

#### Purdue Fall 2018

#### **CS59000-CSC:** Crowdsourcing and Social Computing

http://mingyin.org/CS590/Fall2018/index.html

### **Class 3: Crowd Workers**

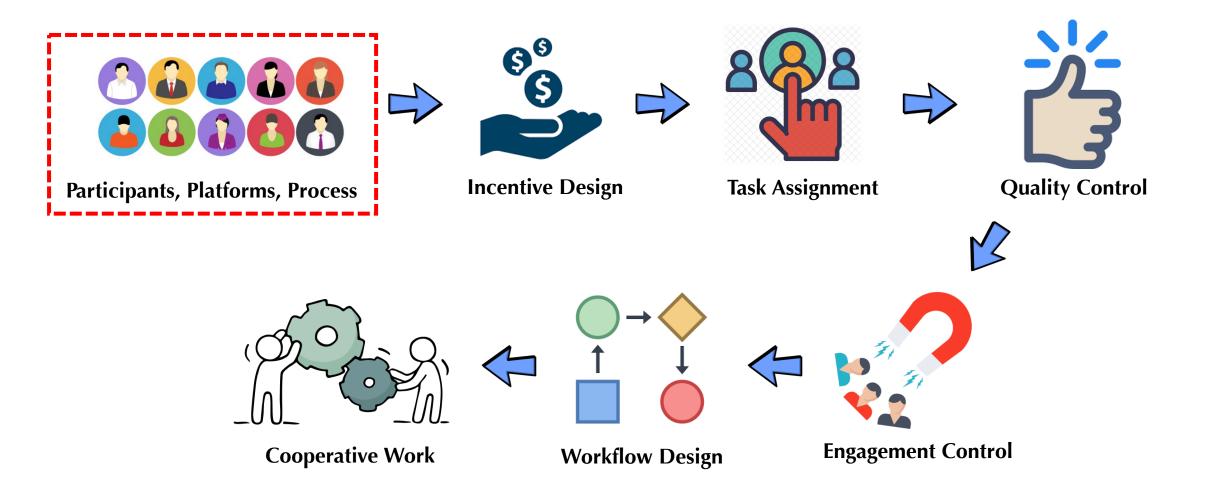
2018.8.27

Ming Yin

### Administrative Notes

- Pick presentation topics: https://doodle.com/poll/qmbfnp8e2pmr5dw8
  - Please indicate 2 topics you are interested in presenting
  - Topics will be assigned in a first-come, first-served manner (so sign up to topics that you are interested in presenting as early as possible!)
- Sign up as a requester on Amazon Mechanical Turk! (will come back to this)
- Late policy
  - You can have 2 chances of submitting reading response/assignment after the due time (but you still need to submit!)
  - All project-related due dates are hard deadlines!

### Where are we in the course?



# So, who are those workers?

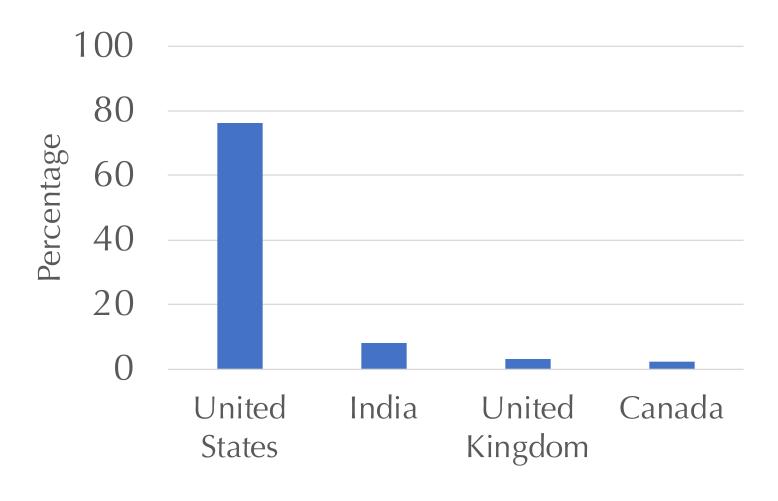
- Demographics information
- How is the composition of the crowd changing over time?
- Why do they choose to do crowd work?
- How many workers are there?
- How do they get the work done?



