

# Administrative checkpoints, burdens and human-centered design:

Increasing interview access to raise SNAP participation

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<sup>1</sup>Joint work with Pamela Herd (Michigan), Sebastian Jilke (Georgetown), Donald Moynihan (Michigan), and Kerry Rodden (Code for America).

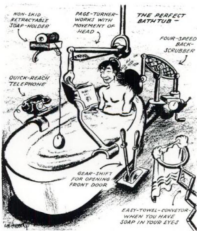
# Plan

- 1 Burdens and administrative checkpoints
- 2 The argument in brief
- 3 Human-centered design
- 4 Results
- 5 Discussions

# Policy Implementation is Unique

## IMPLEMENTATION

Jeffrey L. Pressman &amp; Aaron Wildavsky



How Great Expectations in Washington  
Are Dashed in Oakland; Or,  
Why It's Amazing that  
Federal Programs Work at All,  
This Being a Saga of the  
Economic Development Administration  
as Told by Two Sympathetic Observers  
Who Seek to Build Morals on a  
Foundation of Ruined Hopes

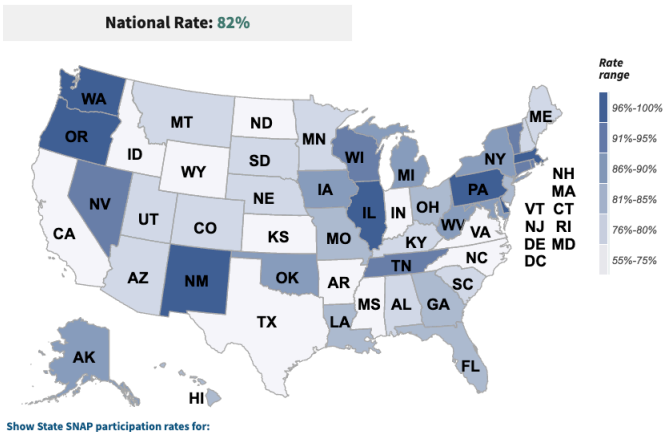
- ▶ Policy implementation is distinct from policy design.
- ▶ Policies do not end when bills become laws (Pressman and Wildavsky, 1973).

# Policy Implementation is Hard



- ▶ Take-up problem:  
Eligible people are not guaranteed to benefit from safety net programs (e.g., Medicaid, SNAP, WIC, etc).
- ▶ To do so, they must overcome administrative burdens (or barriers) (Herd and Moynihan, 2018).

## SNAP Participation Rates by State, All Eligible People (FY 2018)



**Figure 1:** SNAP participation rates by state (all eligible people)  
Source: USDA FNS (2018). Note: 41M Americans benefit from SNAP.

- ▶ *Some burdens are more consequential* than others.

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- ▶ **Administrative checkpoints:** mandatory requirements that must be satisfied in order to progress in an administrative process ([Heinrich, 2016](#); [Peeters and Widlak, 2018](#); [Sackett and Lareau, 2023](#)).



Figure 2: Airport security checkpoint



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it's still difficult to comply due to scheduling.
  - ▶ Psychological cost (**stressful**): People followed all the rules, but still did not receive benefits (= procedural denials)
  - ▶ More importantly, checkpoints reproduce inequality (big negative effects for lowest income ([Homonoff and Somerville, 2021](#)))



**Figure 3:** SNAP applicant's missed interview experience. Source: SNAP applicants forum at Reddit

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- ▶ Premise: Administrative checkpoints generate administrative burdens.

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- ▶ Premise: Administrative checkpoints generate administrative burdens.
- ▶ Research question: if these checkpoints are *flexible* and *informative / visible*, applicants may find it easier to learn and comply with the procedures and get safety net benefits.
- ▶ We<sup>2</sup> tested this hypothesis using a **field experiment** and a **follow-up survey** based on **SNAP applicants** ( $N = 1,554$ ) in Boulder, Colorado (March 22-2023).<sup>3</sup>

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- ▶ Control: traditional mailer reminder

▶ Mailer content

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- ▶ Control: traditional mailer reminder ▶ Mailer content
- ▶ Treatment: traditional mailer reminder + three text reminders ("call any time" "at your convenience")<sup>4</sup>
  - ▶ Initial message
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- ▶ Post-experiment survey shows that the text **reduced learning costs** about the interview requirement.

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- ▶ Human-centered design in policy (e.g., Biden Administration's 2023 Executive Order on Federal Customer Experience): a set of techniques to understand administrative processes from the user perspective (Norman, 2023; Herd, Moynihan and Widman, 2023; Sullivan and Soka, 2022; General Services Administration and The Lab at OPM, n.d.)

- ▶ Before the field experiment (March-May 2023), Code for America researchers made **two** field trips (urban and rural counties) to the state in July and September of 2022.

