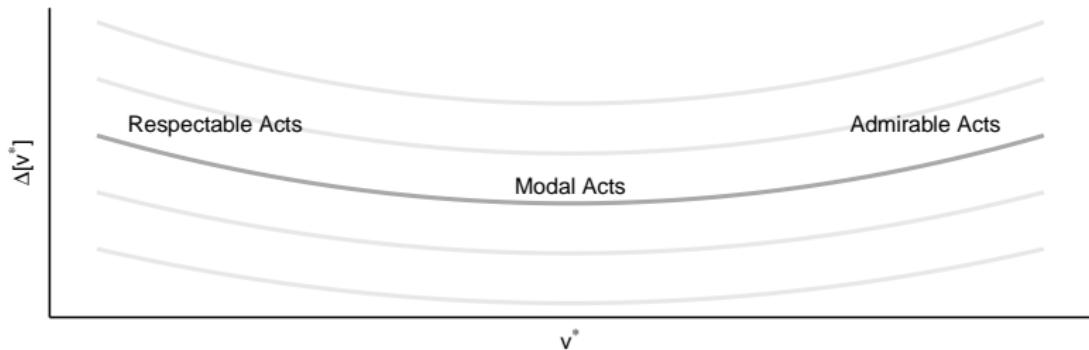
the slope of which is

$$\bar{y}'(c) = f_V(\nu^*(c)) \cdot \underbrace{\frac{-1}{1 + \mu \Delta'[\nu^*(c)]}}_{\text{social multiplier}}$$

Social multiplier

$$-\frac{d v^*(c)}{dc} = \frac{-1}{1 + \mu \Delta'[v^*(c)]}$$

- $\Delta'[v^*] < 0 \implies$ More sensitive to changes in cost/benefits (respectable or normal acts) - amplification.
- $\Delta'[v^*] > 0 \implies$ Less sensitive to changes in cost/benefits (admirable or heroic acts) - mitigation.



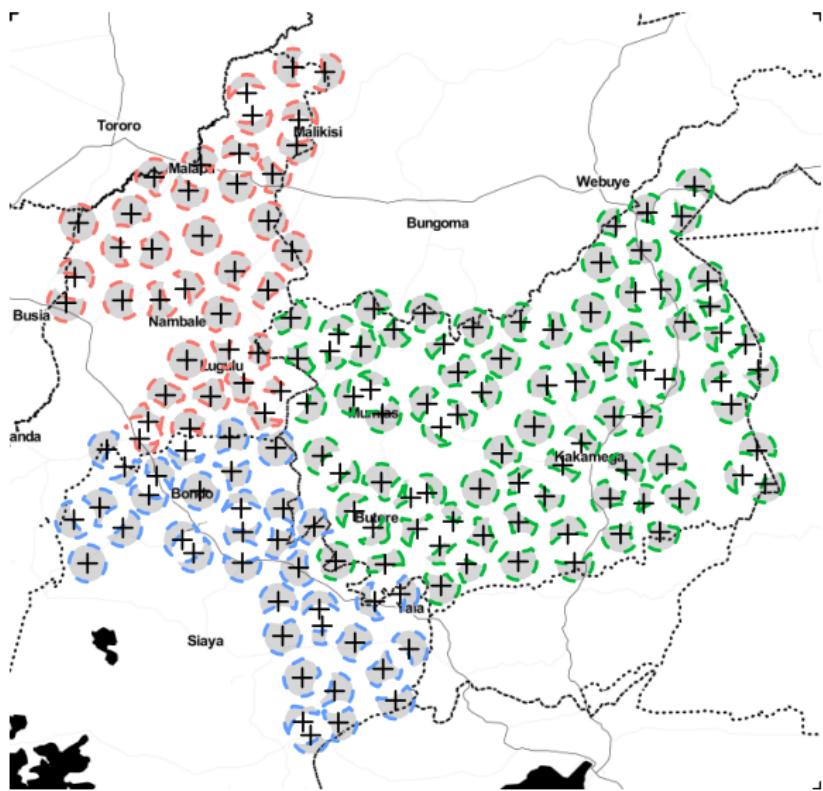
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Community-based deworming program

- We worked with the government of Kenya and its county governments, providing free deworming treatment to approximately 200,000 adults in Busia, Siaya and Kakamega.
- Community Health Volunteers (CHVs) provided deworming at 144 central locations over 12 days, Monday-Sunday 8am-5pm.
- CHVs informed communities prior to deworming about the social benefits of deworming, the dates and location.

Site selection



School Locations



Experimental treatments

- ① *Reputational concerns*: visibility of deworming take-up using:
 - a) *Bracelets*: a social signal with some potential private valuation.
 - b) *Indelible Ink*: a social signal with no private valuation.
 - c) *Control*: no incentives.
 - d) *Calendars*: a private incentive with low visibility.

$Z \in \{\text{control, bracelet, calendar, ink}\}$

- ② *Cost of deworming*: manipulating cost by randomly varying the distance to deworming location. $D \in \{\text{close, far}\}$

Information Campaign

Social signals

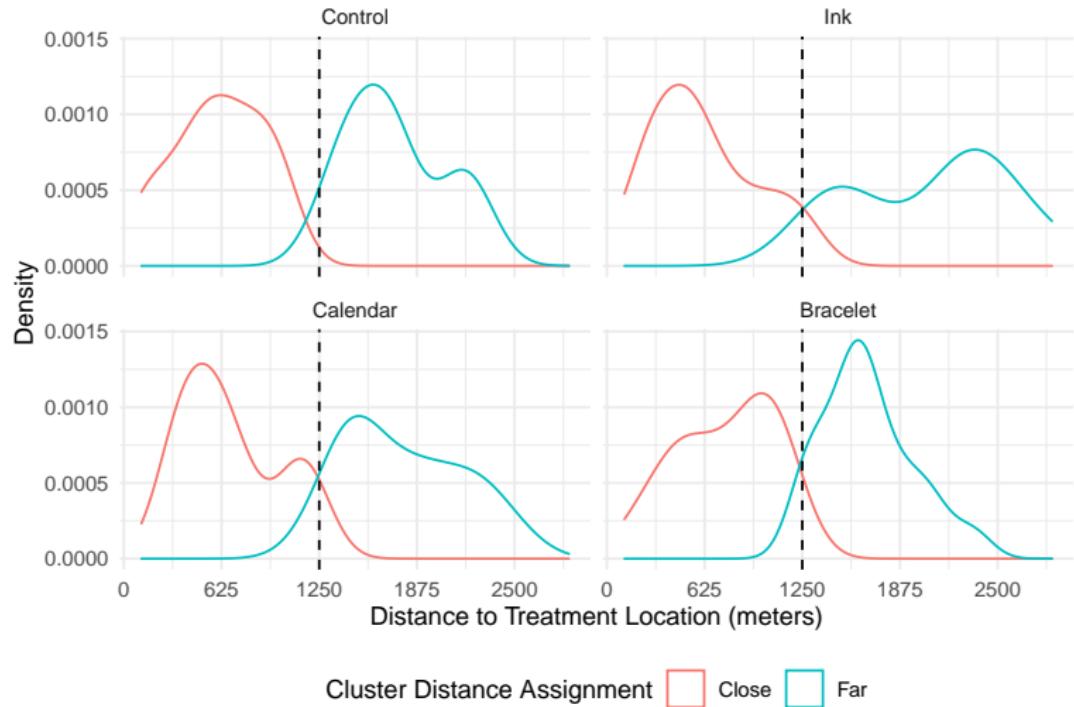


Bracelet saying “Treat worms: improve the health of your community”

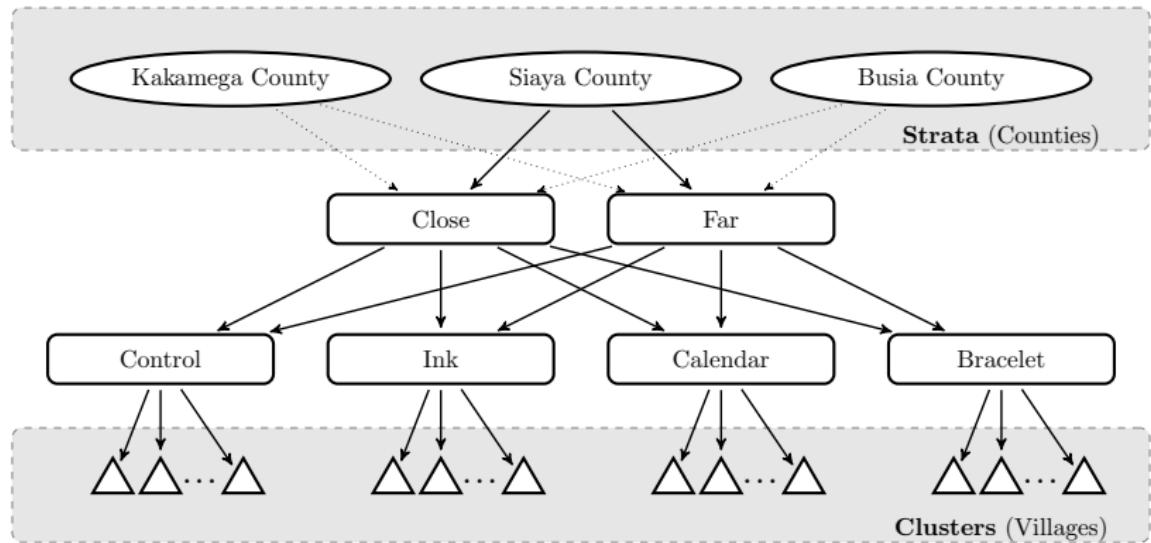
Private incentive



Random distance to treatment location



Experiment design



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Reduced form model

Probit model:

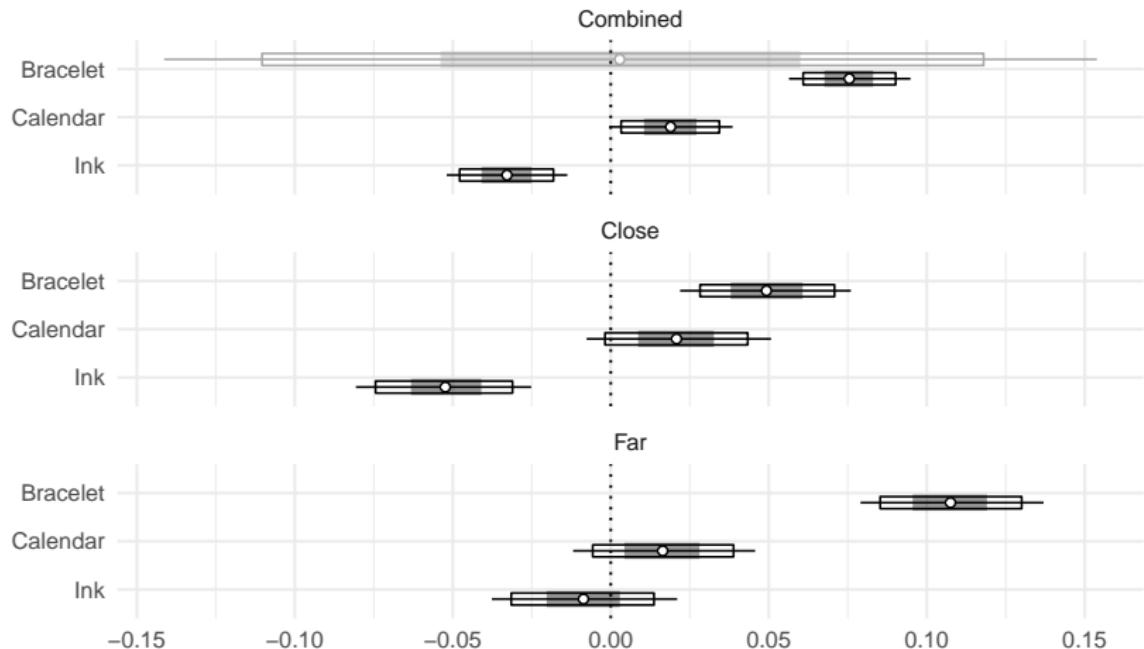
$$\begin{aligned} E[Y_i(z, g)] &= E[Y_i | Z = z, G = g] \\ &= \Phi(\alpha + z\beta_z + g\delta + (z \times g)\gamma_z) \end{aligned}$$

