

CS 5306  
INFO 5306:  
Crowdsourcing and  
Human Computation

Lecture 23

11/21/17

Haym Hirsh

- Final exam: Tuesday, December 12, 9:00- 11:00am OLH155
- Project 2: Wednesday, December 6, 4:30pm  
(late projects accepted, no penalty through Dec 12)

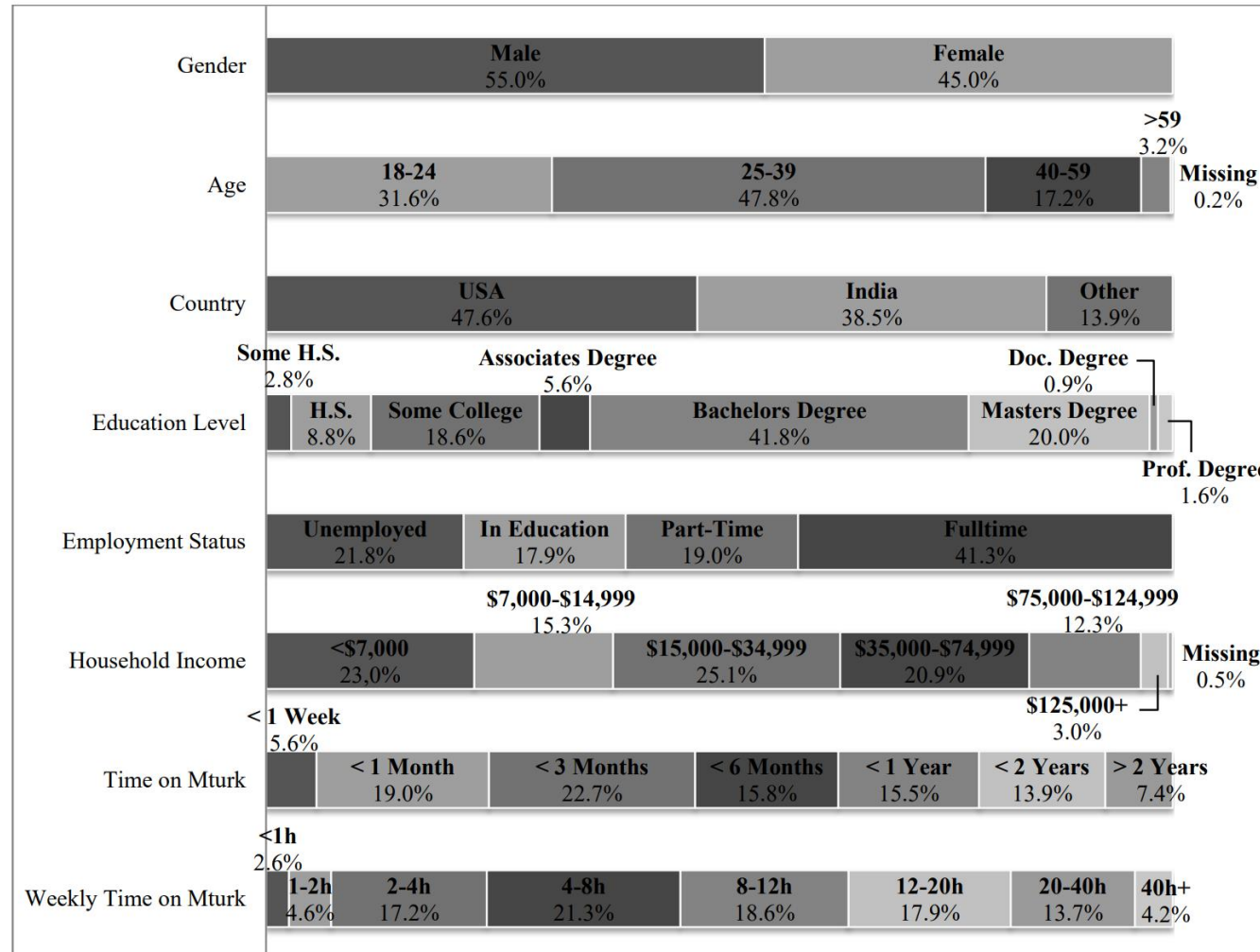
Today

What do we know about the crowdworker experience?

# Demographics

- Ipeirotis, P. Demographics of Mechanical Turk. CeDER Working Papers No. CeDER-10-01. (2010) <http://hdl.handle.net/2451/29585>
- Ross, J., Irani, L., Silberman, M. S., Zaldivar, A., and Tomlinson, B. Who are the crowdworkers?: shifting demographics in mechanical turk. In Proc. of CHI EA '10, ACM (2010), 2863–2872.
- Fort, K., Adda, G. and Cohen, K.B., 2011. Amazon mechanical turk: Gold mine or coal mine?. *Computational Linguistics*, 37(2), pp.413-420.
  - Between 15,059 and 42,912 active workers
  - 80% of the tasks are carried out by the 20% most active (3,011–8,582) Turkers
- Kaufmann, N., Schulze, T. and Veit, D., 2011, August. More than fun and money. Worker Motivation in Crowdsourcing-A Study on Mechanical Turk. In *AMCIS* (Vol. 11, No. 2011, pp. 1-11).

