# Running web-based experiments

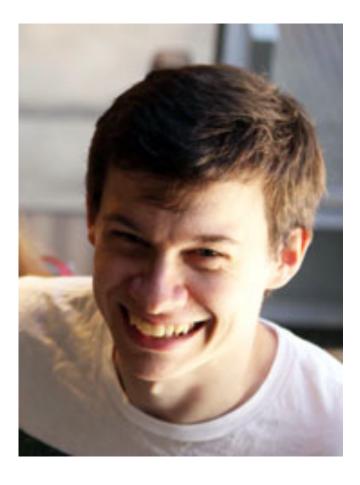
Judith Degen & Sebastian Schuster LSA 2021 minicourse Jan 7, 2021

- 1 9:00-10:30: Introduction
  - How do crowd-sourced experiments work?
  - What kinds of experiments can be run online?
  - Example study
  - Using GitHub for research projects
  - Preregistration and open science
- 2 10:30-10:40: Break
- 3 10:40-12:30: Tutorials
  - Git and GitHub
  - Modifying an existing experiment
  - Preregistering an experiment
- 4 12:30-1:00: Lunch break
- 5 1:00-2:00: Tutorials (continued)
  - Posting the experiment
  - Testing the experiment
  - Downloading and visualizing the data
- 6 2:00-2:15 Final discussion and Q&A

### Overview/schedule



Judith Degen jdegen@stanford.edu



Sebastian Schuster schuster@nyu.edu

#### Mini course website:

https://sebschu.github.io/lsa-web-based-experiments/

## Why run web-based experiments?

- more efficient data collection than in the lab
  - faster
  - cheaper
- larger & more diverse participant population (not just college undergrads)

Buhrmester et al 2011

• ...the pandemic

#### Concerns about web-based experimentation

participants don't pay attention over the web

attention checks

no control over participant population

demographic parameters, "qualifications"

data is noisy

many classic findings have replicated remedies

difficult to learn

that's why we're here!

too many tools/choices

don't know how to code

...additional concerns?

#### How do crowd-sourced experiments work?

## How do web-based experiments work?

GitHub pages, your university web space

Tink experiment to platform via URL for automated participant recruitment



server

you put the experiment on the web so it's accessible through a URL

you could have participants take experiment directly by sharing URL with them

...how do you get people to take your experiment?

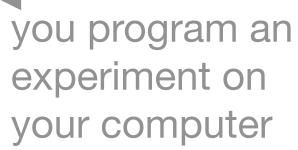
experiment on your computer

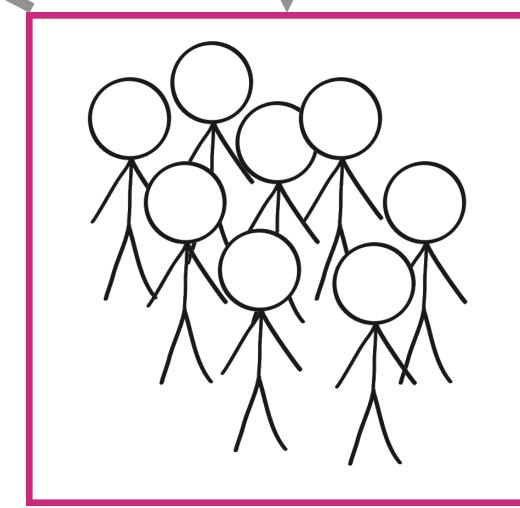


download collected data for ana ysis

crowd workers sign up to work on tasks and get paid through platform







crowd workers, aka participants

s that some of them have gotten higher s that some, but not all of them have gotten higher rilar is the statement in blue (with 'but not all') to the statement in red (without 'but not all')? The blue sentence sounds strange:  $\Box$ Continue