# Difficult Questions to Answer!

- No official census data about crowd workers are available
- In fact, crowd workers are more or less perceived as "anonymous" and "interchangeable"
- Researchers are physically apart from the globally-distributed workers, making it hard to "observe" their work life
- Solution: self-reported surveys + ethnographic analysis of digital trace

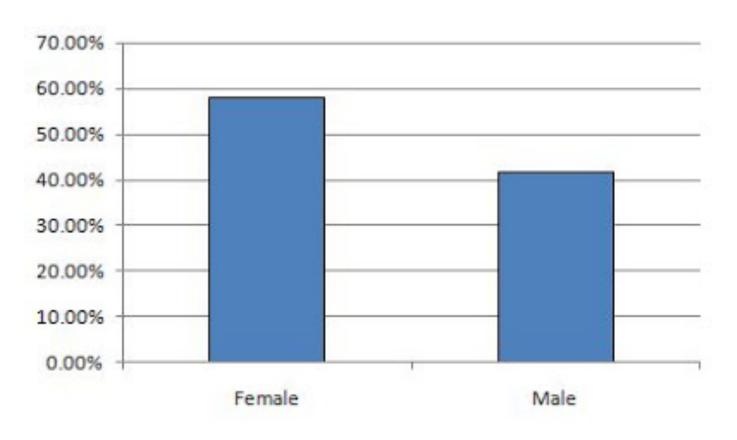
# MTurk Worker Demographics (2008): Country



The majority of crowd workers on MTurk come from US!

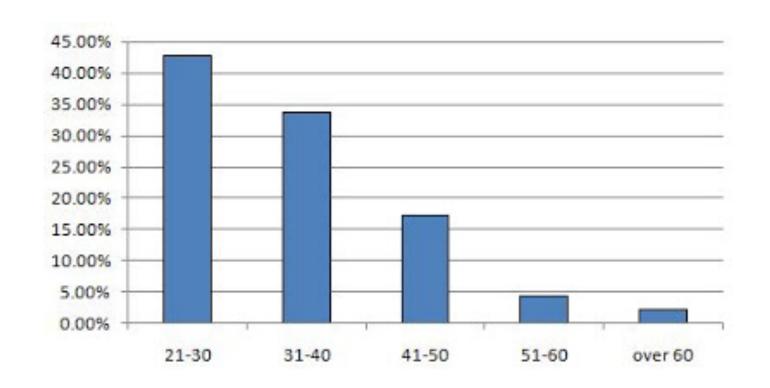
http://www.behind-the-enemy-lines.com/2008/03/mechanical-turk-demographics.html

# MTurk Worker Demographics (2008): Gender



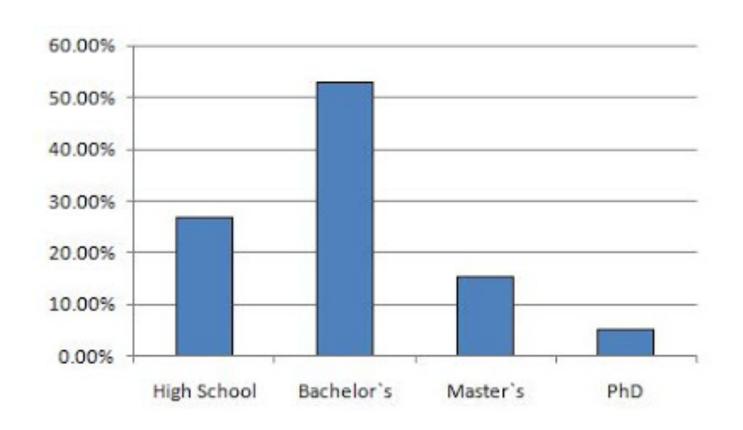
More female workers than male workers!

# MTurk Worker Demographics (2008): Age



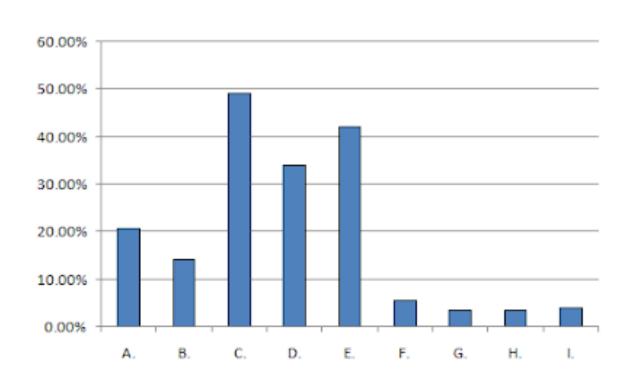
The majority of workers are under 40!