“More than fun and money.  
 Worker Motivation in Crowdsourcing-A Study on Mechanical Turk”  
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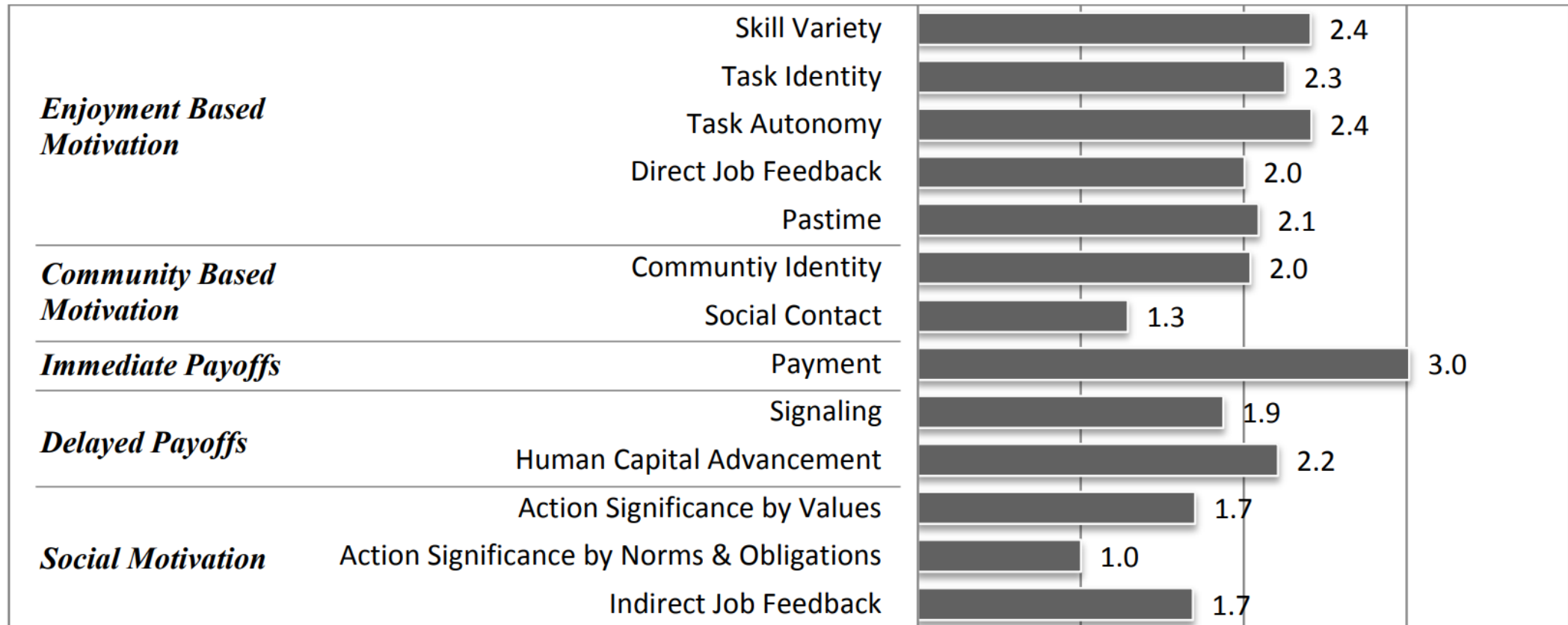


# Demographics

[demographics.mturk-tracker.com](http://demographics.mturk-tracker.com)

# Motivations

“More than fun and money.  
 Worker Motivation in Crowdsourcing-A Study on Mechanical Turk”  
 Kaufmann, N., Schulze, T. and Veit, D.  
 In *AMCIS* Vol. 11pp. 1-11, 2011



**Figure 3: Mean construct scores after standardization**



# “Breaking monotony with meaning: Motivation in crowdsourcing markets”

Chandler, D. and Kapelner, A.

*Journal of Economic Behavior & Organization, 90, 2013*

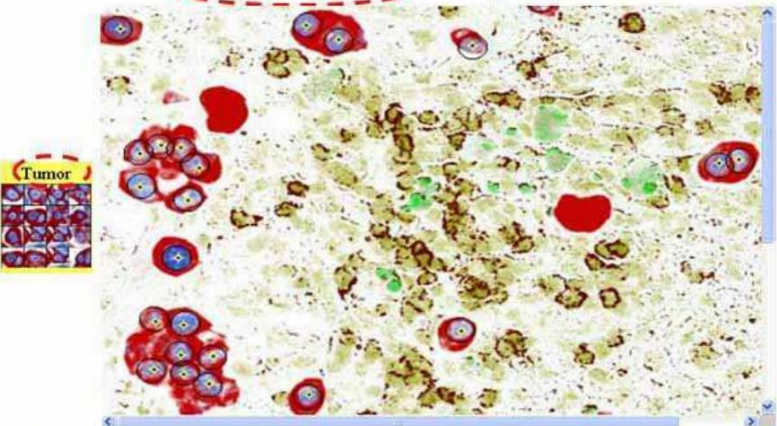
Submit this task and do another task for more pay

Left click to make a point, right click to delete a point  
If you do not see the image below, reduce the magnification, or restart your browser.

Total earnings: **\$0.00** Time left: **14:45**

Magnification: (0.8x) DO NOT RELOAD THE PAGE - YOU WILL LOSE YOUR POINTS (More info to see image)

Find all cancerous tumor cells in the image below:



Each of the circles at left depict a **10-pixel radius** that is centered at the middle of each cell. These are for illustration purposes and were *not* visible to workers.