where

$$Z \in \{bracelet, calendar, ink\}$$

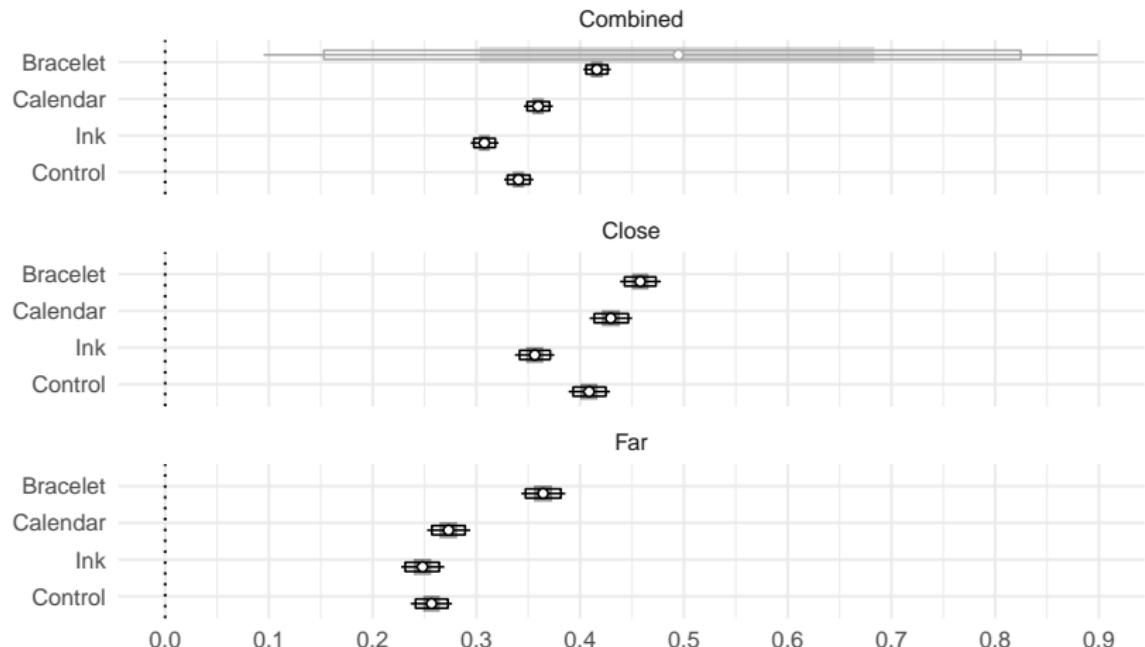
$$G \in \{close, far\}$$

Reduced form results: Incentive ATEs



Line range: 90% credible interval.
Outer box: 80% credible interval. Inner box: 50% credible interval.
Thick vertical line: median. Point: mean.

Reduced form results: Incentive take-up levels



Line range: 90% credible interval.
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Deworming take-up model

$$Y(z, d) = \mathbb{1}\{B(z, d) + \mu(z, d)\Delta[w^*(z, d)] + \overbrace{V + U}^W > 0\}$$

where we solve for the fixed point:

$$w^*(z, d) = -B(z, d) - \mu(z, d)\Delta[w^*(z, d)]$$

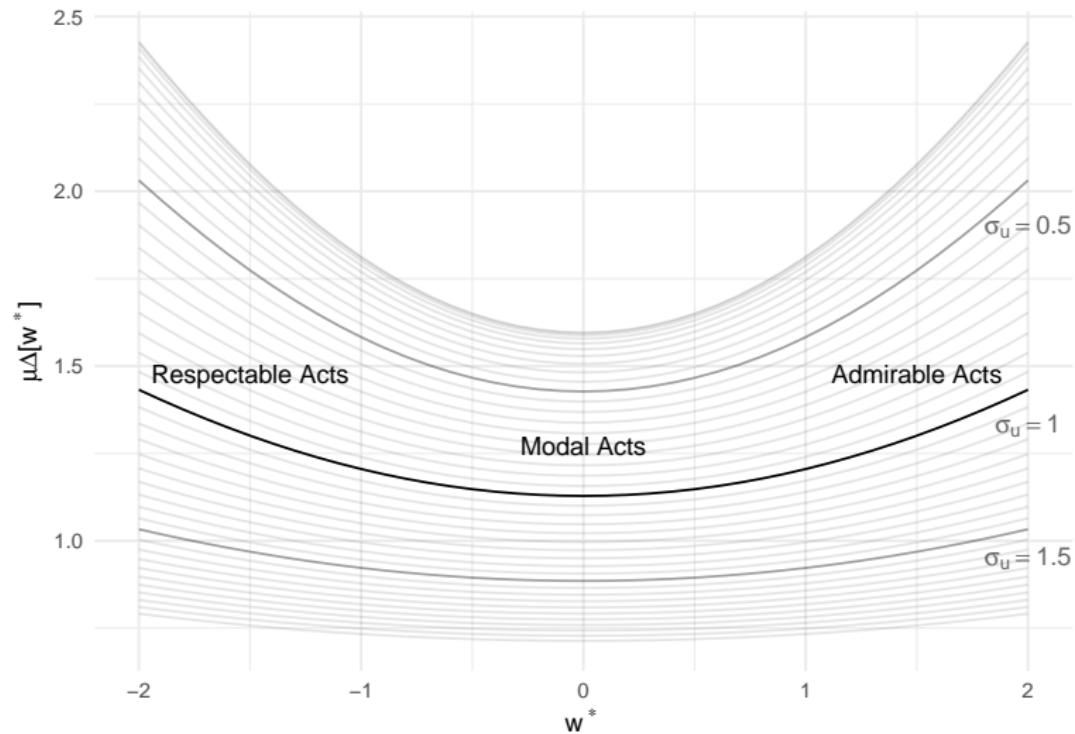
Augment the theoretical model:

- $\mu(z, d) = x(z, d) \cdot \lambda$ visibility as a function of distance.
- U second source of unobservable heterogeneity, cost or taste shocks.

Bring information to bear from multiple sources:

- Use willingness-to-pay exercise to learn about $B(z, d)$
- Use beliefs data to estimate $\mu(z, d)$

Net reputational returns with non-structural shocks



Net private benefit B

$$B(z, d) = z\beta - \delta \cdot d, \quad z \in \{\text{control, ink, calendar, bracelet}\}, d \in \mathbb{R}^+$$

We model individual's private utility to be

$$\beta_{\text{calendar}} = \beta_{\text{bracelet}} + \gamma^{\text{wtp}} \mu^{\text{wtp}}$$

$$\gamma^{\text{wtp}} \sim \text{Normal}^+(0, \tau^{\gamma, \text{wtp}}).$$

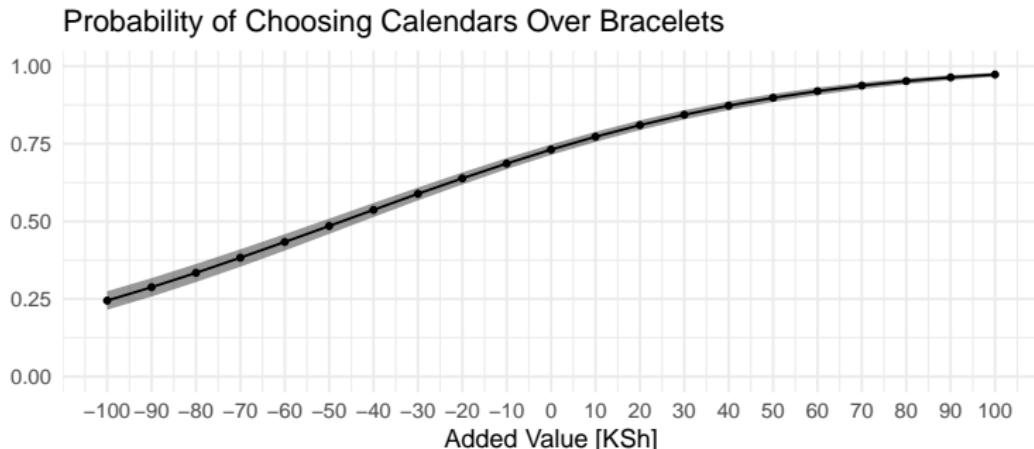
Willingness-to-pay experiment

We conducted an experiment to elicit the private valuation of calendars and bracelets:

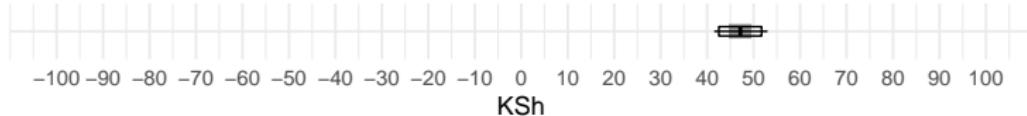
- ① Subjects (from the control arm) were asked to choose one of two gifts, a calendar or a bracelet (2% wanted neither).
- ② Subjects were offered payment in order to switch to the gift not selected. Offer was randomly chosen from 0, 10, ..., 100 KSh.

⇒ Estimate a discrete choice model. [Model Details](#)

Willingness-to-pay experiment results



Difference in Valuation of Calendars and Bracelets



Line range: 90% credible interval.
Outer box: 80% credible interval. Inner box: 50% credible interval.
Thick vertical line: median. Point: mean.

Signaling benefit R

$$R(z, d) = \mu(z, d) \Delta[w^*(z, d)]$$

$$\mu(z, d) = \lambda \cdot \underbrace{\logit^{-1}(\alpha^{\text{1ord}} + z\beta^{\text{1ord}} + \delta^{\text{1ord}} \cdot d + d \cdot z\rho^{\text{1ord}})}_{p^{\text{1ord}}}$$

$$\lambda \sim \text{Normal}^+(0, \tau^\lambda)$$

Model Details

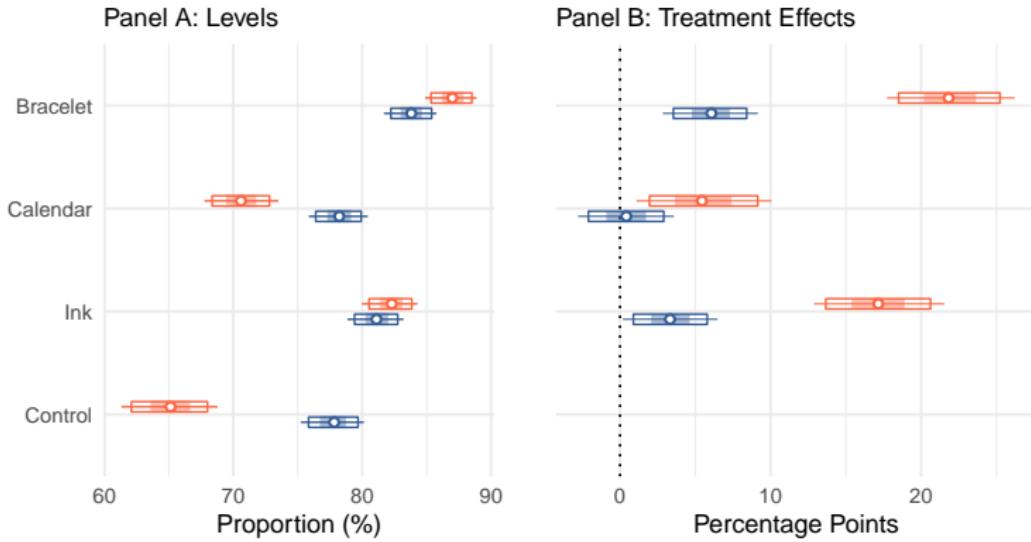
Observability of actions μ

- In the endline survey, respondents were asked a set of questions about 10 random members of their community.
- Among these questions, we asked:
 - Whether they knew the person.
 - Whether they know if the other person got dewormed.
 - Whether the other person knew if the respondent got dewormed.
- We want to identify how the signaling treatments affect:
 - Perception of the observability of others' actions (first-order)
 - Perception of the observability of their own actions (second-order)

⇒ Estimate a binomial model with belief elicitation data.