### MTurk Worker Demographics (2008): Education



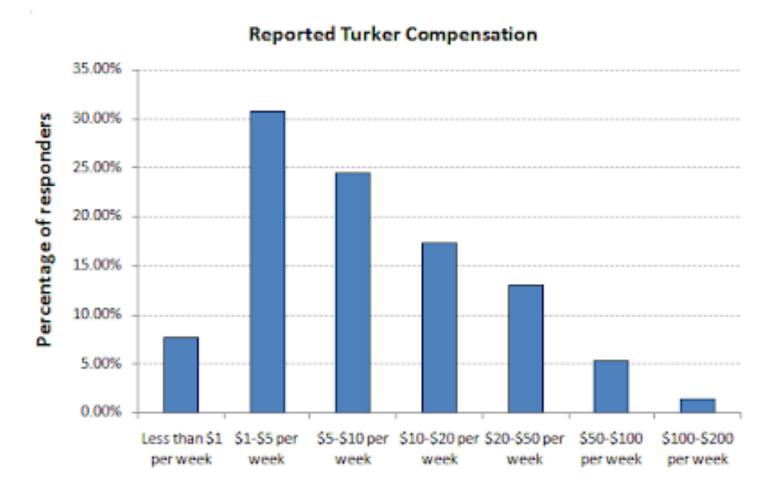
The majority of workers have bachelor degree or higher

### MTurk Worker Demographics (2008): Purpose



- A. Kill Time
- B. Fruitful way to spend free time (Instead of watching TV, playing video games/online games, Sense of purpose when watching TV, something to do during downtime in work)
- C. Income purposes (Gas, Bills, Make money, Credit card, Groceries, School, Help family)
- D. Pocket change/extra cash (Hobbies, Mad money, Buy personal stuff)
- E. For fun, interesting, addiction
- F. Challenge, self-competition
- G. Unemployed, no regular job, as part-time job
- H. To sharpen/To keep mind sharp
- I. Learn English

# MTurk Worker Demographics (2008): Payment received



http://www.behind-the-enemy-lines.com/2008/09/how-much-turking-pays.html

# MTurk Worker vs. Internet Users (2008, US)





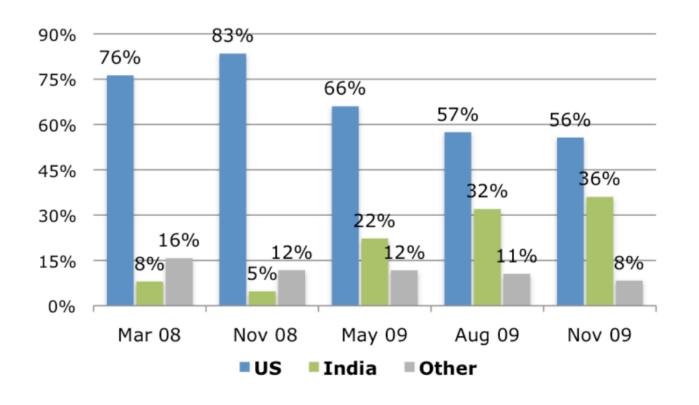
Younger!	54%	Age: 21-35	22%
More Female!	70%	Female	50%
Lower Income!	65%	Household income < 60K	45%
Smaller Family!	45%	Household <= 2 people	28%

## Faces of MTurk workers



https://waxy.org/2008/11/the\_faces\_of\_mechanical\_turk/

# But Demographics Also Changes Over Time...



From a primary US-based workforce to an increasingly international group of workers.

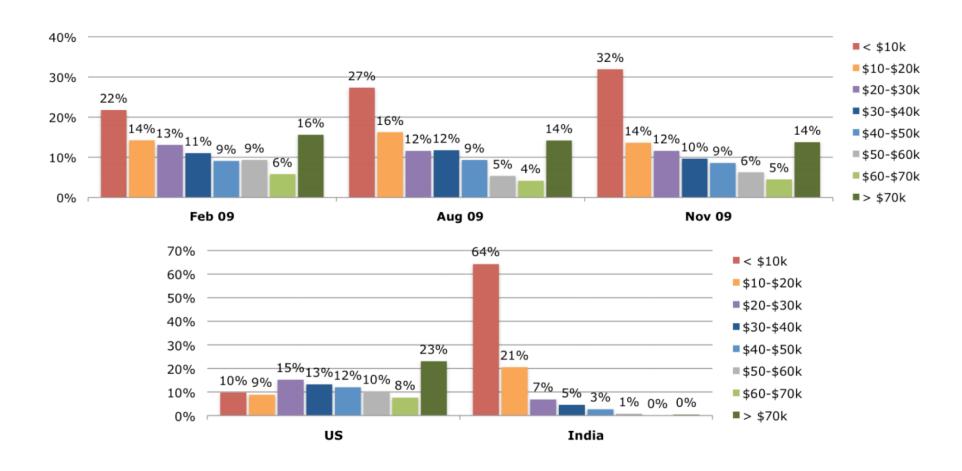
Ross, Joel, et al. "Who are the crowdworkers?: shifting demographics in mechanical turk." CHI'10 EA