Top Reasons HITs are Rejected

1. Tumors were not clicked on at all.
2. Tumors were marked multiple times. There should only be one unique click per tumor.
3. Tumors were not marked in their centers. They should be marked in the centers.
4. Too many tumors were missed (in the case of the goal being all tumors).

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## Identifying Objects of Interest in Images

Your task: Look at images and find objects of interests

- How to identify those objects in images
- Opportunity to label more images

## Identifying Tumor Cells in Images

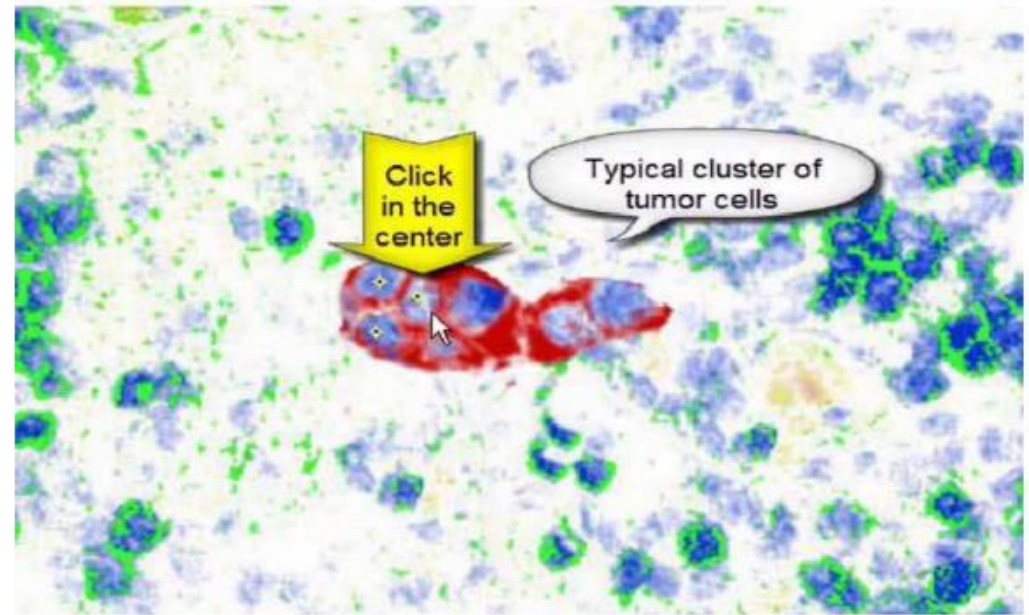
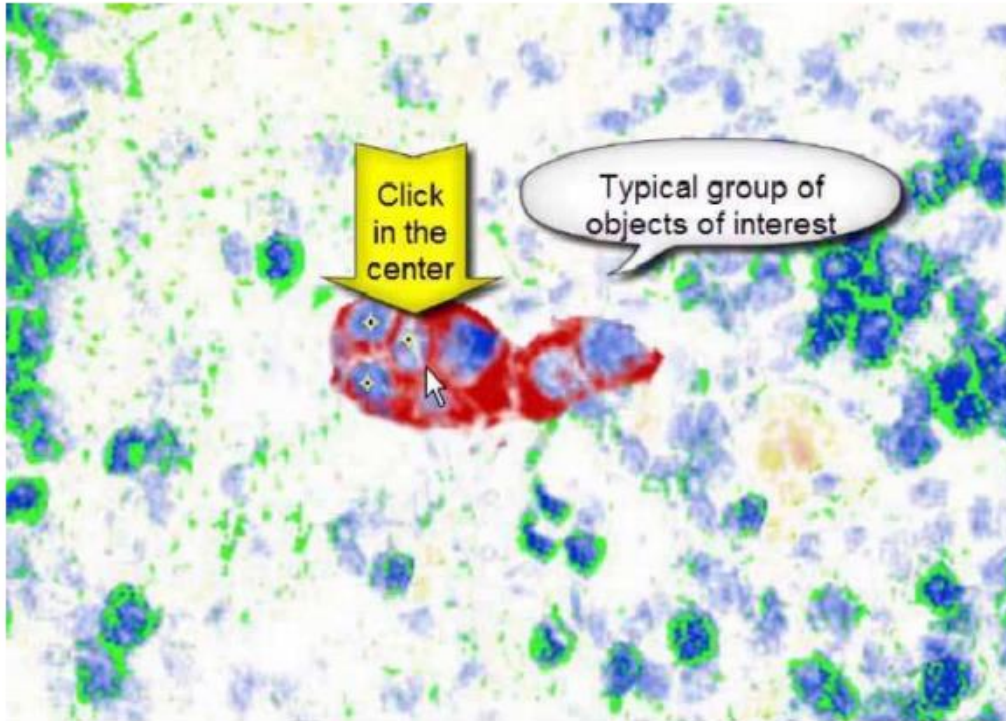
Why you'll be labeling images