[Model Details](#)

First-order beliefs results



Line range: 90% credible interval.
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Close Far

Treatment effects

Hold **fixed** each counterfactual component.

For $z \in \{\text{ink, calendar, bracelet}\}$, $g \in \{\text{close, far}\}$:

- Overall Effect,

$$E[\underbrace{\mathbb{1}\{B(z, d) + R(z, d)\}}_{Y(z, d)}] - E[\underbrace{\mathbb{1}\{B(\text{control}, d) + R(\text{control}, d)\}}_{Y(\text{control}, d)}].$$

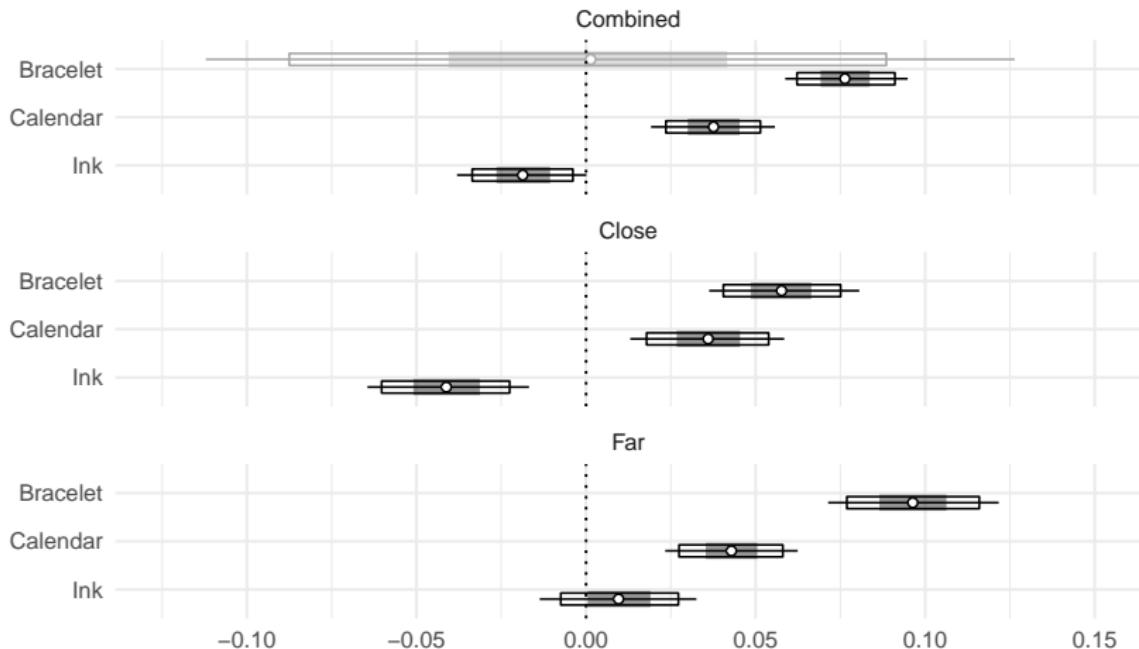
- Social Signaling Effect,

$$E[\mathbb{1}\{B(\text{control}, d) + R(z, d)\}] - E[\mathbb{1}\{B(\text{control}, d) + R(\text{control}, d)\}].$$

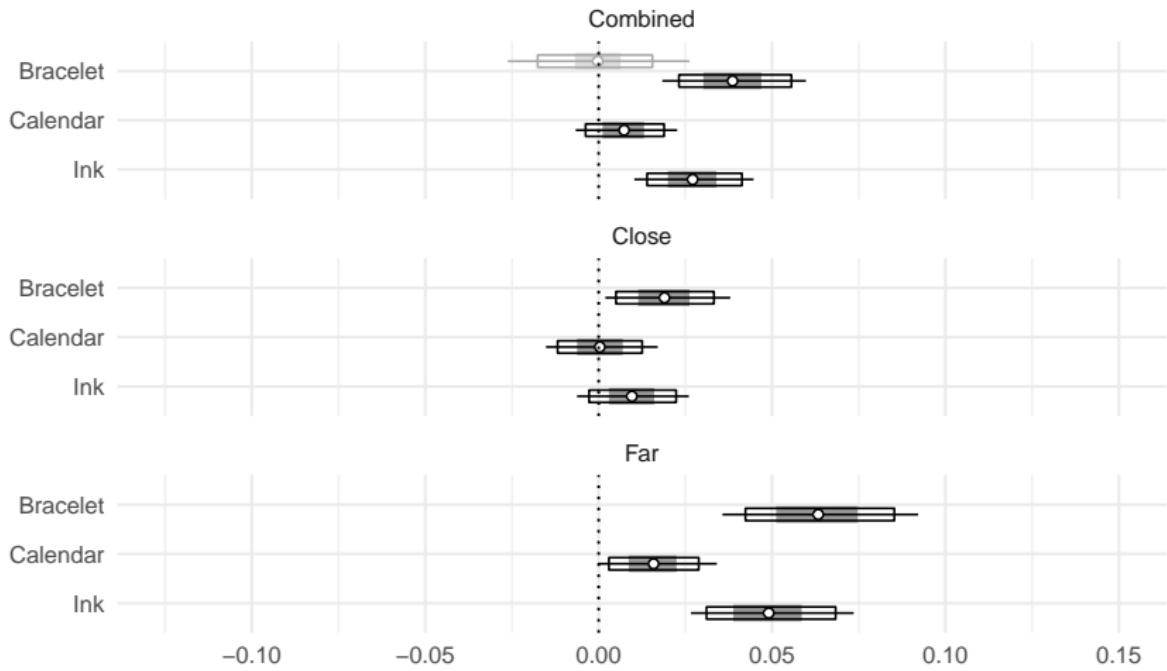
- Private Incentive Effect,

$$E[\mathbb{1}\{B(z, d) + R(\text{control}, d)\}] - E[\mathbb{1}\{B(\text{control}, d) + R(\text{control}, d)\}].$$

Incentive average treatment effects (revisited)



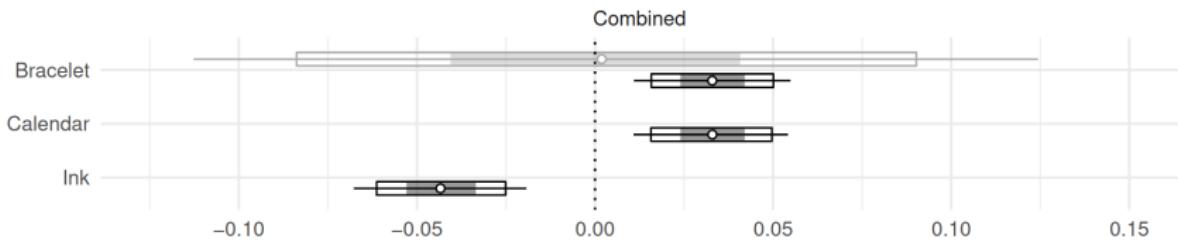
Signaling average treatment effects



Line range: 90% credible interval.
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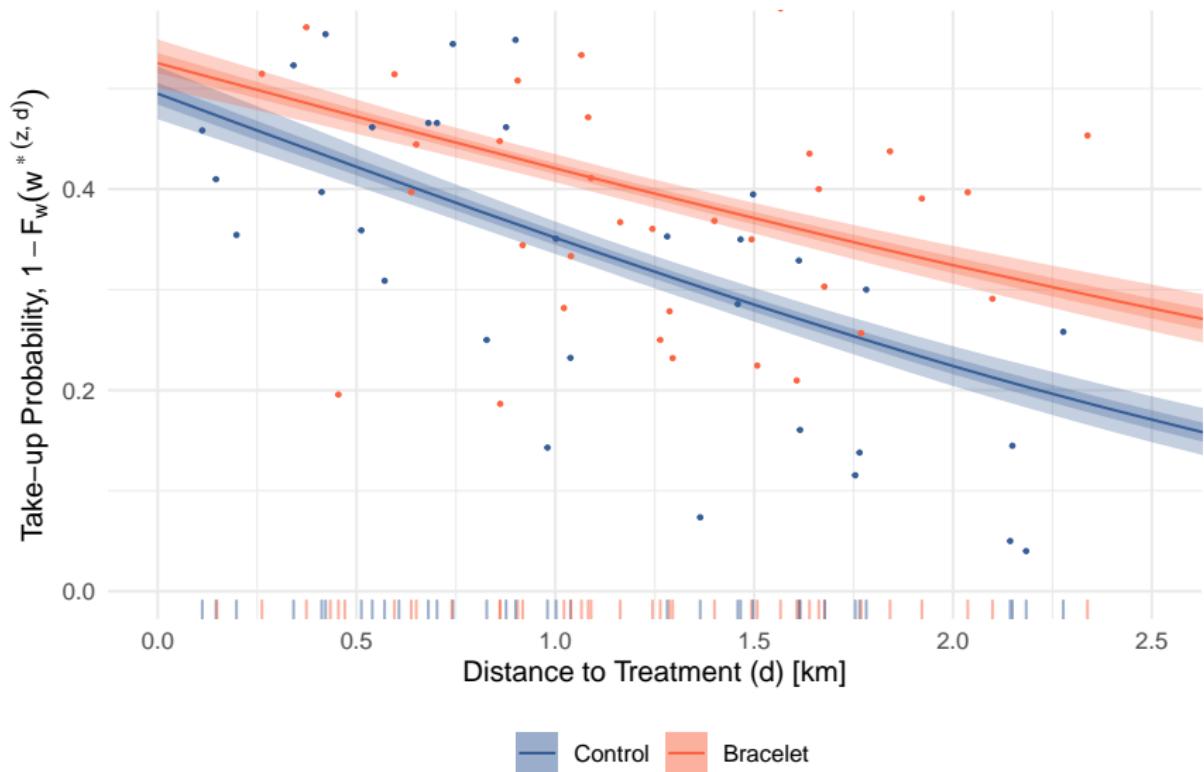


Private incentive average treatment effect



Line range: 90% credible interval.
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Take-up probability and distance



Line: Median. Outer ribbon: 80% credible interval. Inner ribbon: 50% credible interval.

Social multiplier

Recall our object of interest:

$$\bar{y}'(c) = f_V(v^*(c)) \cdot \underbrace{\frac{-1}{1 + \mu \Delta'[v^*(c)]}}_{\text{social multiplier}}$$

Which in our model corresponds to:

$$\frac{\partial \mathbb{E}[Y(z, d)]}{\partial d} = f_w(w^*) \cdot \frac{\left\{ -\delta + \frac{\partial \mu(z, d)}{\partial d} \Delta[w^*] \right\}}{1 + \mu(z, d) \Delta'[w^*]}$$

- $SM^* > -1 \Rightarrow$ mitigation of distance increase on takeup.
- $SM^* < -1 \Rightarrow$ amplification of distance increase on takeup.