experiment

you & your computer

## Workflow

		S	tep	Tool	Time
1.	creat	Name  ▼ manuscript  ► revision 2018	Date Modi  24. Mar 2  analysis		mins
2.	progi	▶	o 19. Sep 20  o 12. Aug 20  12. Aug 20  h models	HTML EZZ	hrs
3.	put e	manuscript_10_08.pdf manuscript_10_08.docx		scp/GitHub pages/	secs + mins
4.	prere	manuscript_04_08_2.docx manuscript_04_08.docx manuscript_03_08.docx	<ul> <li>4. Aug 20</li> <li>4. Aug 20</li> <li>3. Aug 20</li> </ul>	SF	mins-hrs
5.	link e	manuscript_02_08.docx manuscript_29_07.pdf manuscript_29_07.docx manuscript_07_03.pdf	30. Jul 20 30. Jul 20 30. Jul 20 .gain in Sandbox	<u>proliferate/</u> submiterator/	secs + mins
6.	run e	manuscript_07_03.docx  squid_barplots modeling_N400	7. Mar 20' 25. Feb 21 21. Nov 21	amazon mechanical turk	hrs to days
7.	dowr	<ul> <li>amlap_2017</li> <li>schedules</li> <li>amlap_2016</li> </ul>	<ul> <li>10. Aug 20</li> <li>4. Aug 20</li> <li>24. May 2</li> </ul>	proliferate/ submiterator/	secs
8.	pre-p	CoCoLab_slides  behav_all_squid4.txt	<ul> <li>16. Apr 20</li> <li>3. Apr 201</li> </ul>	R	hrs
9.	puk	▶ squid_3_data ▶ SFB-Poster	<ul> <li>23. Mar 2</li> <li>17. Mar 20</li> </ul>		

#### What kinds of experiments can you run?

- categorical or continuous choices (eg truth-value judgment, acceptability)
- response time measures (eg self-paced reading, timed lexical decision)
- free-form input (eg for written production)
- spoken and signed production (possible but requires more setup)
- mouse-tracking
- even basic eye-tracking (example here: https://github.com/leylakursat/cohort\_webgazer)

#### What kinds of experiments can't/shouldn't you run?

- brain imaging (EEG, MEG, fMRI)
- psychophysical studies requiring very temporally controlled stimulus presentation
- unclear: more complex eye-tracking setups thus far not validated
- unclear: special populatios (for children see <a href="https://lookit.mit.edu/">https://lookit.mit.edu/</a>)

# Choices, choices

# Platforms Peer et al 2017

- Amazon's Mechanical Turk (US-based)
  - large population of workers (~500,000, mostly US-based)
  - diverse, but nevertheless biased

"workers are diverse but not representative of the populations they are drawn from, reflecting that Internet users differ systematically from non-Internet users. Workers tend to be younger (about 30 years old), overeducated, underemployed, less religious, and more liberal than the general population. Within the United States, Asians are overrepresented and Blacks and Hispanics are underrepresented relative to the population as a whole"

Paolacci & Chandler 2014

- many bots and bot-like workers
- Prolific Academic (UK-based) today
  - smaller than MTurk
  - higher data quality
  - more linguistic diversity
- Others: TurkPrime, Daemo, Finding Five

# Experimental frameworks

- Stanford framework today
- <u>psiTurk</u> maintained by Todd Gureckis
- <u>jsPsych</u> maintained by Josh de Leeuw
- <u>magpie</u> maintained by Michael Franke

## Tips and tricks, experimental setup

#### For participants' sake:

- in experiment:
  - always include consent/legal info
  - include thorough but concise instruct
  - include a progress bar (lowers dropo
- on platform:
  - give your study a straightforward nar
  - include keywords that make it easy to study communication stanford fun co



#### InterActive Language Processing Lab at Stanford

In the following experiment, you'll see a series of visual scenes and be asked to complete sentences about them. The HIT should take around 5-6 minutes. Please pay attention, and answer carefully.

Thank you!

Continue

#### LEGAL INFORMATION:

We invite you to participate in a research study on language production and comprehension. Your experimenter will ask you to do a linguistic task such as reading sentences or words, naming pictures or describing scenes, making up sentences of your own, or participating in a simple language game.

There are no risks or benefits of any kind involved in this study.

You will be paid for your participation at the posted rate.

If you have read this form and have decided to participate in this experiment, please understand your participation is voluntary and you have the right to withdraw your consent or discontinue participation at any time without penalty or loss of benefits to which you are otherwise entitled. You have the right to refuse to do particular tasks. Your individual privacy will be maintained in all published and written data resulting from the study. You may print this form for your records.

#### CONTACT INFORMATION:

If you have any questions, concerns or complaints about this research study, its procedures, risks and benefits, you should contact the Protocol Director Meghan Sumner (650) 723-4284.