- How to identify tumor cells in images
- Opportunity to label more images

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	Induced to work	Did $\geq 5$ labelings	Fine Quality	Average Hourly Wage
Meaningful	↑ 4.6%*	↑ 8.5%***	↑ 0.7%	↓ 4.5%
Meaningful (US)	↑ 5.1%*	↑ 8.9%**	↑ 3.9%	↓ 7.7%
Meaningful (India)	↓ 2.3%	↑ 7.0%*	↓ 3.1%	↑ 0.5%
Shredded	↓ 4.0%	↓ 2.8%	↓ 7.2%***	↑ 5.6%
Shredded (US)	↓ 2.3%	↓ 5.0%	↓ 6.1%*	↑ 9.5%
Shredded (India)	↓ 6.8%	↓ 1.6%	↓ 8.7%**	↓ 1.4%

\*  $p < .05$ , \*\*  $p < .01$ , \*\*\*  $p < .001$

“Social desirability bias and self-reports of motivation: a study of amazon mechanical turk in the US and India”

Antin, J. and Shaw, A., *SIGCHI* 2012

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Social desirability bias:

- Wikipedia: “tendency of survey respondents to answer questions in a manner that will be viewed favorably by others”

List experiment:

- Provide a list of choices, have respondent say *how many*
- Leave one choice (rotating through each of the choices) out of each survey

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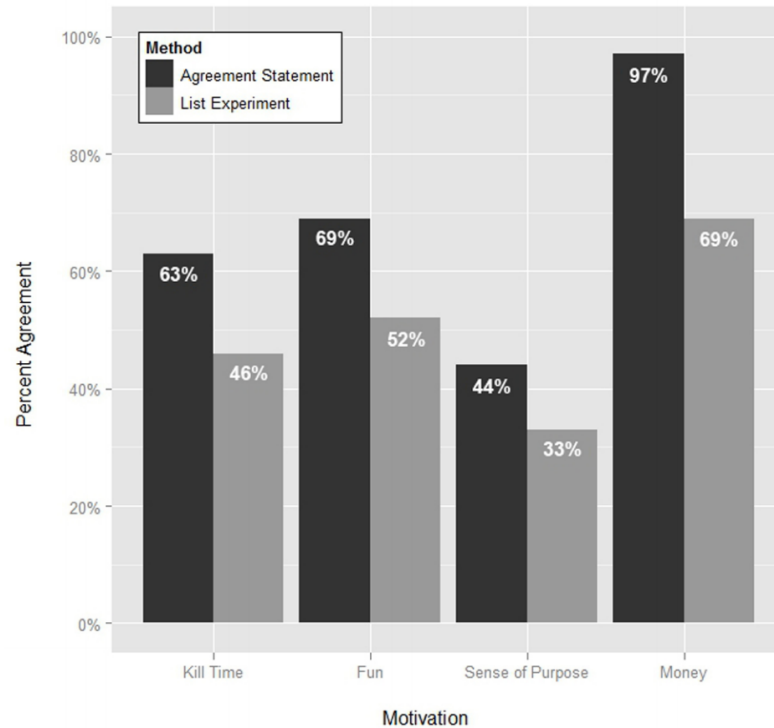


Figure 1. The proportion of US participants who selected each motivation using agreement statement-style questions or the list experiment. N = 1132.