# But Demographics Also Changes Over Time...

		Nov 08	May 09	Aug 09	Nov 09	
Average	US	33.6	34.3	33.2	35.4	
Age	India	28.5	28.8	27.6	26.4	
Gender	US	28% male,	34% male,	31% male,	37% male,	
	03	72% female	66% female	69% female	63% female	
	India	75% male,	61% male,	69% male,	66% male,	
	Illula	25% female	39% female	31% female	34% female	
Education	US	32% Bachelors,	34% Bachelors,	34% Bachelors,	38% Bachelors,	
	03	11% Graduate	14% Graduate	19% Graduate	17% Graduate	
	India	69% Bachelors,	56% Bachelors,	56% Bachelors,	45% Bachelors,	
	Illuia	29% Graduate	18% Graduate	13% Graduate	21% Graduate	

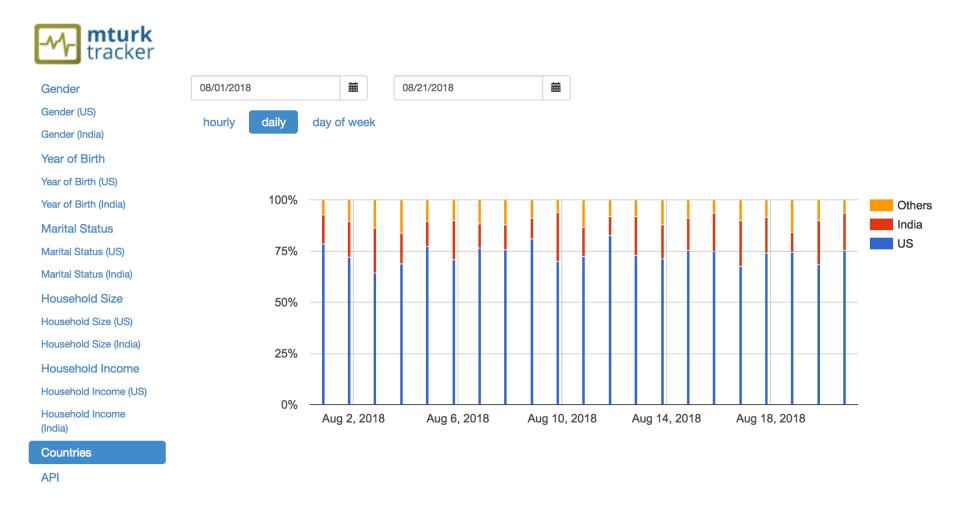
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# But Demographics Also Changes Over Time...



Ross, Joel, et al. "Who are the crowdworkers?: shifting demographics in mechanical turk." CHI'10 EA

# MTurk-Tracker: A Long-Term Demographic Survey



Each worker can take at most one survey in 30 days

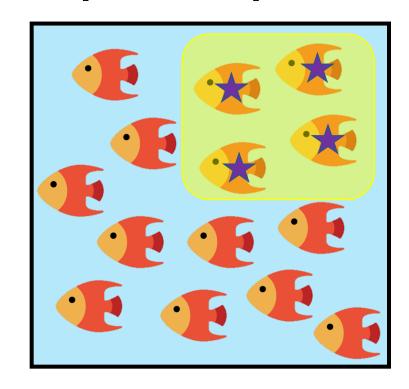
### Discussion

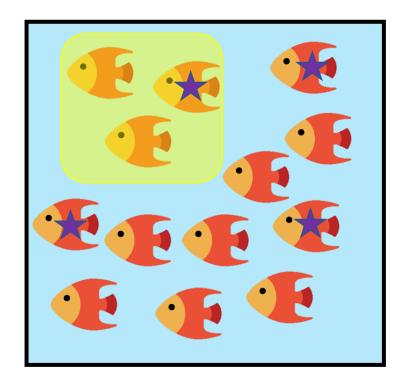
Does the demographic information collected from self-reported survey responses suffer from any problems?