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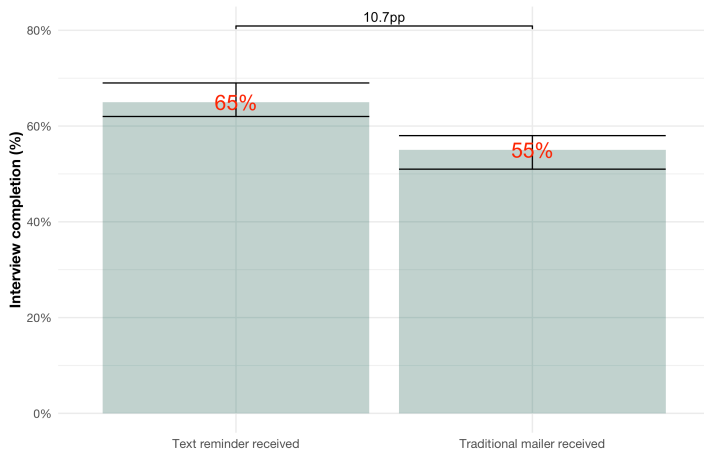
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- ▶ Identified the key pain points (administrative checkpoints are a subcategory of pain points): policy communication (causing confusion and lack of confidence)
- ▶ *Co-designed* solutions for improving communication between the county and benefit applicants

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### Effect of flexible interview option plus texting

N = 1554

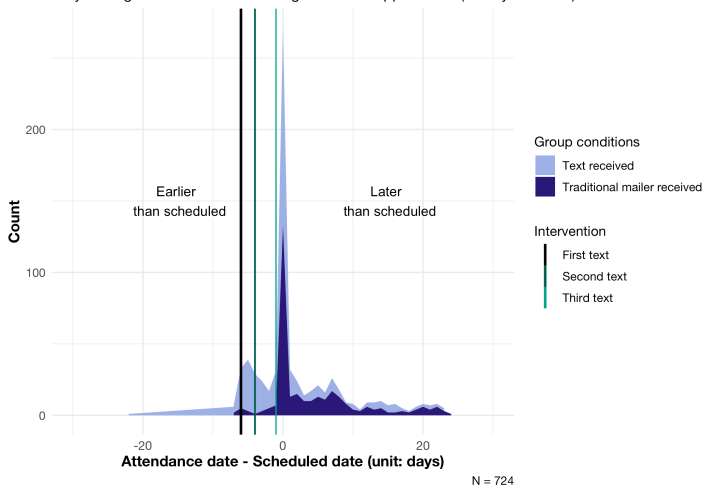


Source: Boulder county data (2023)

**Figure 4:** Effect of flexible interview option plus texting on compliance.

## Effect of flexible interview option plus texting

Only among those interviewed during their initial applications (30 days window)



**Figure 5:** Effect of flexible interview option plus texting on timing (scheduling)

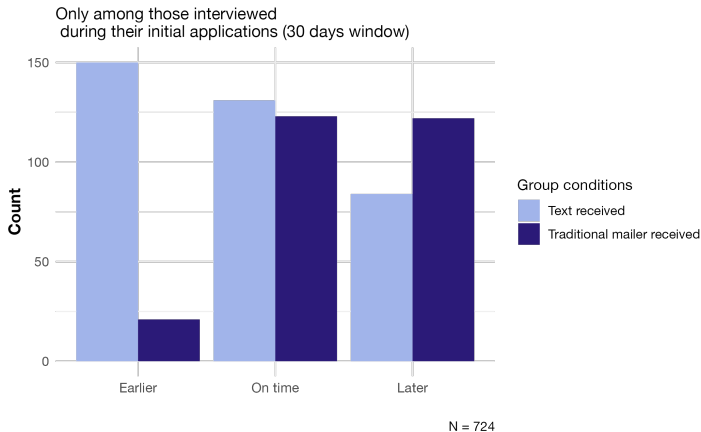


Figure 6: The distribution of SNAP applicants' interview timing

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- ▶ The combination of behavioral (field experiment) and attitudinal evidence (follow-up survey) demonstrates that making administrative checkpoints flexible and informative reduces administrative burden. [▶ Benefit approval table](#), [▶ Heterogenous treatment effect summary](#), [▶ Learning cost \(survey\) table](#)

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- ▶ Treated group was more likely to say they (a) knew the interview was required by 9 pp and (b) they knew what to do during the interview by 11 pp.

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- ▶ Fact: on average, most nudges are not so effective ([DellaVigna and Linos, 2022](#)).
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- ▶ Yet: some nudges are effective due to these contexts and design choices ([Giannella et al., 2024](#); [Chohlas-Wood et al., 2023](#); [Lopoo et al., 2020](#))

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    - ▶ Nonetheless, Boulder is not a representative case (more resourceful and motivated than other places).
    - ▶ Texting is cheap, but research investment (human-centered design and rigorous evaluation) is not cheap.

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- Theoretical/practical: All burdens are not equal. If we can't remove checkpoints, we can make them at least flexible and visible.
- Methodological/empirical: Integrating quantitative and qualitative insights by listening first, co-designing research, and building evidence
- Normative: Strengthening capacity and improving practice can solve real problems and generate positive social impacts (accountability and responsiveness)

# Thank you

Comments or questions?  
E-mail: [jkim638@jhu.edu](mailto:jkim638@jhu.edu)

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# Plan

## 6 Appendix

# County mailer content

Dear \_\_\_\_\_,

We have received your application or recertification for assistance. An interview is required for \_\_\_\_\_ (program) \_\_\_\_\_.