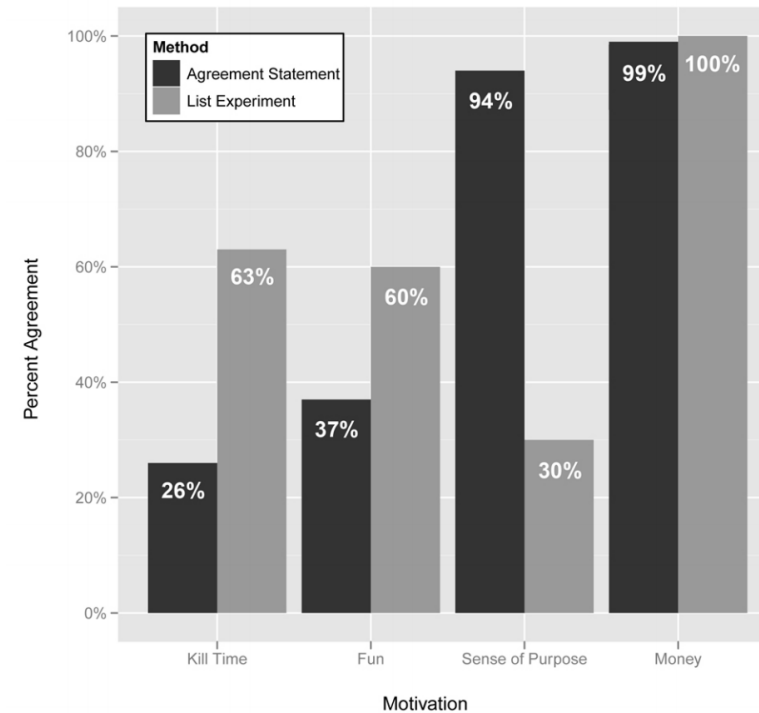
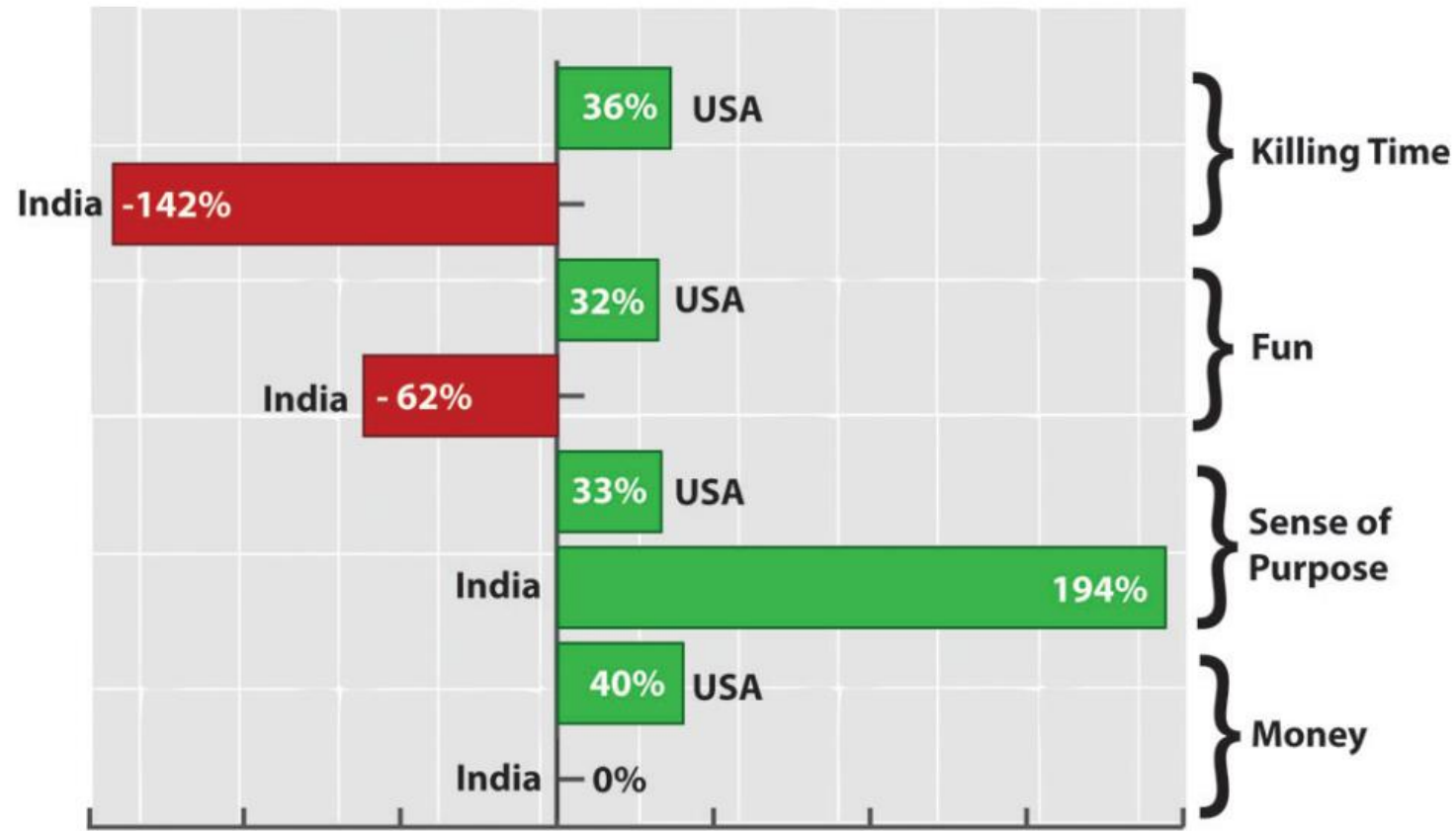


Figure 2. The proportion of India participants who selected each motivation using agreement statement-style questions or the list experiment. N = 898.



“Social desirability bias and self-reports of motivation: a study of amazon mechanical turk in the US and India”

Antin, J. and Shaw, A., *SIGCHI* 2012



# The Worker Experience

# “Ethics and tactics of professional crowdwork”

Silberman, M., Irani, L. and Ross, J.

*XRDS: Crossroads, The ACM Magazine for Students* 17(2) 2010

- “Occupational hazards”:
  - Requesters not paying
  - “Staying safe” – inappropriate tasks
  - Little support from Amazon
  - Bad tasks (ambiguous, not enough time, ...)
- Solution approaches:
  - From the “outside” (Turkopticon, Turker Nation, ...)
  - New platforms
  - Legal protections

“Amazon mechanical turk: Gold mine or coal mine?”

Fort, K., Adda, G. and Cohen, K.B.,

*Computational Linguistics*, 37(2), pp.413-420, 2011

- AMT:
  - Between 15,059 and 42,912 active workers
  - 80% of the tasks are carried out by the 20% most active (3,011–8,582) Turkers
- Concerns:
  - Low pay
  - Legal status: Employees?

# “Web workers unite! Addressing challenges of online laborers” Bederson, B. B. and Quinn, A. J., CHI 2011

- Discussion of ethical and labor issues for workers
- Requester system design guidelines
  - Pay guidelines
  - Objective metrics
  - Feedback guidelines
  - Grievance process
  - Provide task context
  - Limit anonymity
  - ...

“Turkopticon: Interrupting worker invisibility in amazon mechanical turk”, Irani, L.C. and Silberman, M., CHI 2013

- Problem: Human computation relies on/exploits worker invisibility
- Turkopticon: Platform for workers to discuss (and rate) requesters
- Discusses many issues for the future of crowd work

## “The future of crowd work”

Kittur, A., Nickerson, J.V., Bernstein, M., Gerber, E., Shaw, A., Zimmerman, J., Lease, M. and Horton, J., CSCW 2013

“would we want our children to be crowdworkers?”