Self-selection bias

Untruthful self-reports

#### The capture-recapture analysis





$$n = \frac{N_1}{M} \times N_2$$

$$M = \frac{N_1 N_2}{n}$$

M fish,  $N_1$  captured (& marked)

N<sub>2</sub> recaptured, n marked

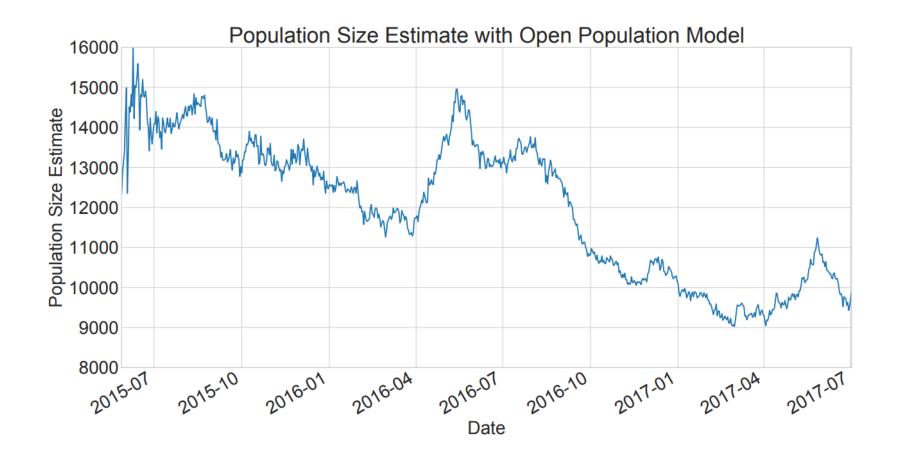
• Applying the capture-recapture analysis to workers who respond to demographic surveys, we concluded that M=13,410.

- Two Key assumptions
  - Closed population model: No workers will leave the worker pool, and no new workers will join the pool
  - Equal propensity of participation: The probability to participate in demographic survey is equal across all workers.

#### **Open population model**

- Survival probability:  $S(t) = \exp(-\lambda t)$
- At time d t,  $N_{d-t}$  workers participated in the survey
- At time d, assume that there are  $M_d$  workers in total. Among  $N_d$  workers that participated in the survey,  $n_{d,t}$  workers also participated in the survey at time d-t.

• 
$$n_{d,t} = \frac{N_{d-t}\exp(-\lambda t)}{M_d} \times N_d$$
,  $M_d = \frac{N_{d-t}N_d\exp(-\lambda t)}{n_{d,t}}$ 



Half-life of the MTurk worker population is 404 days

Difallah et al. "Demographics and Dynamics of Mechanical Turk Workers", WSDM'18

#### Accounting for propensity of participating surveys

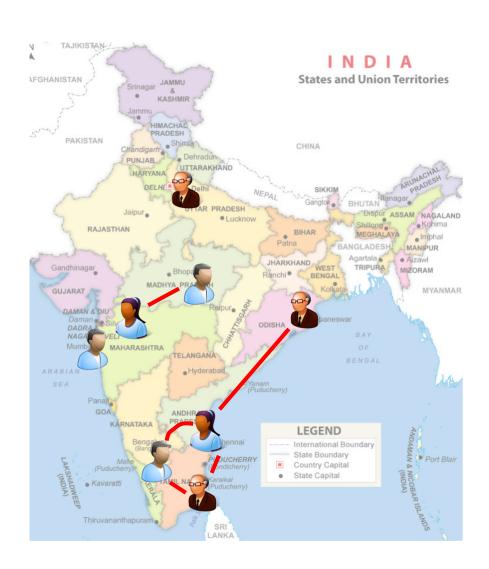
- Assume there are N workers in total, each worker gets a propensity score  $a_i \sim p(a)$
- Capture  $n_1$  workers,  $P(capture | a_i) = 1 (1 \frac{a_i}{\sum_{j=1}^N a_j})^{n_1} \approx \frac{n_1 a_i}{NE[a]}$
- Recapture  $n_2$  workers,  $P(capture, recapture | a_i) = \frac{n_1 n_2 a_i^2}{N^2 E[a]^2}$
- The expected number of workers participating in both surveys:  $m = N \int \frac{n_1 n_2 a_i^2}{N^2 E[a]^2} p(a) da = \frac{n_1 n_2}{N} (1 + \frac{Var[a]}{E[a]^2})$
- Following this method, the estimate for the number of Mturk workers is 178,000!

# Up until this point...

#### **Crowd workers on MTurk are...**

- Mostly live in US and India, young, well-educated, yet with lower income
- Demographics changes over time
- A large population
- Seems independent?