Takeup rate of change

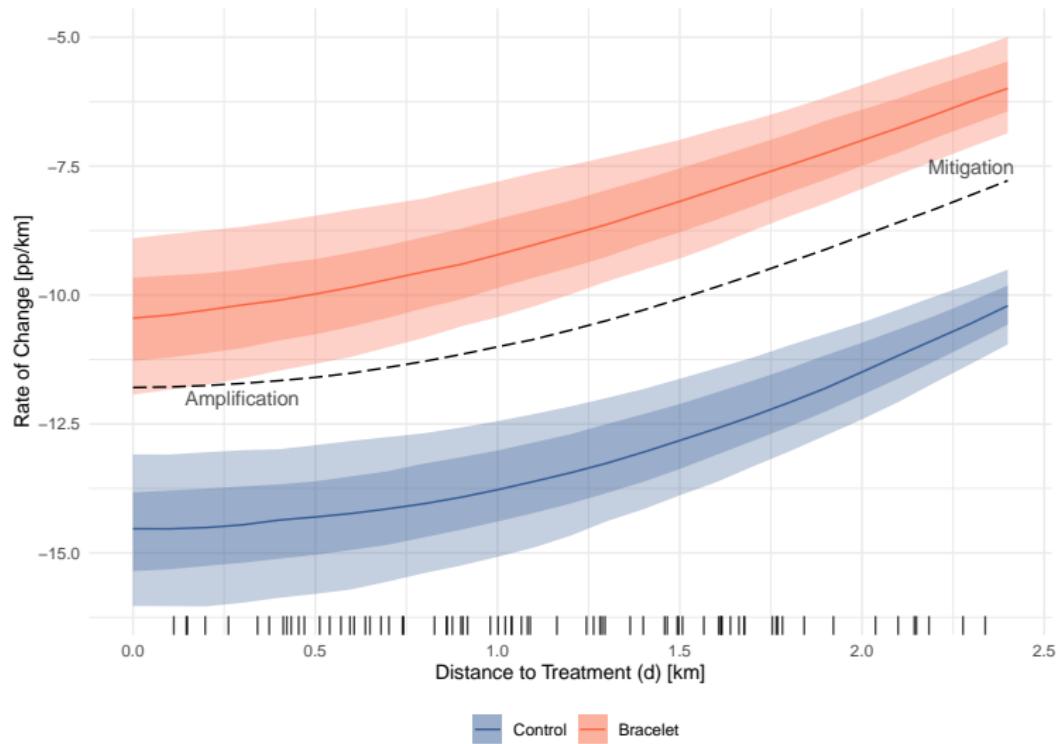
We want to estimate the causal impact of signals on the *take-up rate-of-change with respect to distance*, holding d and w^* fixed.

$$\frac{\partial \mathbb{E}[Y(z, d, w)]}{\partial d} \Bigg|_{\substack{z=\text{bracelet} \\ d=\tilde{d} \\ w=w^*(\text{control}, \tilde{d})}} - \frac{\partial \mathbb{E}[Y(z, d, w)]}{\partial d} \Bigg|_{\substack{z=\text{control} \\ d=\tilde{d} \\ w=w^*(\text{control}, \tilde{d})}}$$

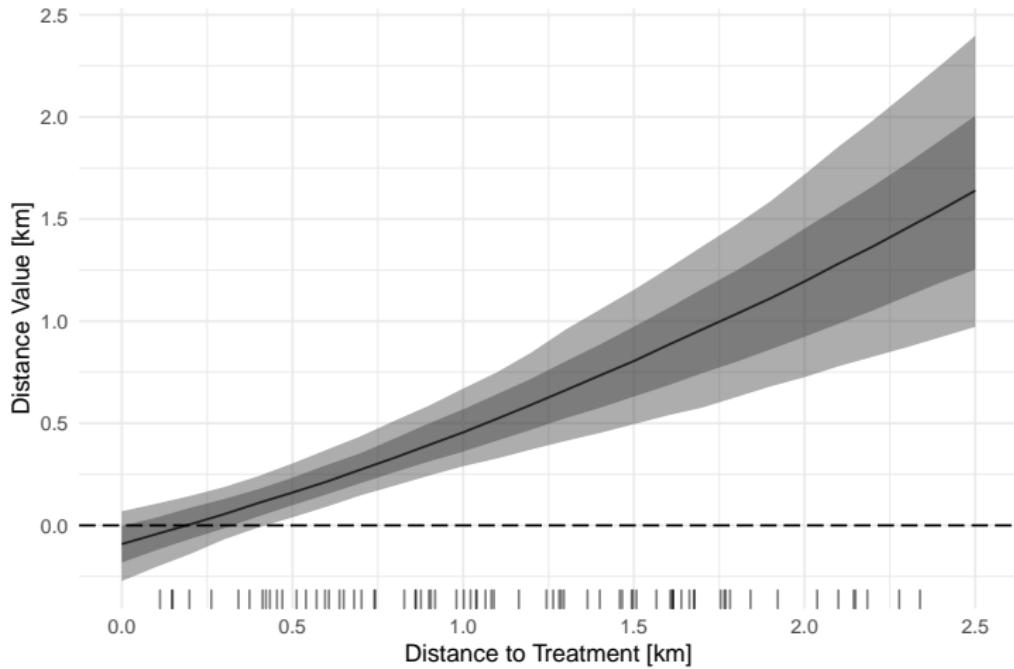
where $\tilde{d} \in \mathbb{R}^+$.

$$\frac{\partial \mathbb{E}[Y(z, d, w)]}{\partial d} = \frac{-f_w(w) \left\{ \delta - \frac{\partial \mu(z, d)}{\partial d} \Delta[w] \right\}}{1 + \mu(z, d) \Delta'[w]}$$

Takeup rate of change



Value of reputational return



Line: Median. Outer ribbon: 80% credible interval. Inner ribbon: 50% credible interval.

$$V_R = \frac{\mu(z, d)\Delta[w^*]}{\delta}$$

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- ⑥ **Optimal policy choice**

Optimal allocation choice

- Social planner goal minimize number of PoTs, achieving the expected social welfare of the control group $\overline{W}^C = E[\sum_{i=1}^n U(takeup_i^C)]$:

$$\min_{y_j, x_{i,j}} \sum_{j=1}^m y_j$$

$$s.t. \quad \sum_{i=1}^n U(\widehat{takeup}_{ij} x_{ij}) \geq \overline{W}^C$$

$$\sum_{j=1}^m x_{ij} = 1, \forall i$$

$$x_{ij} \leq y_j, \forall i, j$$

- y_j indicator whether PoT j is funded.
- x_{ij} indicator that village i uses PoT j .
- $U(\cdot) = \log(\cdot)$.

Optimal allocation choice

Structural model decomposes $take up_{ij}$ into private utility and reputational return from signaling deworming status.

$$take up_{ij} = \underbrace{B(z, d_{ij})}_{\text{private benefit}} + \underbrace{\mu(z, d_{ij}) \Delta [w^*(z, d_{i,j})]}_{\text{reputational return, } R(z, d)}$$

Counterfactuals

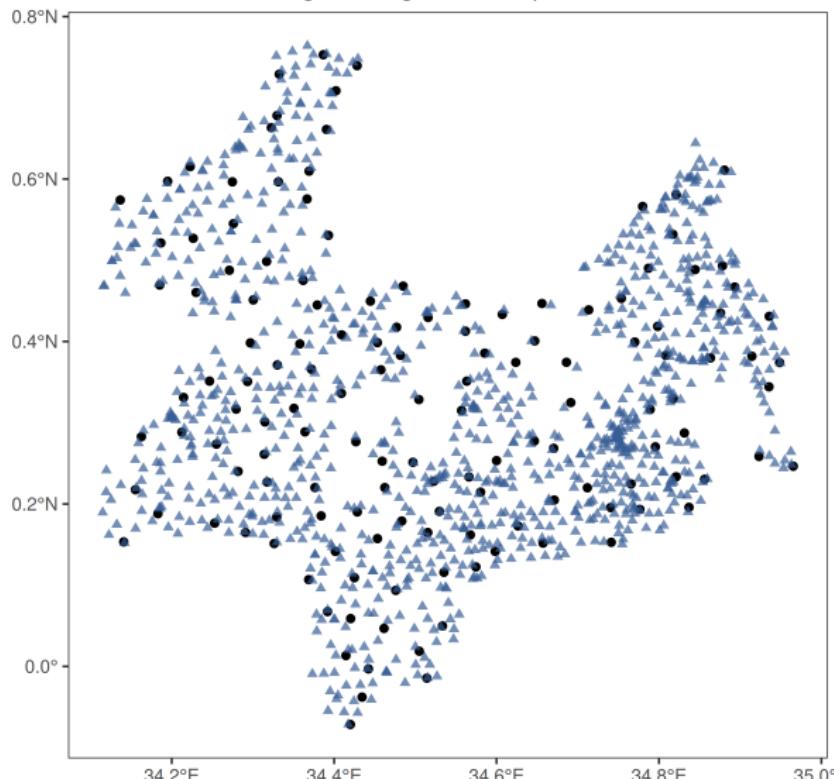
Relevant counterfactuals and their effect on # of required PoTs:

- ① Fix private utility at control level, only vary the visibility μ_z from different incentives z .
- ② Policy maker who is aware of reputational returns but unaware of how those change as distance increases.
- ③ Policy maker who is completely unaware vs. aware of reputational returns.
 - Mimicking knowledge from individual experimentation vs. at scale.

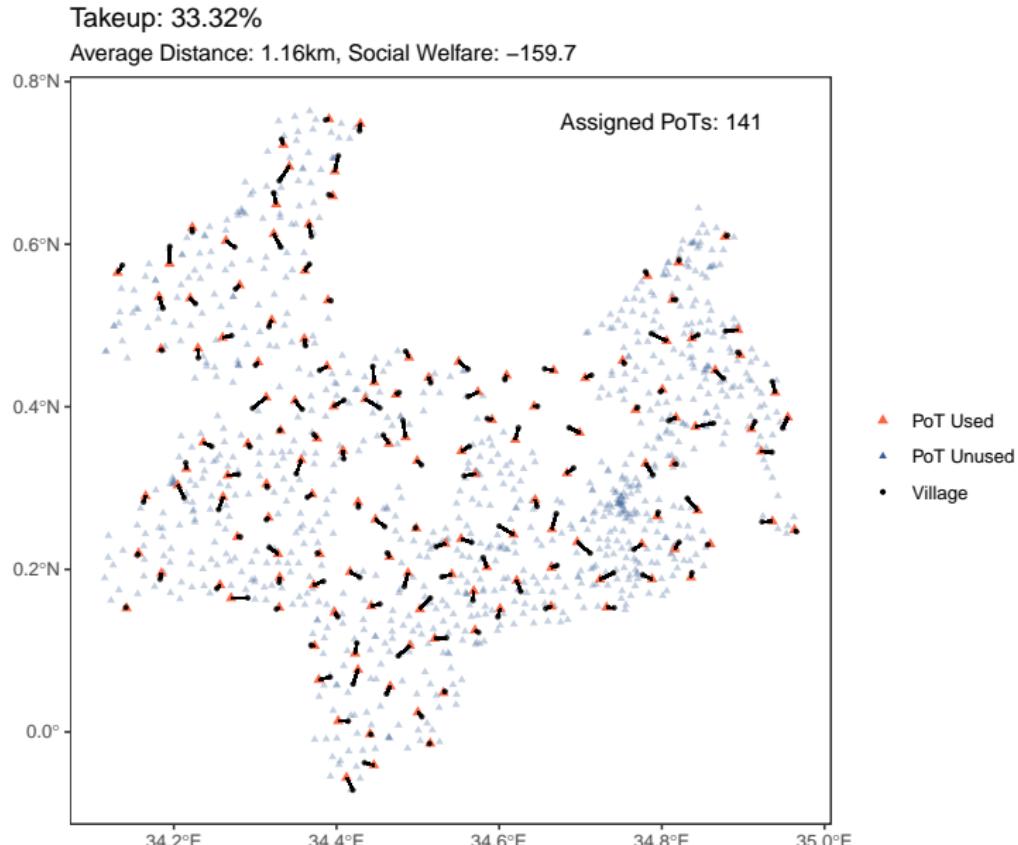
Optimal allocation - problem setup

Optimal PoT Allocation Problem

Black dots indicate villages. Triangles indicate potential clinic locations.