(discussion of research directions for the future)

# “Being a turker”

Martin, D., Hanrahan, B.V., O'Neill, J. and Gupta, N.,  
In *Proceedings CSCW*, 2014

- Ethnomethodological study of Turker Nation forum
- Many results/observations
- Key issues for workers:
  - AMT is a labor marketplace where pay is the most important consideration
  - Information quality for selecting tasks
  - Relationship with requesters
  - How to act collectively



“We are dynamo:Overcoming stalling  
and friction in collective action for crowd workers”

Salehi, N., Irani, L.C., Bernstein, M.S., Alkhatib, A., Ogbe, E. and  
Milland, K., CHI 2015

- Dynamo: Platform for organizing and collective action for AMT  
workers

# "Taking a HIT: Designing around rejection, mistrust, risk, and workers' experiences in Amazon Mechanical Turk"

McInnis, B., Cosley, D., Nam, C. and Leshed, G.

- Main issues:
  - Risk and trust
  - Anonymity
  - Policy asymmetry => Risk, mistrust
    - Workers use outside tools/platforms to address the asymmetry
- Risk factors:
  - Task and interface design
  - Unclear evaluation criteria
  - Unresponsive, arbitrary resolution of rejections
    - "Amazon has no policy about Requesters' responsibilities in communicating with Turkers and resolving disputes"
  - Lack of information on requesters
  - Inexperienced and unfamiliar requesters
  - Tasks with poor return
  - Prioritizing efficiency over quality

"Taking a HIT: Designing around rejection, mistrust, risk, and workers' experiences in Amazon Mechanical Turk"

McInnis, B., Cosley, D., Nam, C. and Leshed, G.

- Possible solutions (not requiring AMT action):
  - “Broken task” alarm button
  - Integrate existing “mutual aid” systems
  - Fast fail – provide feedback
  - Repairing rejected work
  - Tools for collective interaction with requesters
  - “Turker task design collective” – get turker help on task design

“The crowd is a collaborative network. “  
Gray, M.L., Suri, S., Ali, S.S. and Kulkarni, D.  
CSCW 2016

- Data:
  - AMT
  - Microsoft’s Universal Human Relevance System (UHRS)
  - LeadGenius
    - Provides sales “leads” via AI + human computation
    - Minimum wage based on each country’s cost of living
  - Amara.org
    - Video subtitles

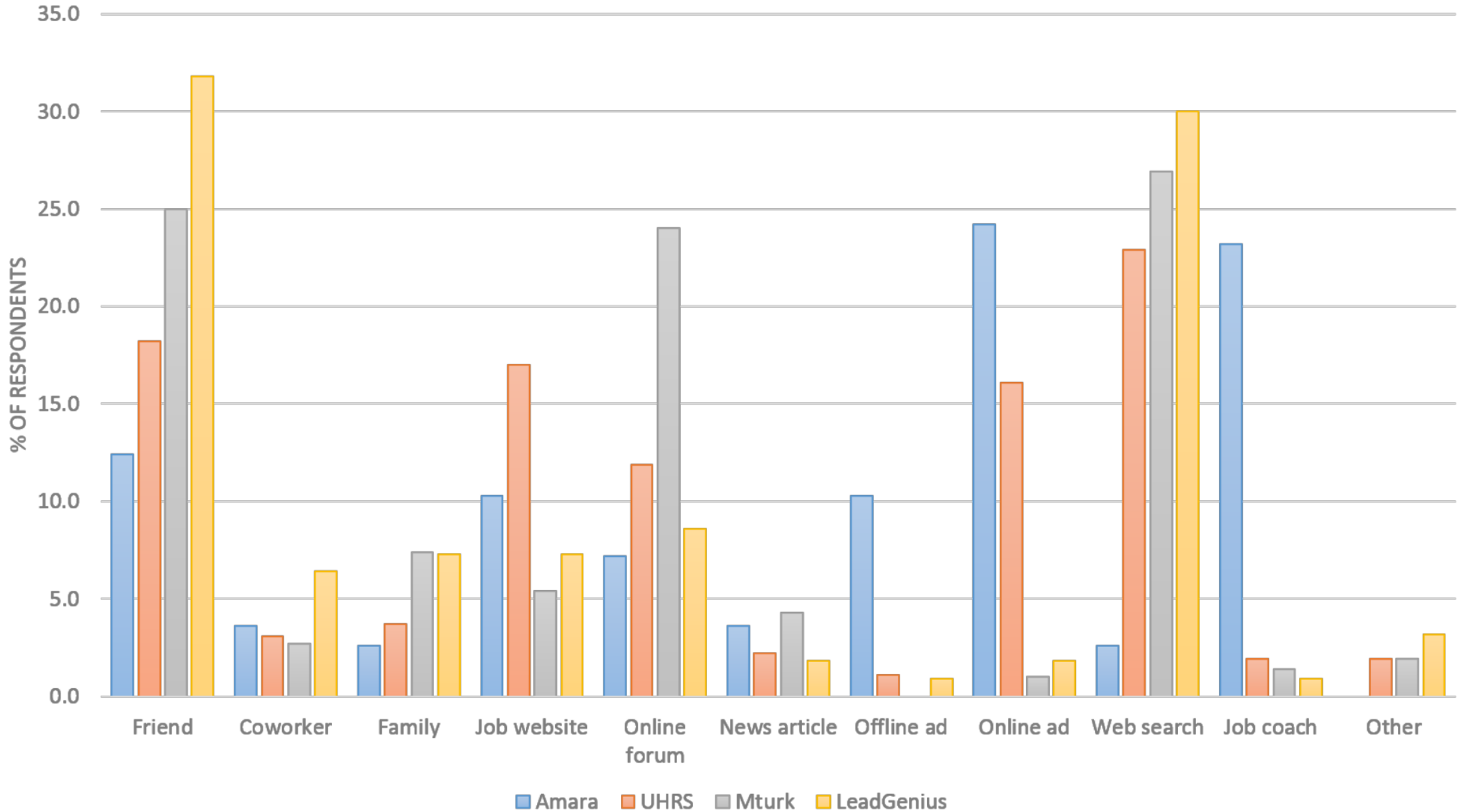
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CSCW 2016