You have been scheduled for a phone interview at (time) \_\_\_\_\_ on (date) \_\_\_\_\_. Please call (303) 441-1660 at this time.

Please contact our office at (303) 441-1000 if you like a face-to-face interview instead of a phone interview.

If you miss your appointment or need to reschedule, you must contact us at (303) 441-1660 to reschedule your interview. If you do not complete a required interview for your application or recertification, your benefits will be denied.

# Text reminders

In the text below, Code for America and Boulder couldn't mention SNAP specifically, but instead used PEAK, a broader term, to comply with the FCC guideline on telephone consumer protection (TCP), particularly in the context of human and health services.

# Initial text (sent 24 hours after initial application)

Boulder County:Hi First Name we've processed your PEAK application!

Please call 303-441-1660 in the next week to complete a phone interview. The interview should take about 30 minutes and you'll learn if you qualify for benefits.

Our hours: 8:30am-3pm, Mon-Fri

Learn more about the process here:

<http://www.boco.org/SNAP-FAQ>

# First reminder (sent 3 days after initial application)

Boulder County: Hi First Name reminder that you have the option to complete your interview at your own convenience by calling 303-441-1660 any time between 8:30am-3pm, Mon-Fri.

Learn more about the process here:

[www.boco.org/SNAP-FAQ](http://www.boco.org/SNAP-FAQ)

## Second reminder (24 hours before scheduled interview)

Hi First Name , your PEAK phone interview is tomorrow. This should take about 30 minutes. Call us at 303-441-1660 during your scheduled time to complete your interview.

Can't make it? Just call anytime Monday through Friday between 8:30am-3pm to conduct an unscheduled interview.

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# Impact on Benefit Approvals

	Approved	Approved (procedural denials imputed)	Approved during initial applications (procedural denials imputed)
(Intercept)	0.3399*** [0.3057, 0.3741] $p = 0.0000$	0.3355*** [0.3016, 0.3694] $p = 0.0000$	0.2121*** [0.1819, 0.2423] $p = 0.0000$
Treatment status	0.0631* [0.0145, 0.1116] $p = 0.0110$	0.0643** [0.0160, 0.1125] $p = 0.0091$	0.0691** [0.0262, 0.1121] $p = 0.0016$
Num.Obs.	1517	1533	1539
R2	0.004	0.004	0.006
R2 Adj.	0.004	0.004	0.006
AIC	2097.3	2112.4	1771.8
BIC	2113.3	2128.4	1787.8
Log.Lik.	-1045.647	-1053.200	-882.891
RMSE	0.48	0.48	0.43
Std.Errors	HC2	HC2	HC2

# Interview Impact on Benefits Among Compliers

	<b>Approved</b>	<b>Approved (procedural denials imputed)</b>	<b>Approved during initial applications (procedural denials imputed)</b>
(Intercept)	0.0016 [−0.2542, 0.2574] $p = 0.9899$	0.0016 [−0.2443, 0.2474] $p = 0.9899$	−0.1533 [−0.4143, 0.1077] $p = 0.2495$
Interview status	0.6146** [0.1892, 1.0400] $p = 0.0047$	0.6147** [0.2014, 1.0279] $p = 0.0036$	0.6693** [0.2322, 1.1065] $p = 0.0027$
Num.Obs.	1517	1533	1536
R2	0.197	0.202	−0.066
R2 Adj.	0.197	0.201	−0.067

# Impact on Learning Costs

	<b>Know interview</b>	<b>Interview easy (4-point)</b>	<b>Interview easy (binary)</b>	<b>Learning cost index</b>
(Intercept)	0.5171*** [0.4528, 0.5814] $p = 0.0000$	0.4116*** [0.3540, 0.4692] $p = 0.0000$	0.4087*** [0.3180, 0.4994] $p = 0.0000$	0.4362*** [0.3699, 0.5026] $p = 0.0000$
Treatment status	0.0931* [0.0034, 0.1828] $p = 0.0420$	0.1096* [0.0220, 0.1972] $p = 0.0144$	0.1277+ [-0.0031, 0.2584] $p = 0.0556$	0.1335** [0.0370, 0.2299] $p = 0.0069$
Num.Obs.	470	225	225	225
R2	0.009	0.027	0.016	0.032

# Heterogeneous treatment effects

- ▶ The estimand is ITT since we only know who received the texts, not who read them.
- ▶ To estimate heterogeneous treatment effects, we also estimated the ITT conditional on applicants' language preference, gender, homeless status, and household size.
- ▶ ATEs do not reliably vary by language, gender, and homeless status.
- ▶ ATEs vary by household size. Applicants with a larger household who received the treatment show up for the interview at a lower rate than their counterparts ([Finkelstein and Notowidigdo, 2019](#)).