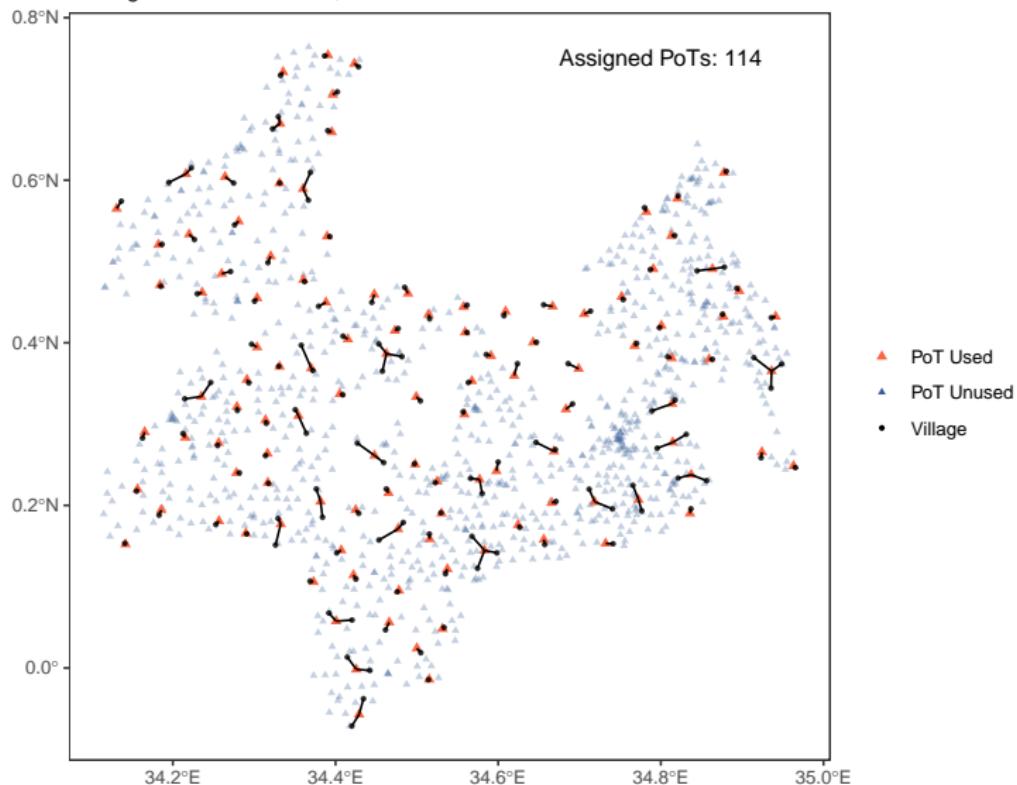
Control experimental allocation



Optimal allocation - B_{control} , μ_{control}

Takeup: 34.4%

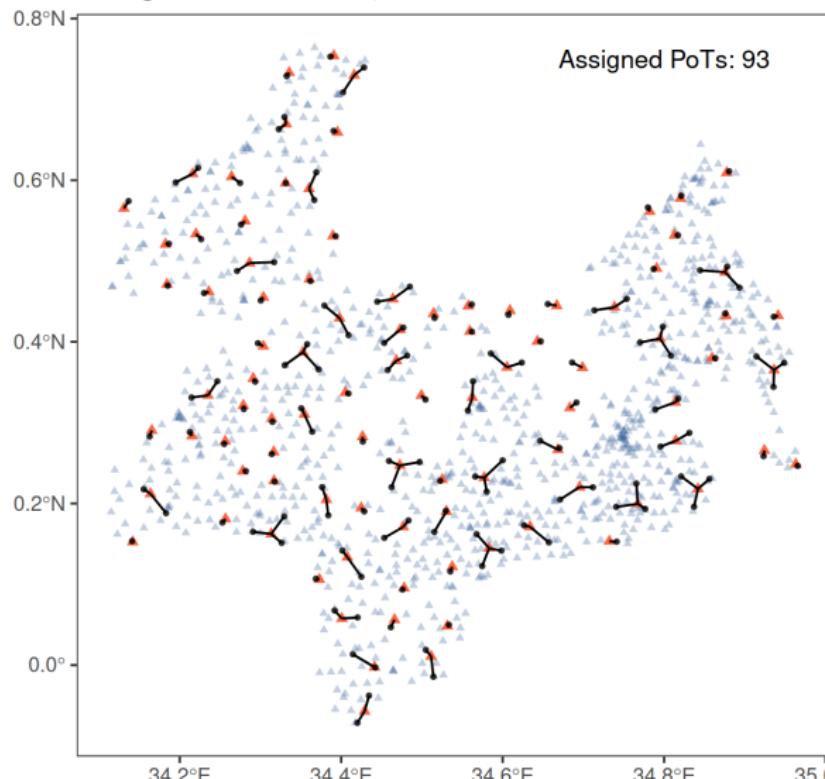
Average Distance: 1.11km, Social Welfare: -158.87



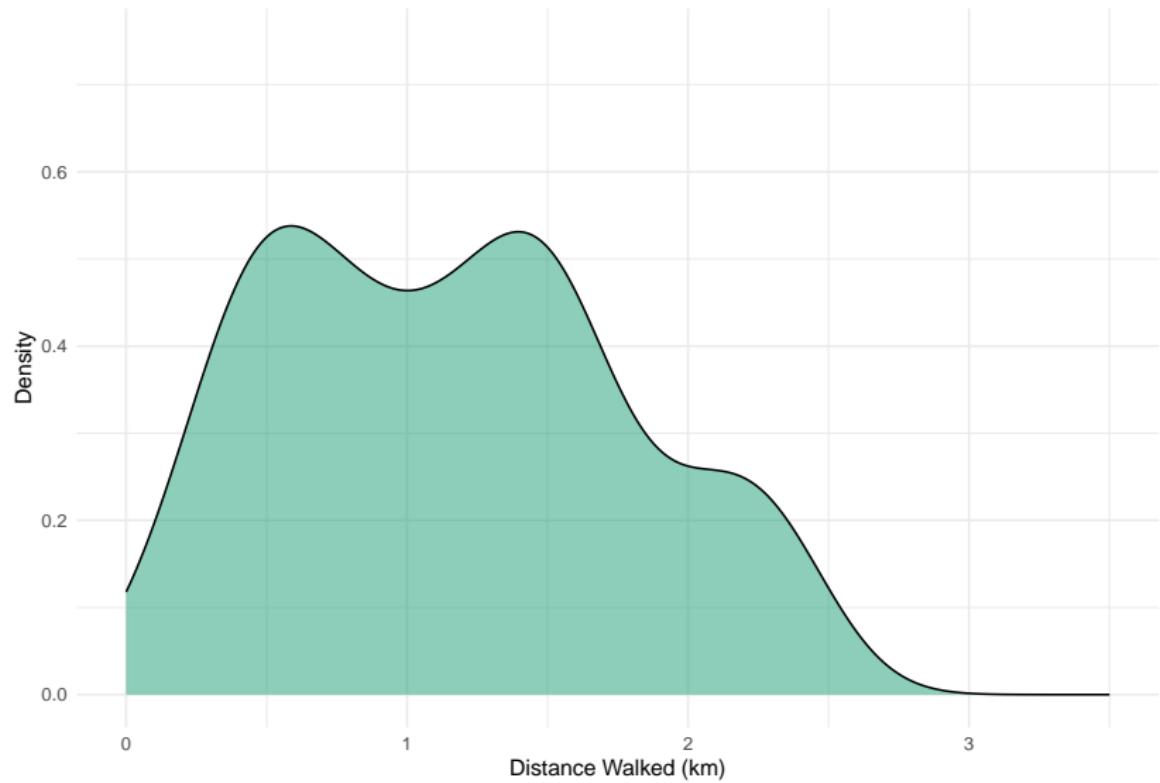
Optimal allocation - B_{control} , μ_{bracelet}