#### Some Evidence From the Field



[Gray, Suri, Ali, Kulkarni. CSCW 2016]

**No!** They talk to each other to... (based on ~100 interviews)



Help with administrative overhead

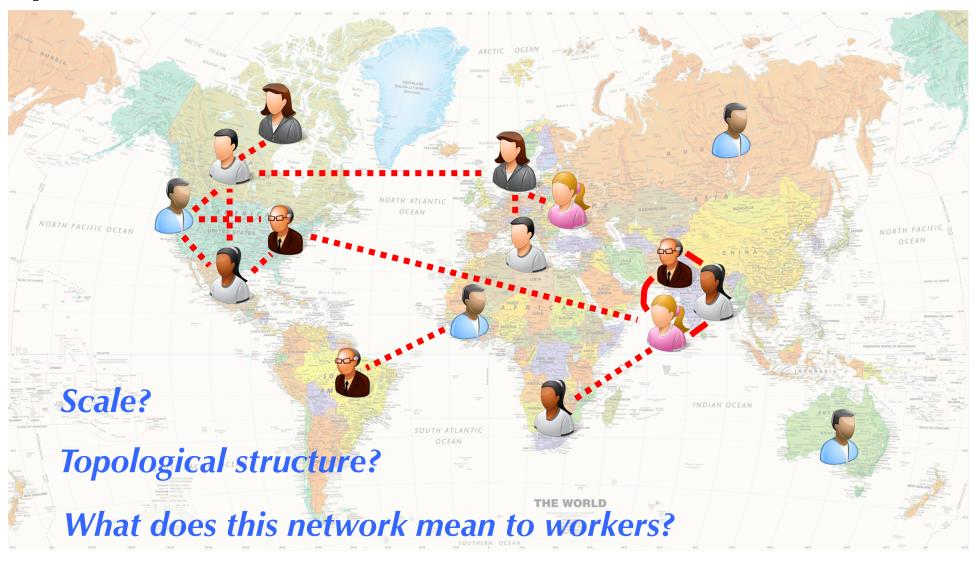


Share useful information



Recreate social connections

# Map the Network!



# Why is it Challenging?



Not accessible through API



Not on the MTurk platform



Nowhere to download



Can't just crawl from the web

#### We want...

◆ Elicit "true" connections only!

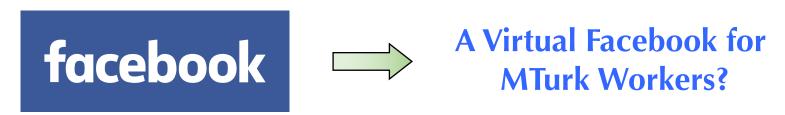
Can't directly ask for names!

- ◆ Elicit as many true connections as possible!
- ◆ Preserve workers' privacy!

Can't pay by connections!

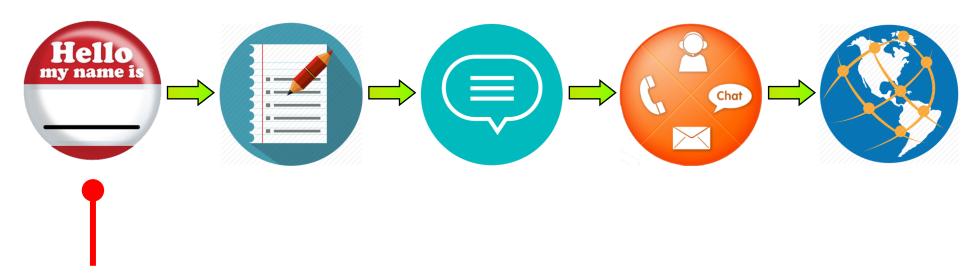
# A Virtual Facebook for Network Mapping

Motivate workers intrinsically!

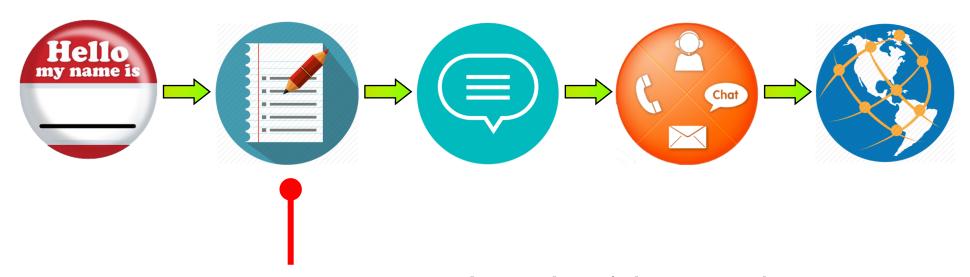


#### A Web Application that ...

- ♦ Workers self-report their connections in a privacypreserving way
- ◆ Workers can visualize the communication network
- ◆ Provides some value back to workers so they want to report as many true connections as possible