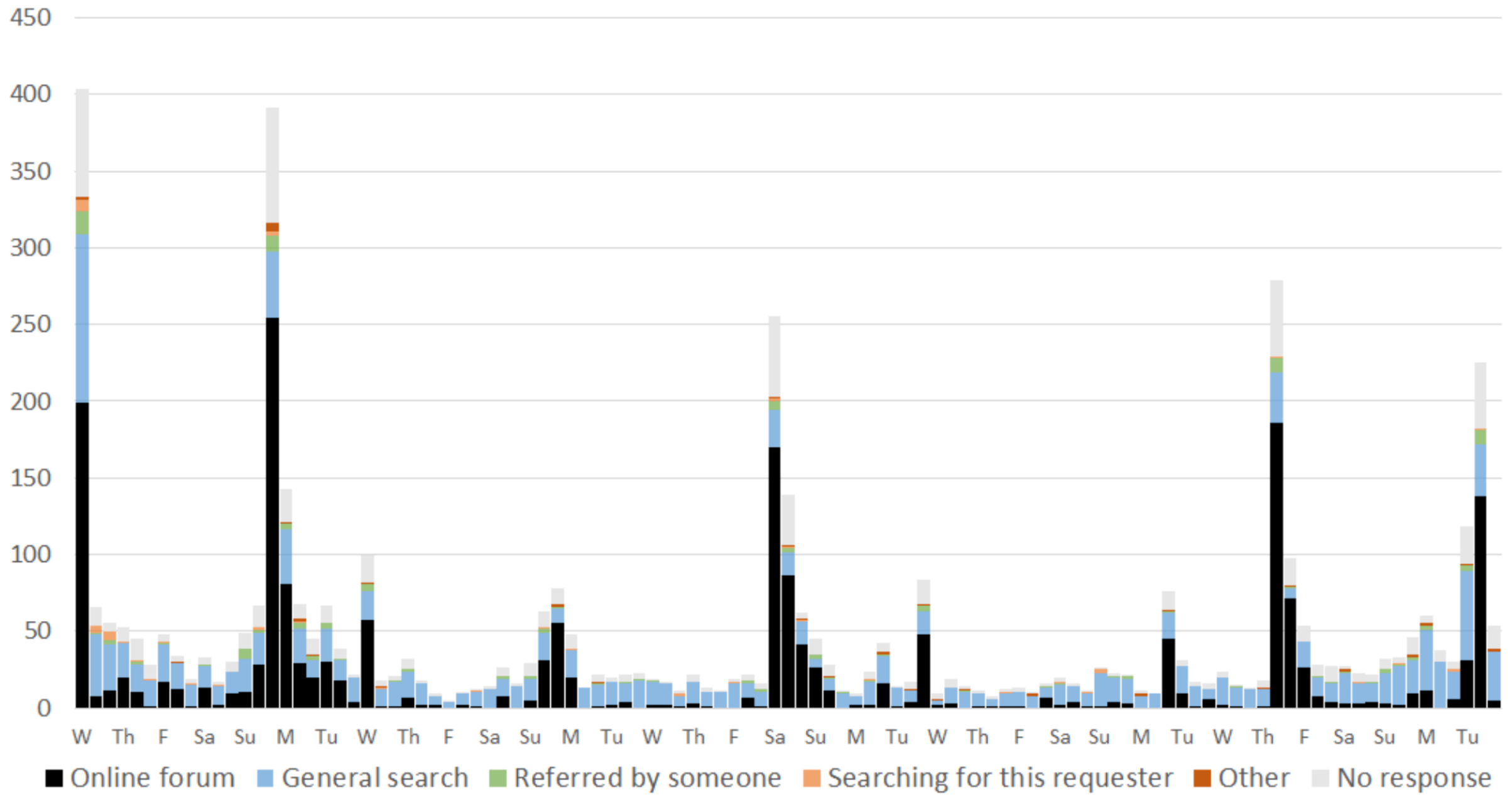
- Findings
  - Forms of collaboration
    - Reducing administrative overhead

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CSCW 2016

- Findings
  - Forms of collaboration
    - Reducing administrative overhead
    - Sharing tasks as employment opportunities