If you are not satisfied with how this study is being conducted, or if you have any concerns, complaints, or general questions about the research or your rights as a participant, please contact the Stanford Institutional Review Board (IRB) to speak to someone independent of the research team at (650)-723-2480 or toll free at 1-866-680-2906. You can also write to the Stanford IRB, Stanford University, 3000 El Camino Real, Five Palo Alto Square, 4th Floor, Palo Alto, CA 94306 USA.

If you agree to participate, please proceed to the study tasks.

## Tips and tricks, experimental setup

#### For your sake:

- in experiment:
  - to improve data quality:
    - include attention checks (eg, control trials with expected outcome)
    - include functionality to prevent experiment being taken repeatedly (UniqueTurker)
    - include functionality to identify bots/prevent them from taking experiment (eg, reCaptcha)
  - to not kick yourself later
    - always err on the side of recording too much rather than too little information
- on platform, to improve data quality
  - set participation parameters (eg, native language, percentage of previous work approved (>98%), participant location)

## Tips and tricks, execution

- to improve data quality:
  - pay fairly (poorly paid studies -> unreliable data) Buhrmester et al 2018
  - run studies on weekdays, in the morning
- to prevent worker frustration:
  - monitor email while experiment is running
  - Turkers communicate sign up for Turkernation and/or Turkopticon account

Example study: variability and context-dependence of scalar inferences

#### Scalar implicatures in the wild

Degen 2015

- 1. I like some country music.
  - Inference? I like some, but not all, country music
- 2. It would certainly help them to appreciate **some** of the things we have here.
  - Inference? ... to appreciate some, but not all...
- 3. You sound like you have **some small ones** in the background.
  - Inference? ... some, but not all small ones...

### Combining corpora & the web

- 1. extracted all 1390 utterances containing *some* from the Switchboard corpus of spoken American English
- 2. collected inference strength ratings for each item on Mechanical Turk (10 judgments per item)

Speaker A: i mean, they just have beautiful, beautiful homes and they have everything. the kids only wear name brand things to school and it's one of these things,

Speaker B: oh me. well that makes it hard for you, doesn't it.

Speaker A: well it does, you know. it really does because i'm a single mom and i have a thirteen year old now and uh, you know, it does.

Speaker B: oh, me.

Speaker A: i mean, we do it to a point but uh, not to where she feels different,

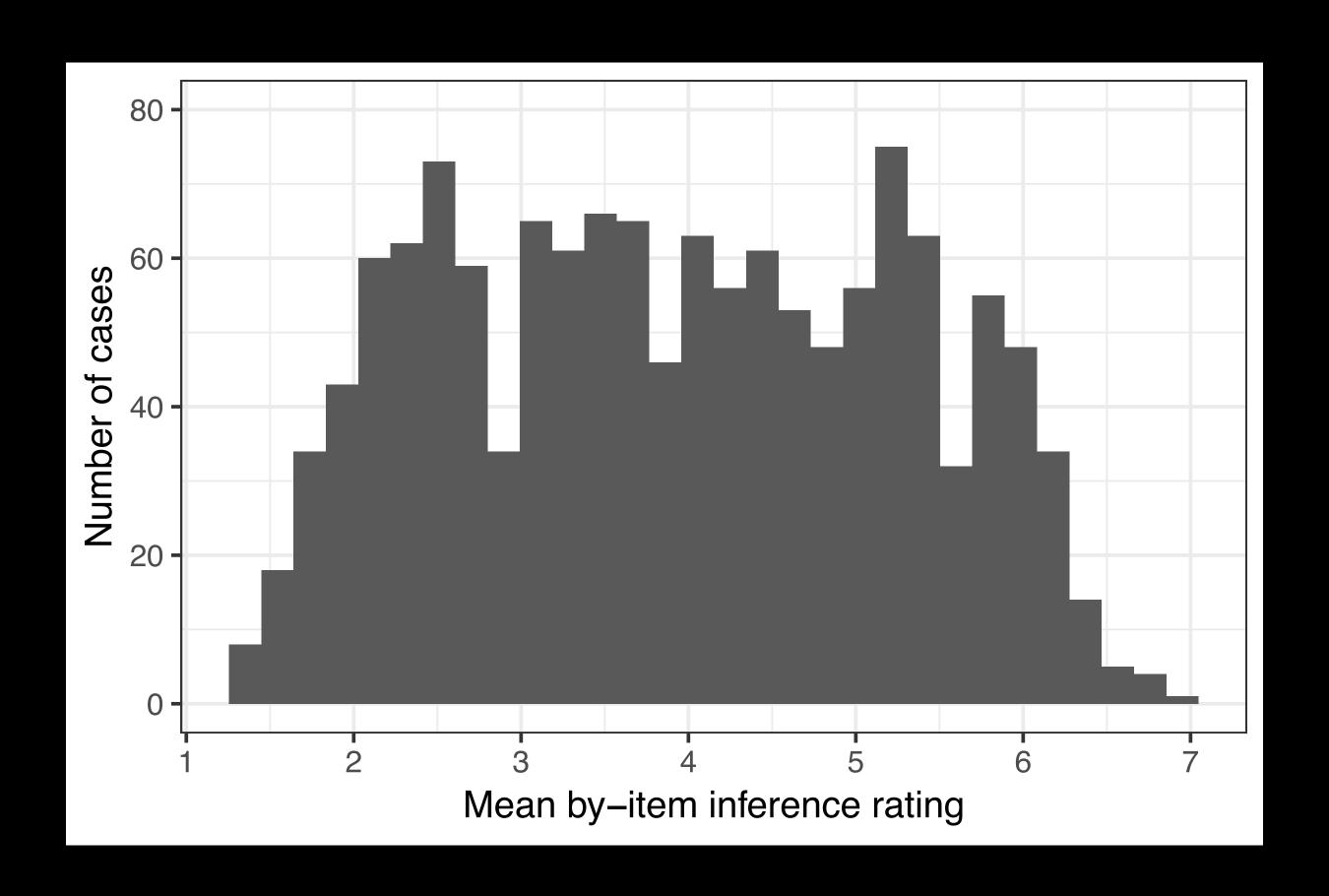
Speaker B: yeah.