Takeup: 33.8%

Average Distance: 1.56km, Social Welfare: -158.82

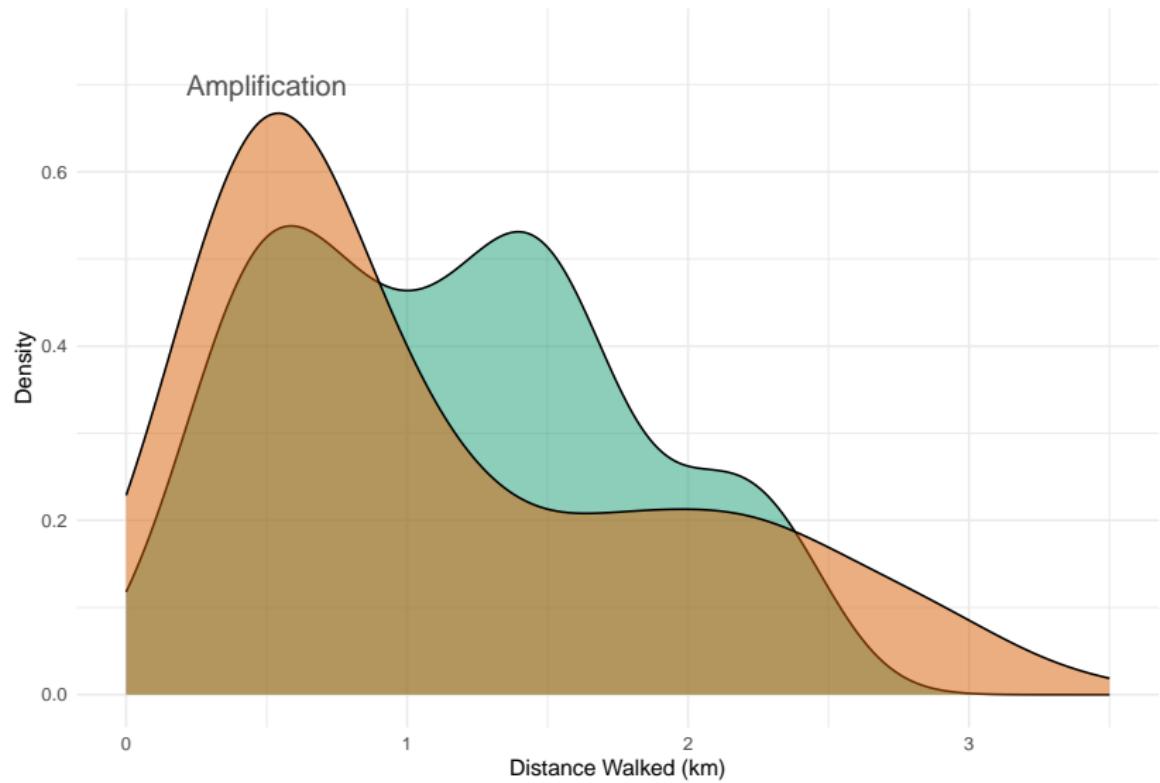


Distance to PoT - experimental allocation

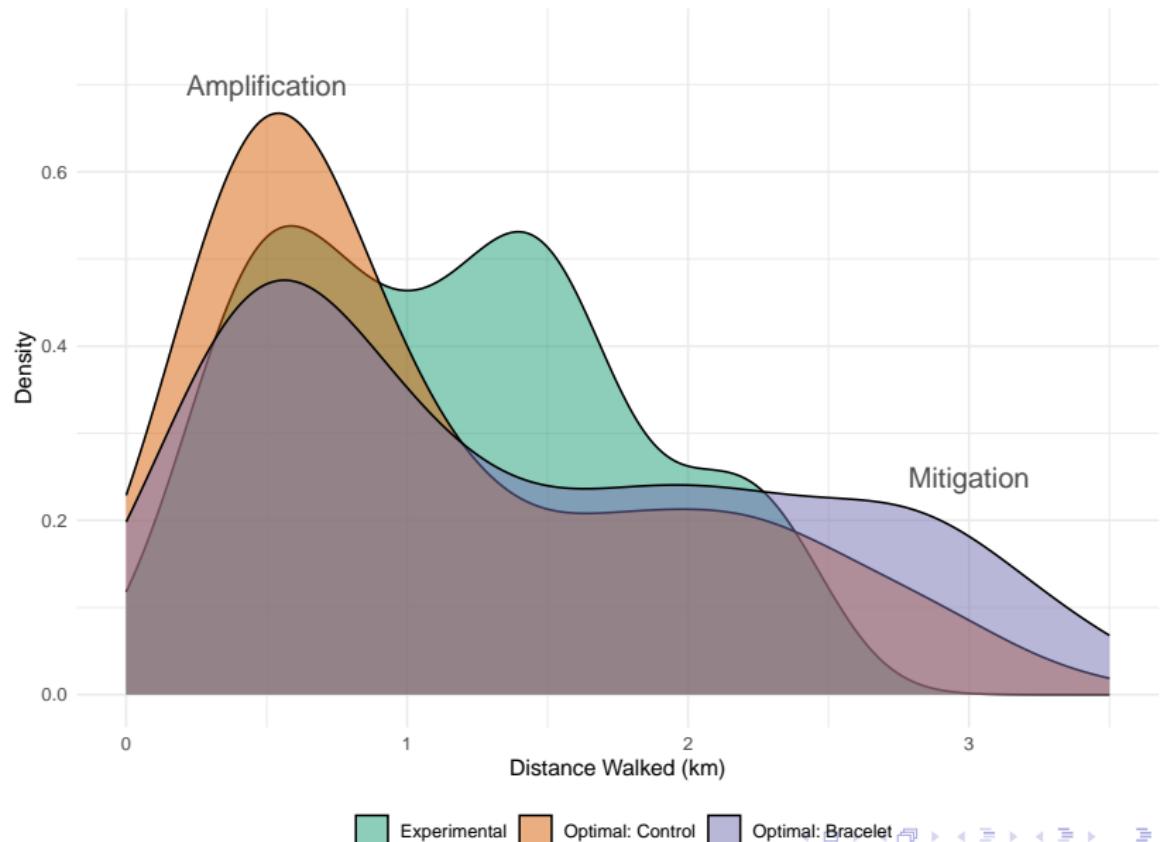


Experimental

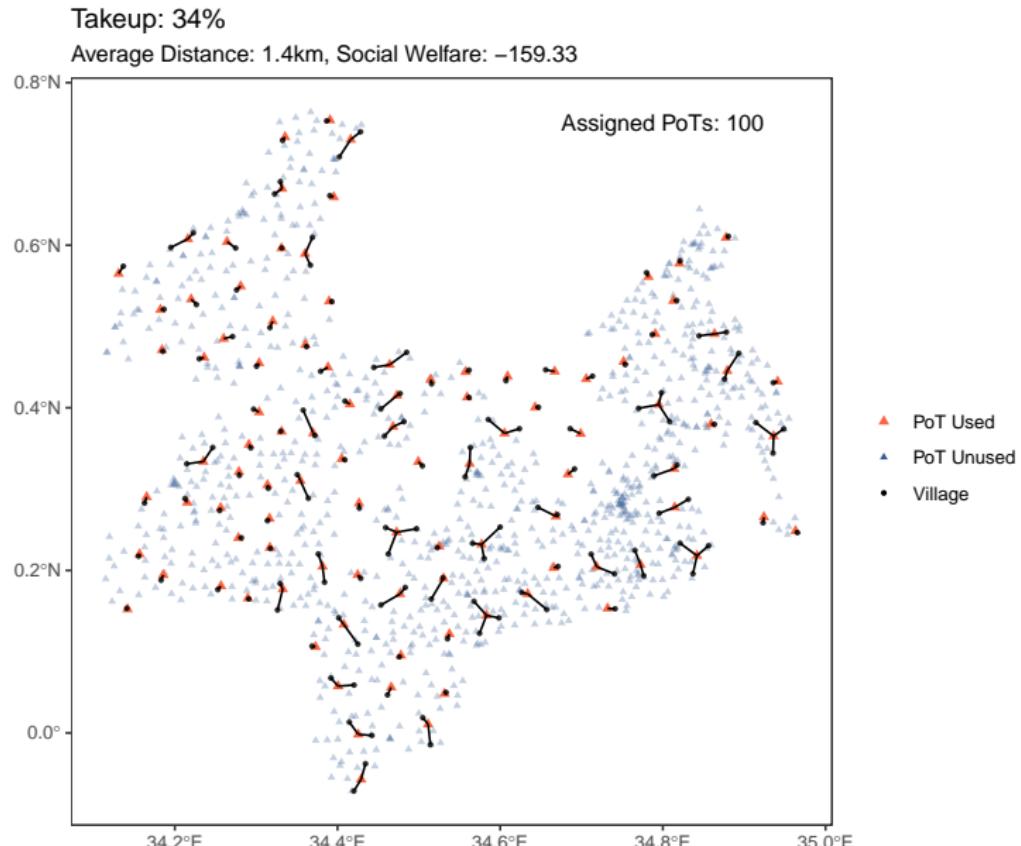
Distance to PoT - optimal allocation



Distance to PoT - optimal allocation



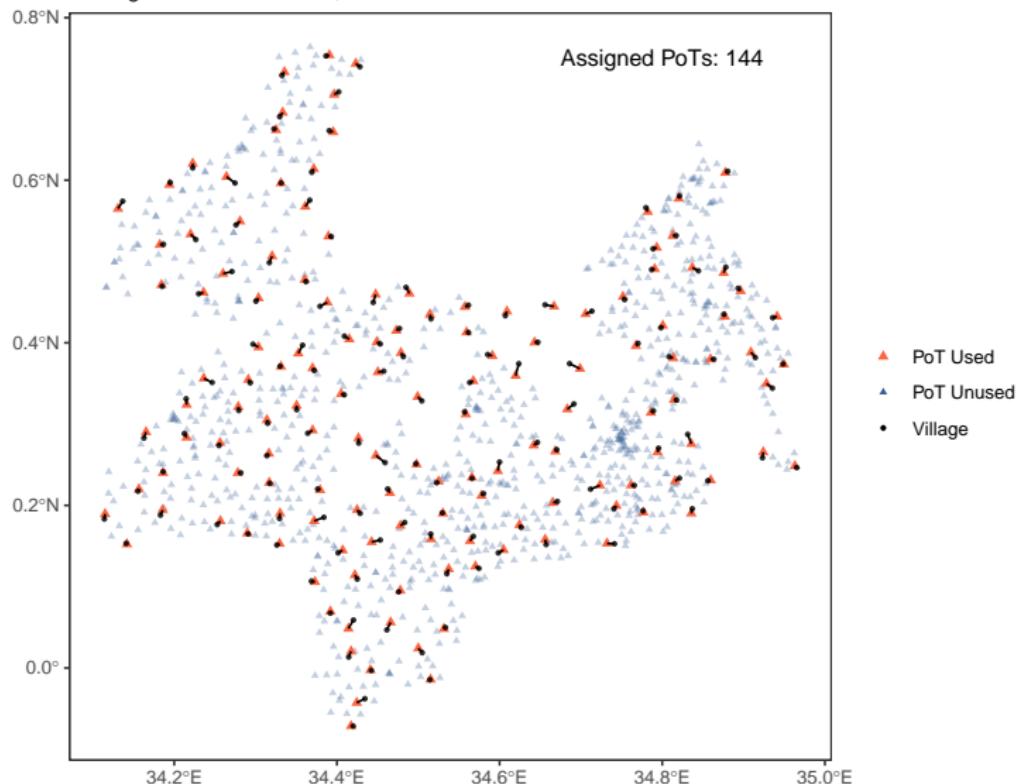
Optimal allocation - B_{control} , $\bar{R}_{\text{bracelet}, d=0.5\text{km}}$



Optimal allocation - B_{control} , $\mu = 0$

Takeup: 16.6%

Average Distance: 0.64km, Social Welfare: -260.23



Conclusion

- Significant interactions between economic and reputational incentives. Learning about these requires experimentation at scale.
- Consistent with the theory, reputational returns increase as at lower equilibrium take-up levels when actions remain highly visible. Greater uncertainty about others' action increases, can reverse these effects.
- Increases in reputational returns mitigate the negative impact of higher cost. Decreases in returns can amplify the negative impact of increases in cost.
- Deworming treatment locations can be set up further apart, with the same number of locations a larger geographic areas can be covered.

Thank you

Information campaign

1. Deworming is not only for children because everyone is at risk of being infected by worms or is infected but does not know.
2. Taking deworming tablets is like using a mosquito net to prevent Malaria or washing hands before eating to avoid diarrhea. You do not have to be sick or experience symptoms in order for you to get dewormed.
3. It is important to take deworming tablets every six 6 months to ensure that your body is always free of worms.
4. The government is providing free deworming tablets and all adults are encouraged to deworm themselves.
5. Deworming all adults will keep our community free from worms and those who do not deworm themselves shall put the entire community at risk, especially towards our children.
6. Remind your family members and neighbors to turn up for the free deworming medication on _____ at _____.
7. You will receive _____ for deworming yourself as a symbol of your passion towards improving the health of the members in your family and the community.

Jitibu minyoo: boresha afya ya jamii yako!

Saidia kuangamiza minyoo katika
jamii yako

Wapi:

Lini:

Madawa zitatorewa bure bila malipo yoyote

Serekali ya Kenya inaito matibabu dhidi ya minyoo kwa wata wa umri wa 18 zaidi

Flyer bracelet

Jitibu minyoo:
boresha afya ya jamii
yako!

Saidia kuangamiza minyoo katika
jamii yako

Wapi:

Lini:

Utapewa bangili kama zawadi



Madawa zitatolewa bure bila malipo yoyote

Serekali ya Kenya inatoa matibabu dhidi ya minyoo kwa watu wa umri wa 18 zaidi

Jitibu minyoo: boresha afya ya jamii yako!

Saidia kuangamiza minyoo katika
jamii yako

Wapi:

Lini:

Onyesha mchango wako kwa kutia
wino kidole cha gumba



Madawa zitatolewa bure bila malipo yoyote

Serekali ya Kenya inatosi matibabu dhidi ya minyoo kwa watu wa umri wa 18 zaidi

Jitibu minyoo: boresha afya ya jamii yako!

Saidia kuangamiza minyoo katika
jamii yako

Wapi:

Lini:

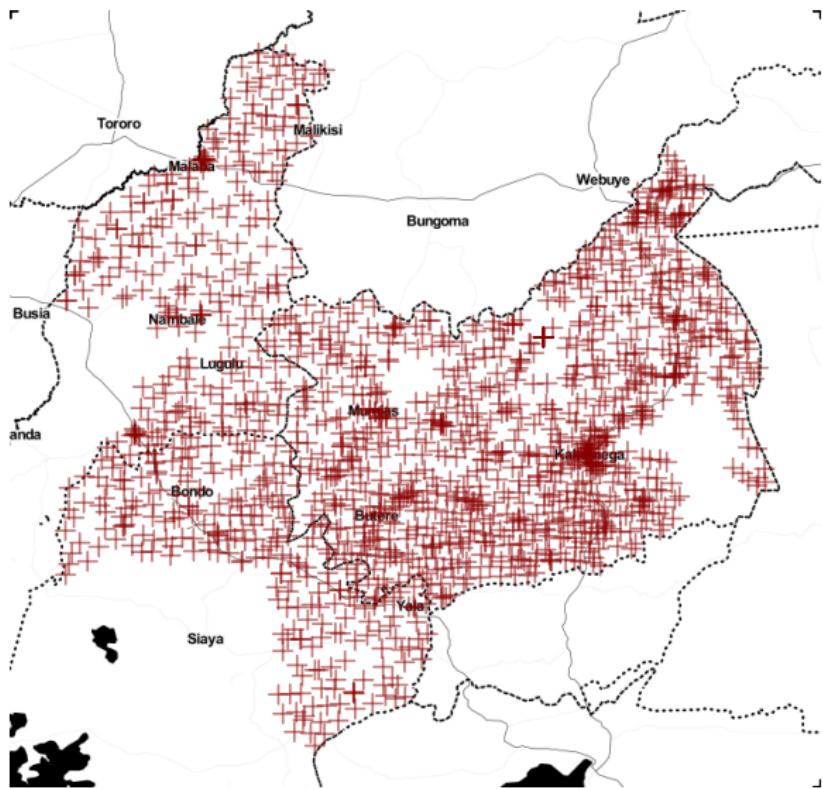
Utapewa kalenda kama zawadi



Madawa zitatolewa bure bila malipo yoyote

Serekali ya Kenya inatoa matibabu dhidi ya minyoo kwa watu wa umri wa 18 zaidi

Site selection



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First and second-order beliefs