## How users learn about the platform





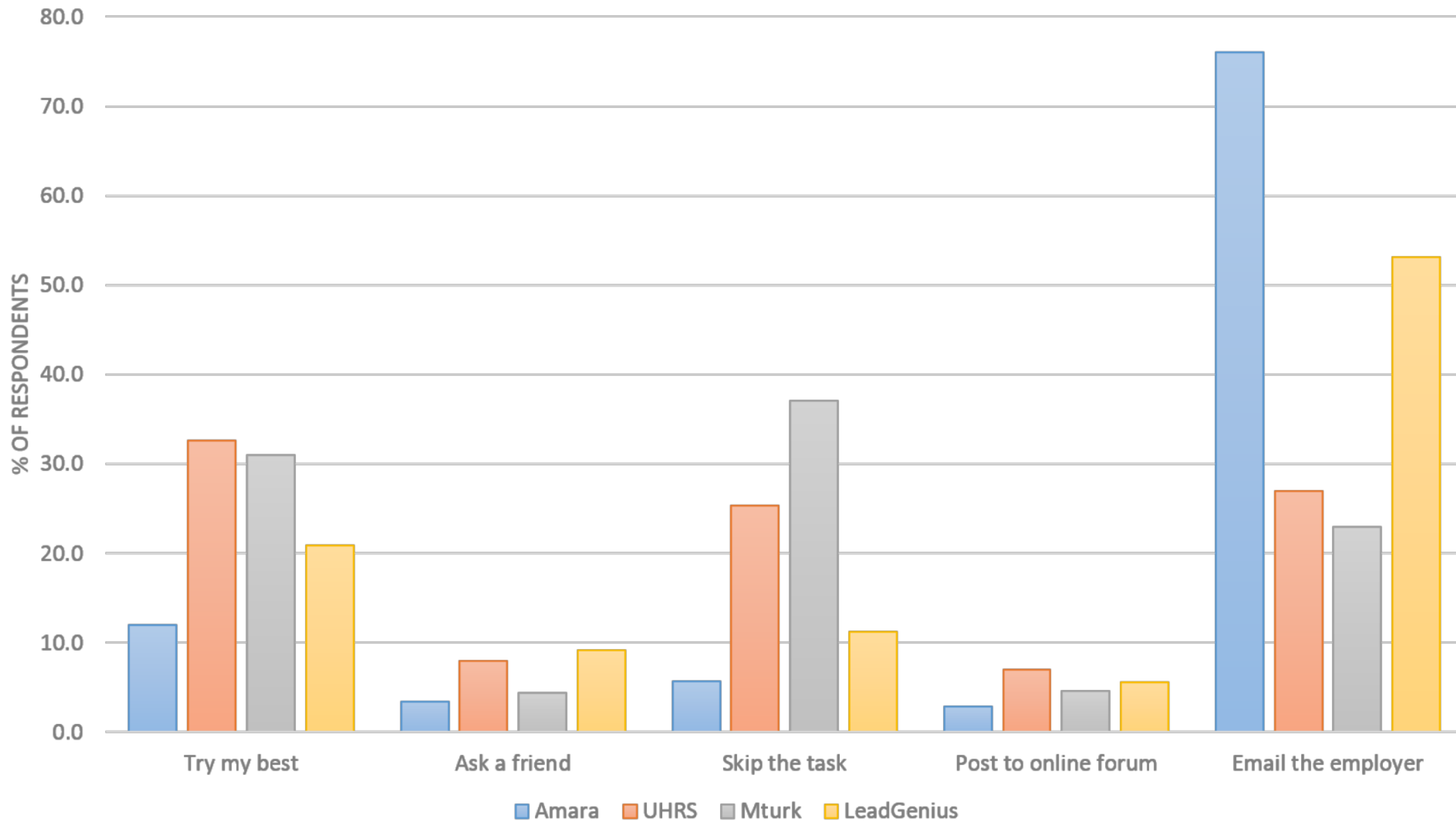
**Figure 2. How workers found our mapping HIT (n=4,856) which ran from April 23 - May 28, 2014**



“The crowd is a collaborative network. “  
Gray, M.L., Suri, S., Ali, S.S. and Kulkarni, D.  
CSCW 2016

- Findings
  - Forms of collaboration
    - Reducing administrative overhead
    - Sharing tasks as employment opportunities
    - Helping others

# What do you typically do when you come across a task with instructions that you don't understand?



# Project 2

- Pick a cognitive bias that you conjecture might impact a worker's performance on AMT
- Evaluate your conjecture

# Project 2

- Examples:
  - Does putting a “happy face” on a task page cause sentiment analysis tasks to be get more positive responses?
  - Does telling workers what previous workers have answered (akin to Asch’s study) bias their answers (possibly away from the correct one)?
  - Are workers more accurate if they are primed with a god-evoking cue?
  - Do workers favor answers that rhyme?

# Project 2

- Sources for cognitive biases
  - [Wikipedia's list of cognitive biases](#)
  - The [Cognitive Bias Cheat Sheet](#)
    - (Depicted in the [Cognitive Bias Codex](#))

# Project 2

- Submission format:
  1. Define/explain the cognitive bias (independent of human computation)
  2. Explain the effect that you think it will have
  3. Describe the experiment that you ran to test it
  4. Document your outcomes
- Teams of size 1 or 2
- Due: Wednesday, December 6, 4:30pm  
(late projects accepted, no penalty, through Dec 12)