Speaker A: but some of them are very rich

# but some, but not all of them are very rich How similar is the statement with 'some, but not all' (green) to the statement with 'some' (red)? Very different meaning 1 2 3 4 5 6 7

Continue

#### Variability in inference strength



large amount of variability in inference strength

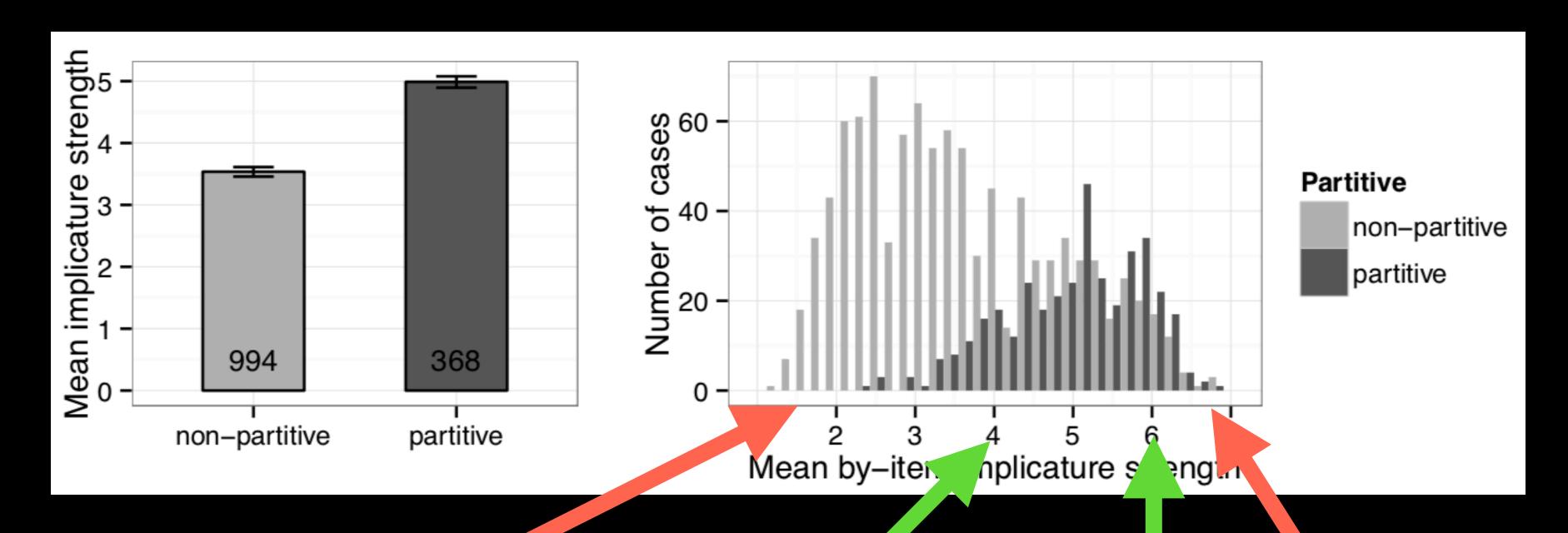
# Just noise?