- $Z \in \{\text{control, ink, calendar, bracelet}\}$, assigned incentive treatment.
- $D \in \mathbb{R}^+$, assigned distance to deworming location.
- $Y^{\text{rec}} \in \{0, \dots, 10\}$, number of recognized peers.
- $Y^{\text{1ord}}(z, d)$, number of recognized peers respondent has knowledge of whether they got dewormed or not,

$$Y^{\text{1ord}}(z, d) \sim \text{Binomial}(Y^{\text{rec}}, p^{\text{1ord}}))$$

$$p^{\text{1ord}}(z, d) = \text{logit}^{-1}(\alpha^{\text{1ord}} + z\beta^{\text{1ord}} + \delta^{\text{1ord}} \cdot d + d \cdot z\rho^{\text{1ord}}).$$

- $Y^{\text{2ord}}(z, d)$, number of recognized peers who have knowledge of the respondent's deworming choice,

$$Y^{\text{2ord}}(z, d) \sim \text{Binomial}(Y^{\text{rec}}, p^{\text{2ord}}))$$

$$p^{\text{2ord}}(z, d) = \text{logit}^{-1}(\alpha^{\text{2ord}} + z\beta^{\text{2ord}} + \delta^{\text{2ord}} \cdot d + d \cdot z\rho^{\text{2ord}}).$$

Back

Willingness-to-pay experiment

- $G \in \{-1, 1\}$ indicates initial gift choice.
- $M \in \{0, 10, 20, \dots, 100\}$ is the randomly assigned offer (in KSh).
- $W(m) \in \{0, 1\}$ indicates acceptance of m KSh offer.

Difference in valuation, $V^{\text{wtp}} \sim \text{Normal}(\mu^{\text{wtp}}, \sigma^{\text{wtp}})$

$$\mu^{\text{wtp}} \sim \text{Normal}(0, \tau^{\mu, \text{wtp}})$$

$$\sigma^{\text{wtp}} \sim \text{Normal}^+(0, \tau^{\sigma, \text{wtp}})$$

$$\mathcal{L} = \begin{cases} \text{P}[V^{\text{wtp}} < -m] & w = 0 \wedge g = -1 \\ \text{P}[V^{\text{wtp}} > m] & w = 0 \wedge g = 1 \\ g \cdot (\text{P}[V^{\text{wtp}} < g \cdot m] - \text{P}[V^{\text{wtp}} < 0]) & w = 1 \end{cases}$$

Back

Net reputational returns with non-structural shocks

$$\Delta[w] = E[V \mid W > w] - E[V \mid W \leq w] = \frac{-\int_{-\infty}^{\infty} v F_u(w-v) f_v(v) dv}{F_w(w)[1-F_w(w)]}$$

- Individual shocks are driven by both a structural prosocial shock, V , and a non-structural shock, U .
- In assessing the net reputational returns of deworming, individuals need to account for both shocks.

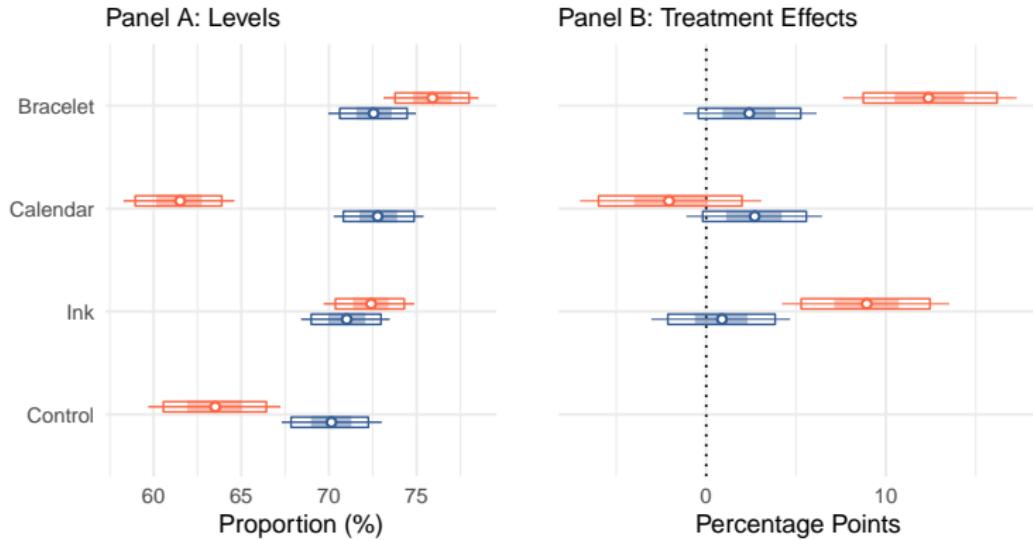
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Important model assumptions

- ① Linear distance cost d .
- ② V and U have a unimodal and symmetric distribution.
 - $V \sim \text{Normal}(0, 1)$
 - $U \sim \text{Normal}(0, \sigma_u)$
- ③ Common knowledge about
 - Distribution of prosocial types.
 - Desirability of good reputation.
 - The average private benefit/cost of deworming and incentives.

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Second-order beliefs results

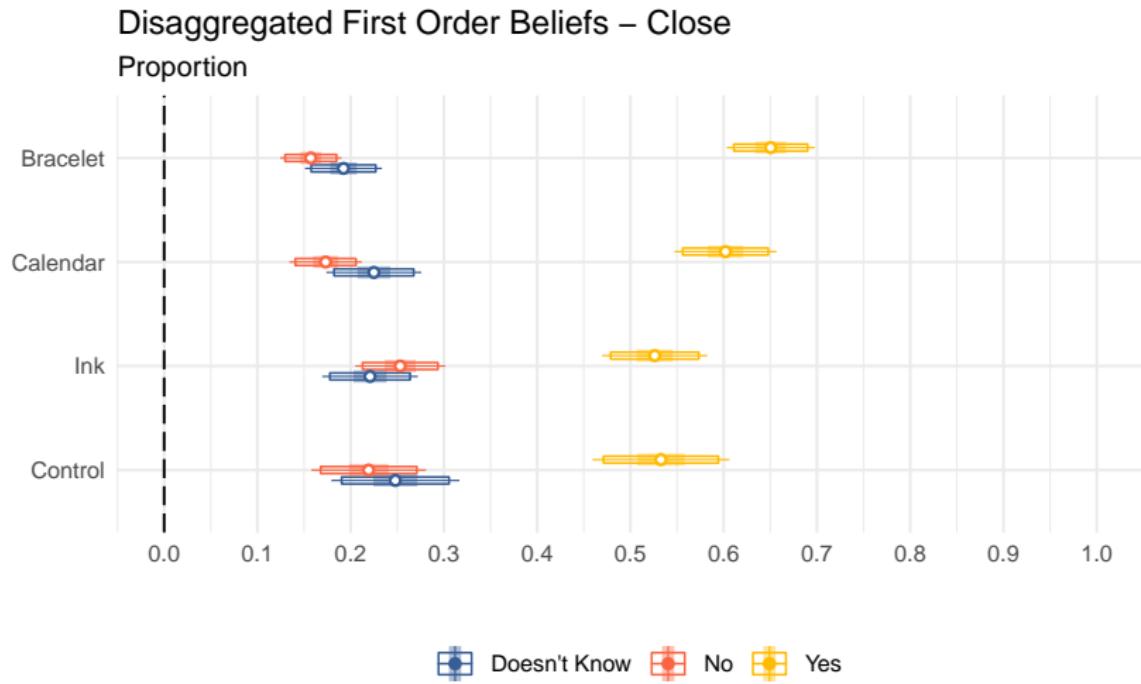


Line range: 90% credible interval.
Outer box: 80% credible interval. Inner box: 50% credible interval.
Thick vertical line: median. Point: mean.

Close Far

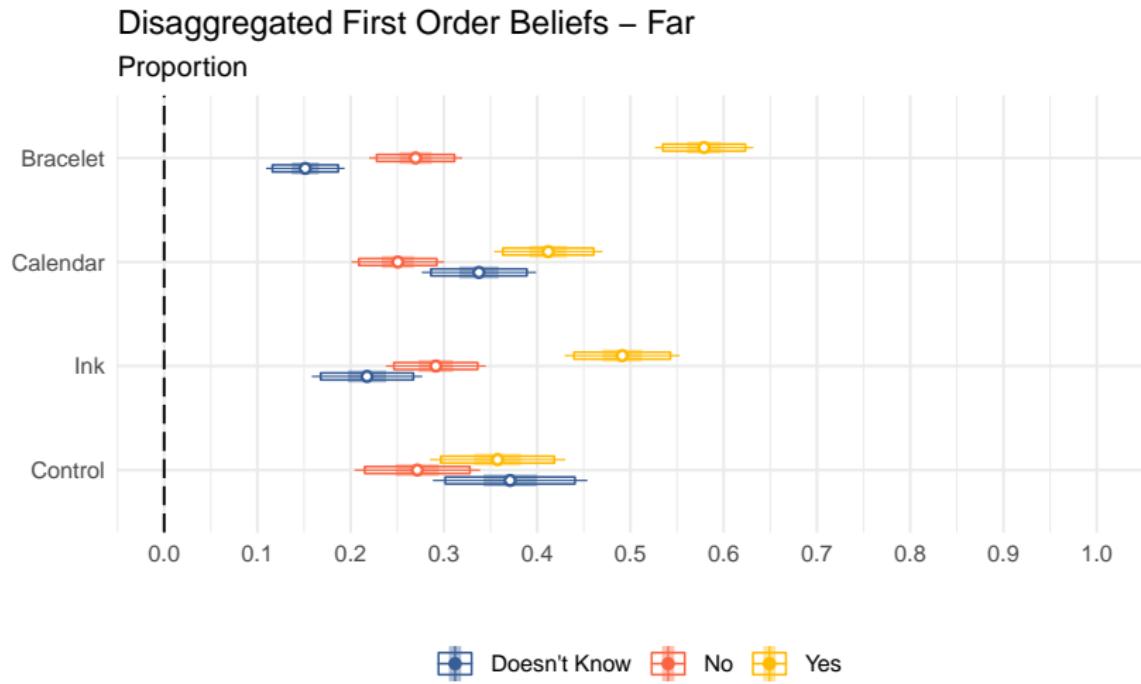
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Disaggregated first-order beliefs



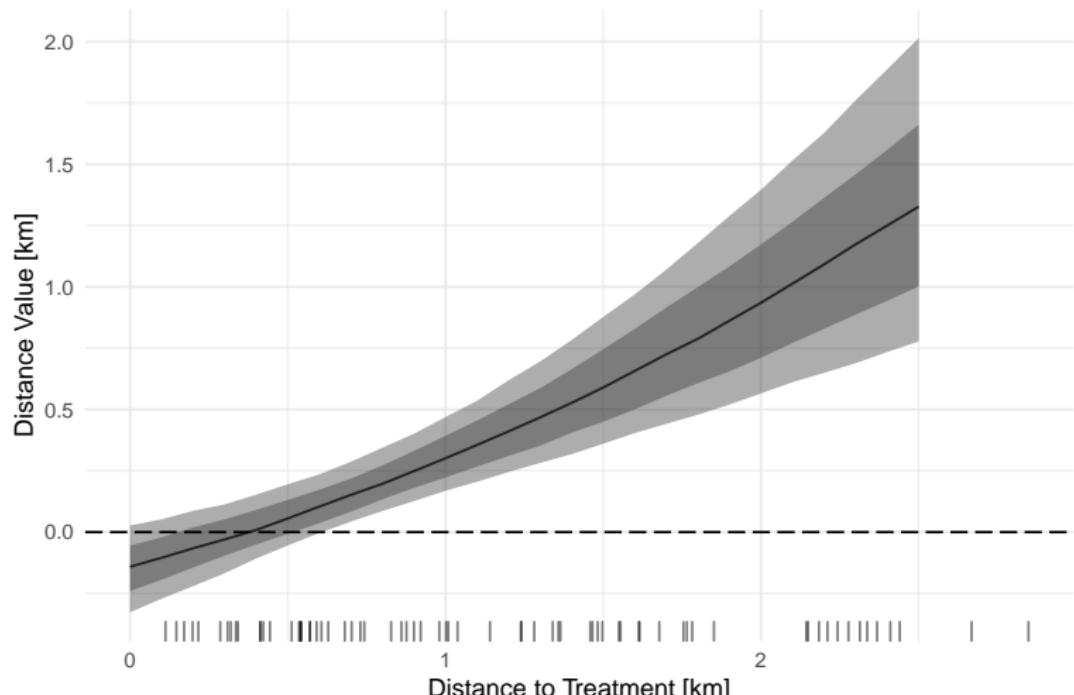
Line range: 90% confidence interval.
Outer box: 80% confidence interval. Inner box: 50% confidence interval.
Thick vertical line: mean. Point: mean.