**Step 1**: Create a nickname for yourself

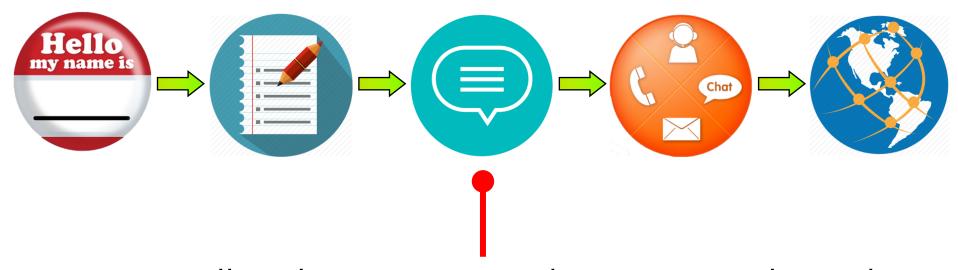


**Step 2**: Complete a brief demographic survey

Age Gender Country Approval rate

- Share with all other workers
- O Share with workers connected to me
- O Not share with anyone

Value back: Who are the other workers?

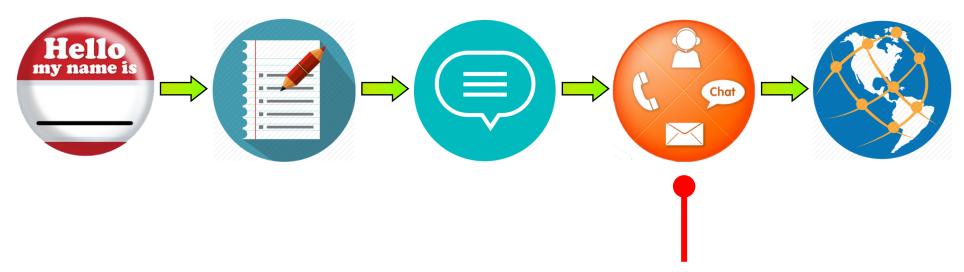


**Step 3**: Tell us about your personal experience with MTurk

Why did you start Turking? What motivates you to keep Turking?

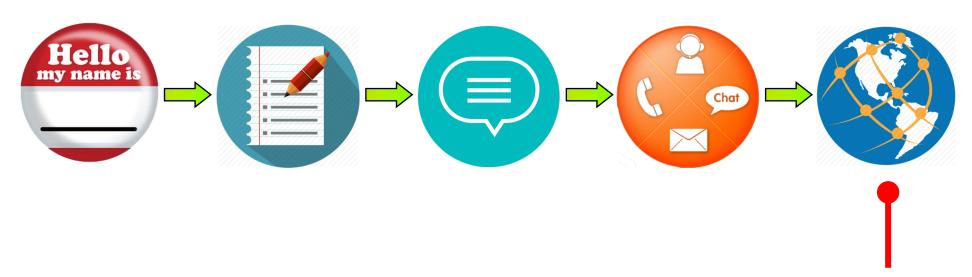
(Selected based on a pilot study!)

Value back: What are other workers' Turking stories?