#### Qualitative investigation

- 1. I like some country music.
- 6.9 Inference? I like some, but not all, country music
- 2. It would certainly help them to appreciate **some** of the things we have here.
- 4 Inference? ...to appreciate some, but not all...
- 3. You sound like you have **some small ones** in the background.
- 1.5 Inference? ... some, but not all small ones...

# Stronger inferences...

...with partitive some-NPs.



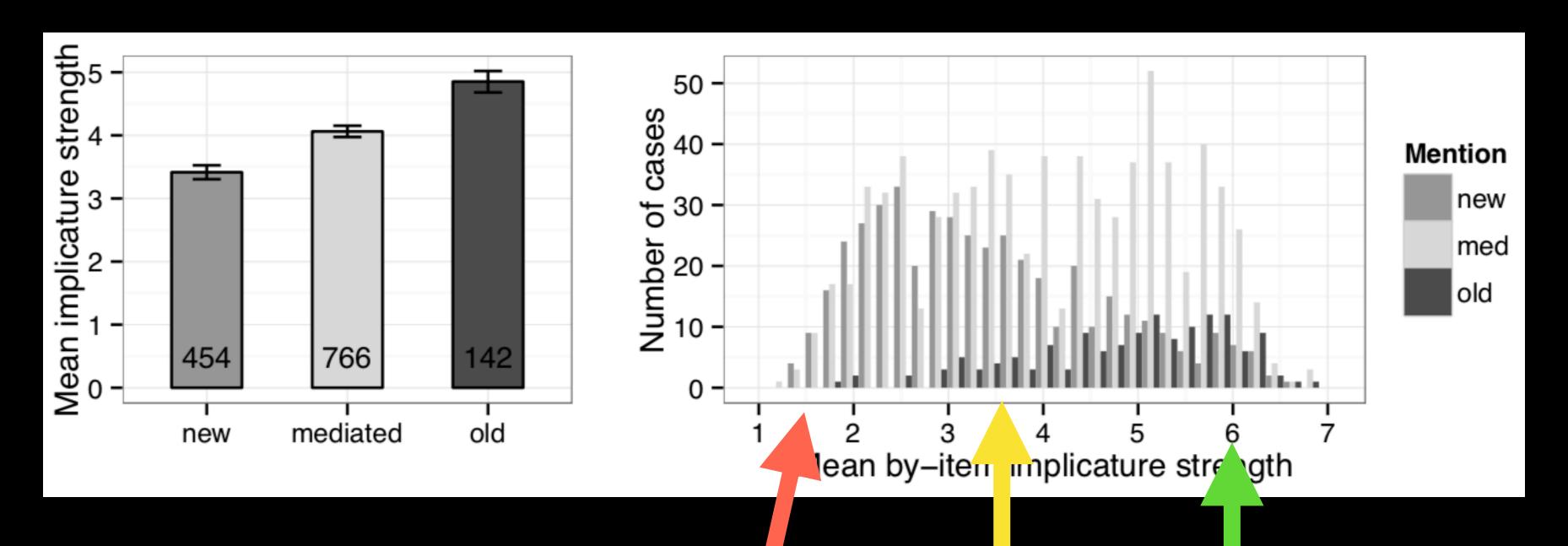
I've seen some of them on repeat

It would certainly help them to appreciate some of the things we have here.

You sound like you have **some small** I like **some country music. ones** in the background.

# Stronger inferences...

...with previously mentioned NP referents.