Disaggregated first-order beliefs



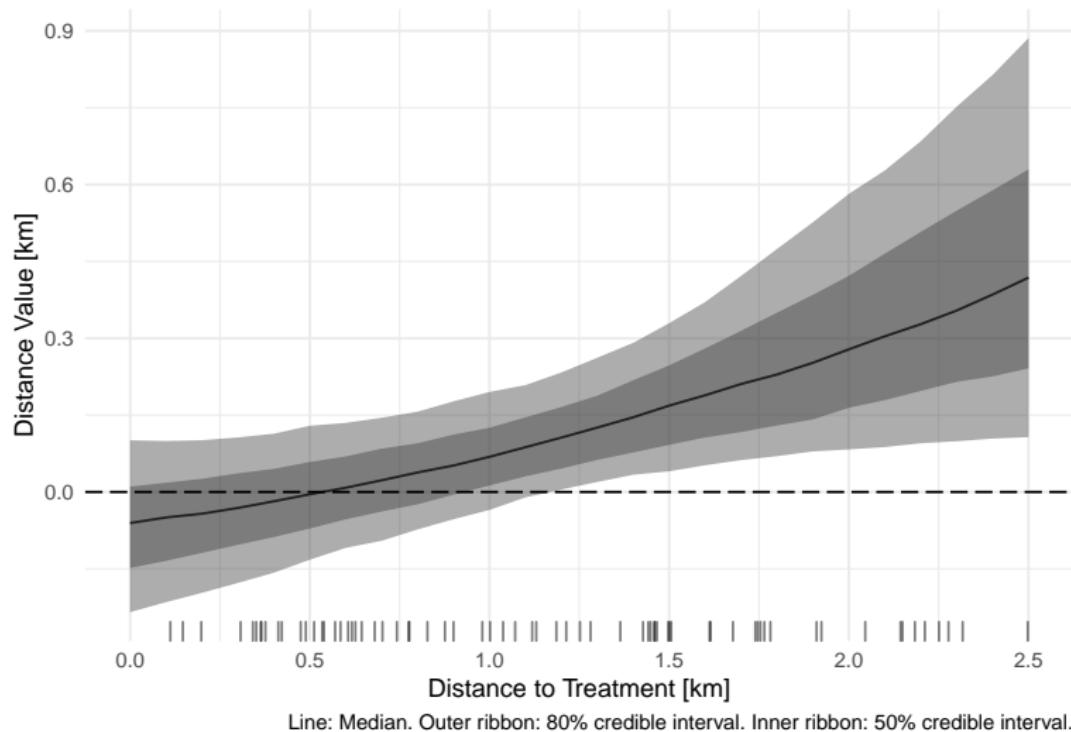
Line range: 90% confidence interval.
Outer box: 80% confidence interval. Inner box: 50% confidence interval.
Thick vertical line: mean. Point: mean.

Value of reputational return - Ink



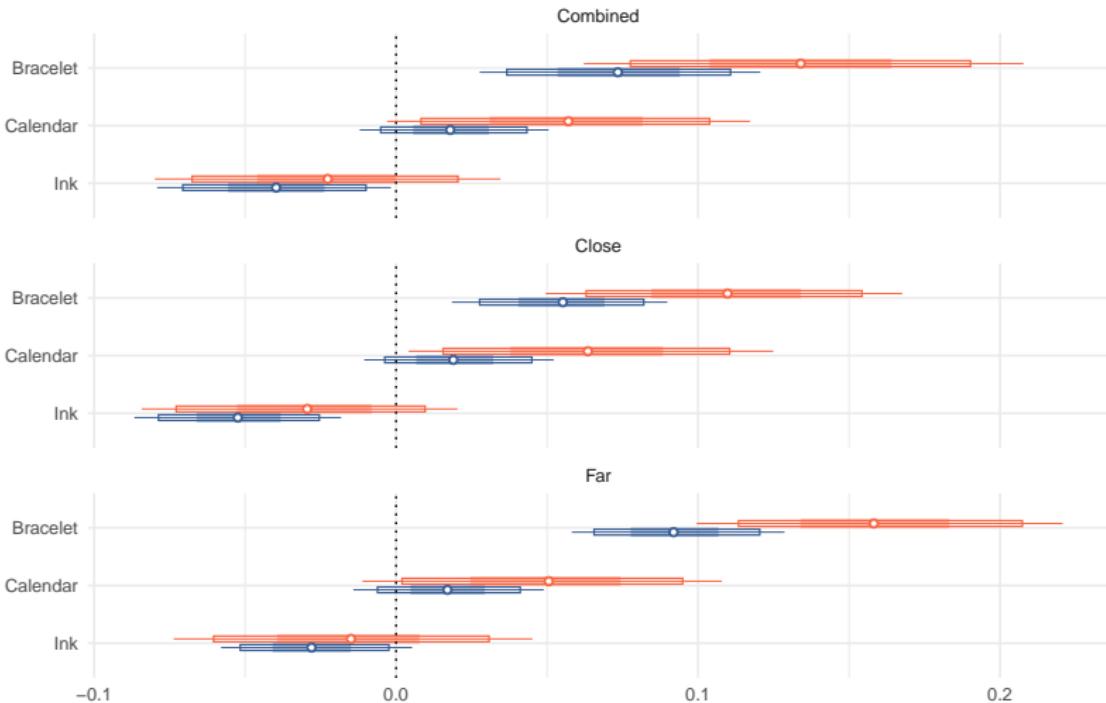
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Value of reputational return - Calendar



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Reduced form results: SMS levels

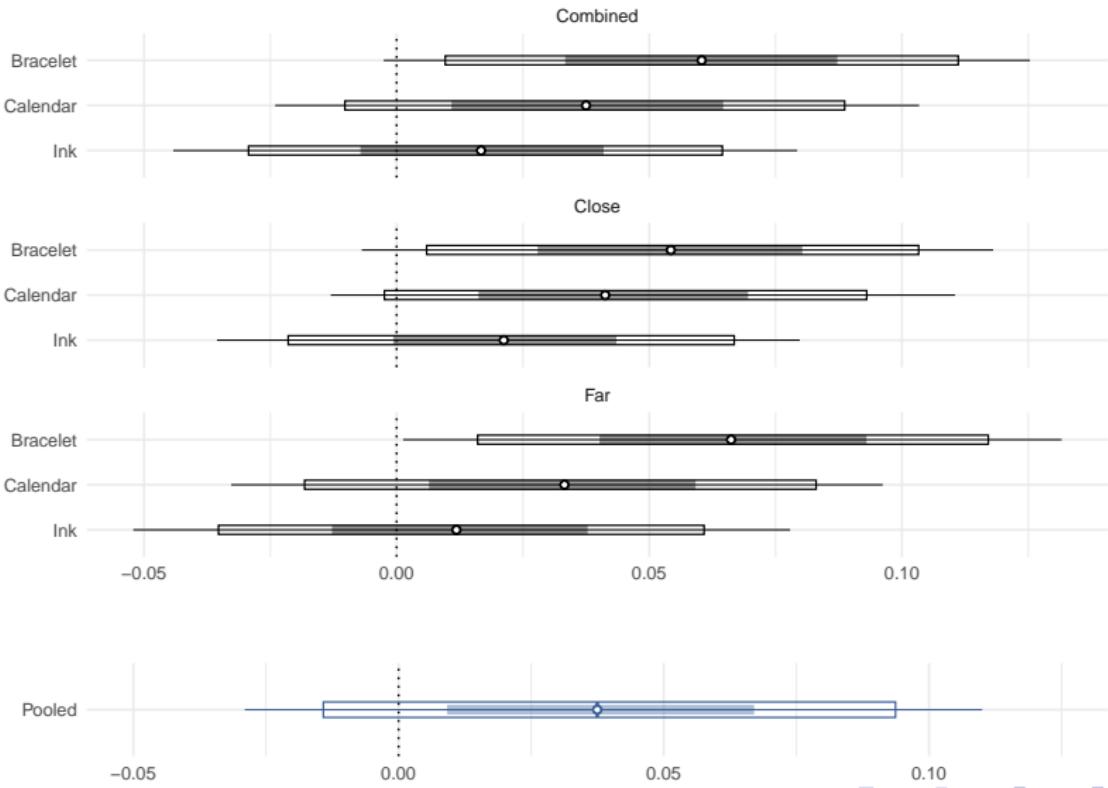


Sms Control

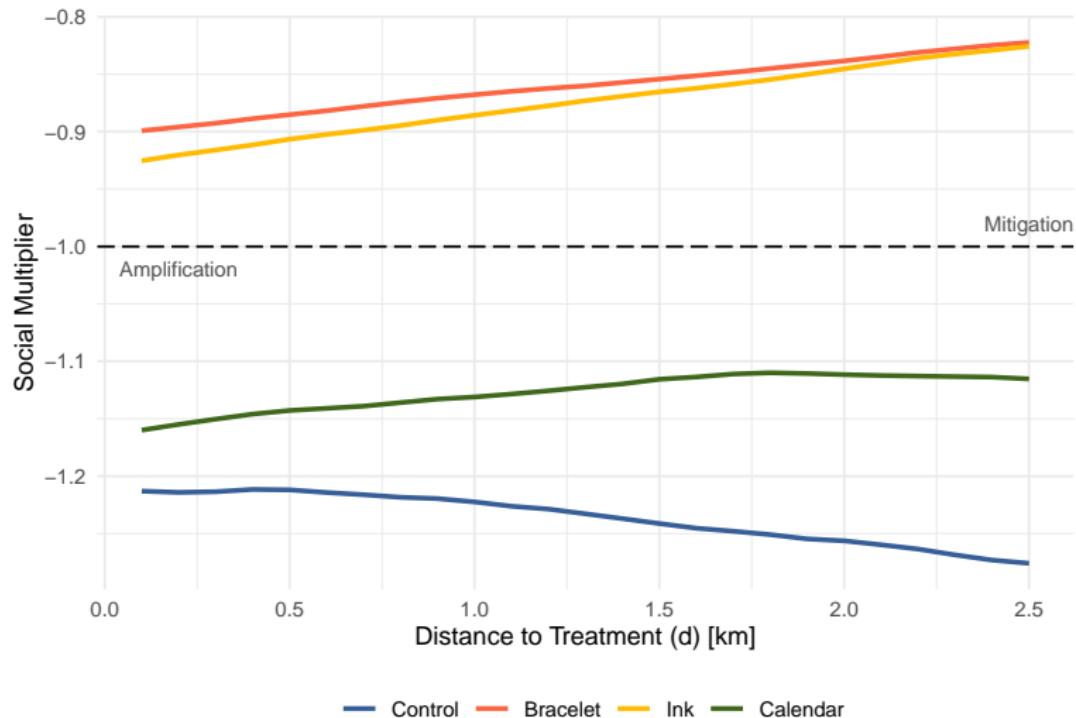


Social Info

Reduced form results: SMS ATEs



Social multiplier



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