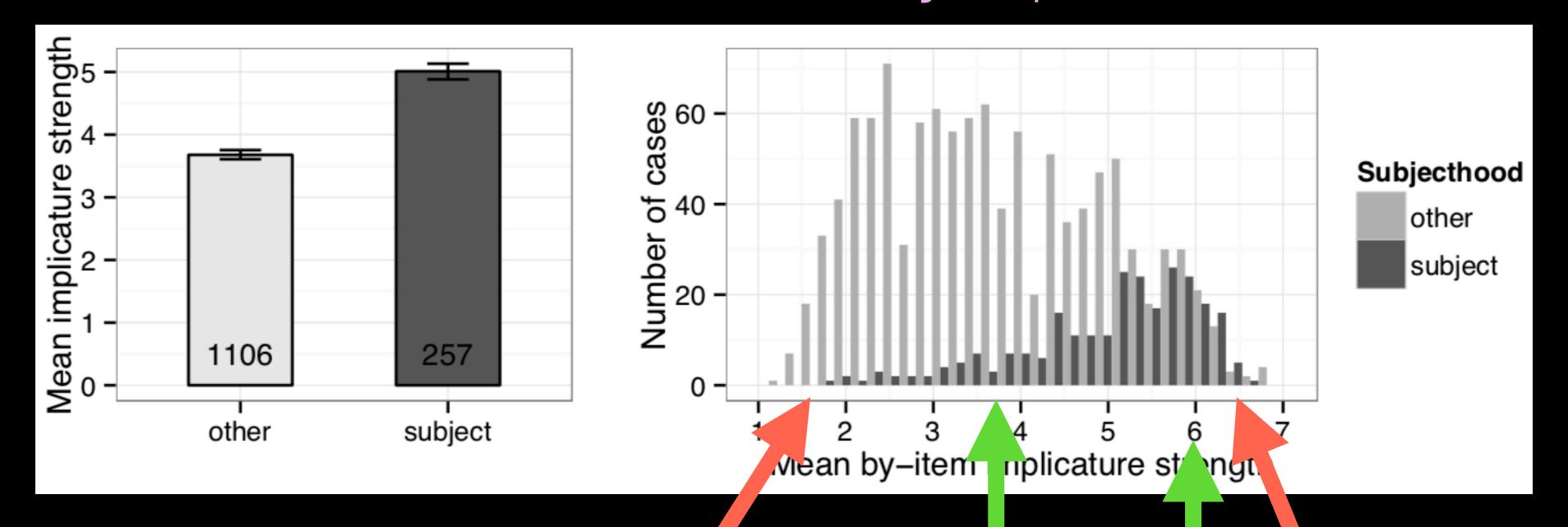
I've seen some of them on repeats

We've got some beets.

That would take some planning.

# Stronger inferences...

...with some-NPs in subject position.



**Some kids** a e really having it.

Occasionally, **some ice skating** will come on.

That would take **some planning**. I like

I like some country music.

## Just noise?

No. Variability in ratings is systematically predicted by syntactic, semantic, and pragmatic features of the linguistic context.

# Next: open science

#### References

Buhrmester, M., Kwang, T., & Gosling, S. D. (2011). Amazon's Mechanical Turk: A New Source of Inexpensive, Yet High-Quality, Data?. *Perspectives on Psychological Science*, 6(1), 3-5.

Buhrmester, M. D., Talaifar, S., & Gosling, S. D. (2018). An Evaluation of Amazon's Mechanical Turk, Its Rapid Rise, and Its Effective Use. *Perspectives on Psychological Science*, 13(2), 149–154.

Crump, M. J., McDonnell, J. V., & Gureckis, T. M. (2013). Evaluating Amazon's Mechanical Turk as a tool for experimental behavioral research. *PloS one*, 8(3), e57410.

Degen, J. & Tonhauser, J. (to appear). Managing web experiments for psycholinguistics: An example from experimental semantics/pragmatics. In *Open Handbook of Linguistic Data Management*.

Paolacci, G., & Chandler, J. (2014). Inside the Turk: Understanding Mechanical Turk as a participant pool. *Current Directions in Psychological Science*, 23(3), 184-188.

Peer, E., Brandimarte, L., Samat, S., & Acquisti, A. (2017). Beyond the Turk: Alternative platforms for crowdsourcing behavioral research. *Journal of Experimental Social Psychology*, 70, 153-163.