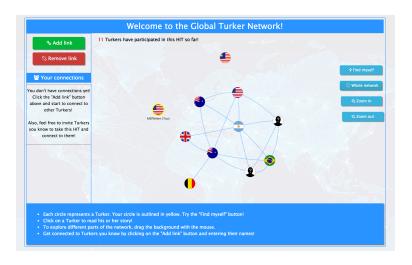


Step 4: Swap nicknames with Turkers you know

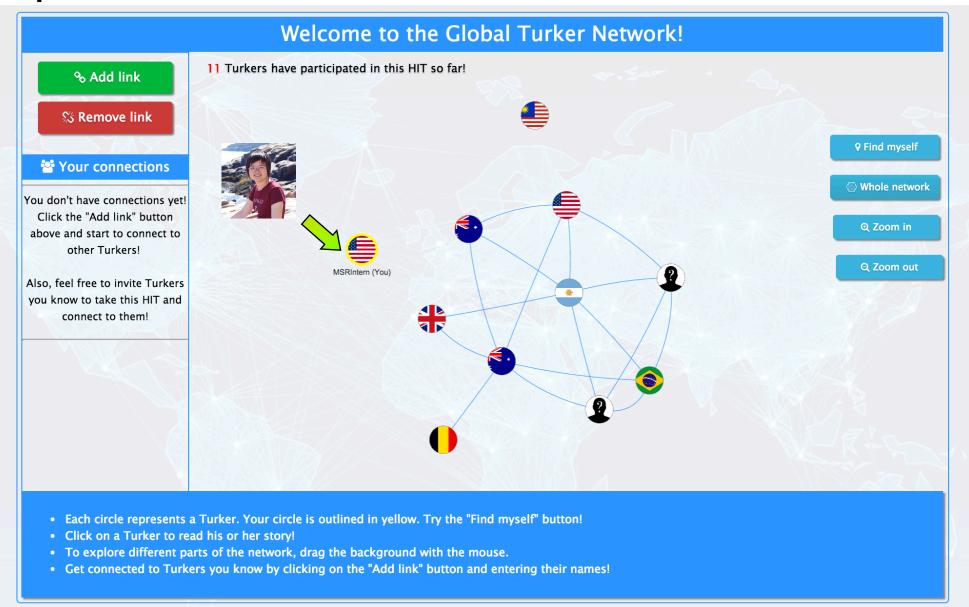




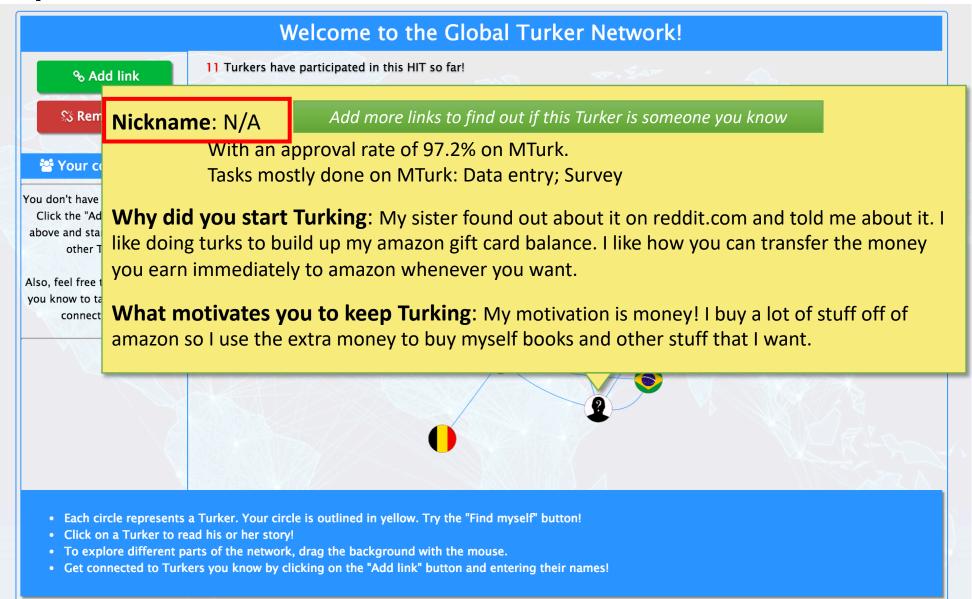
**Step 5**: Explore the Turker network



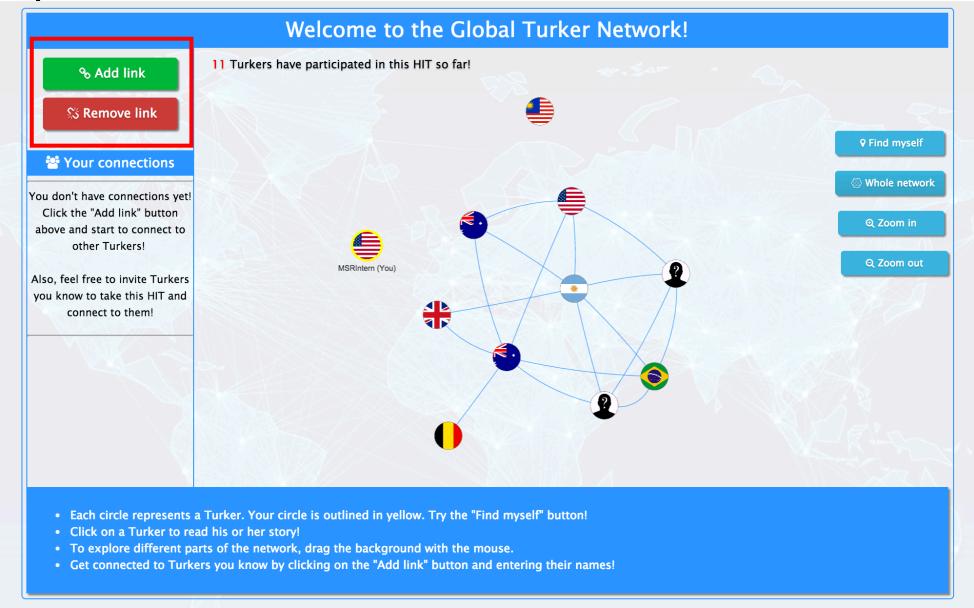
### Explore the Turker Network



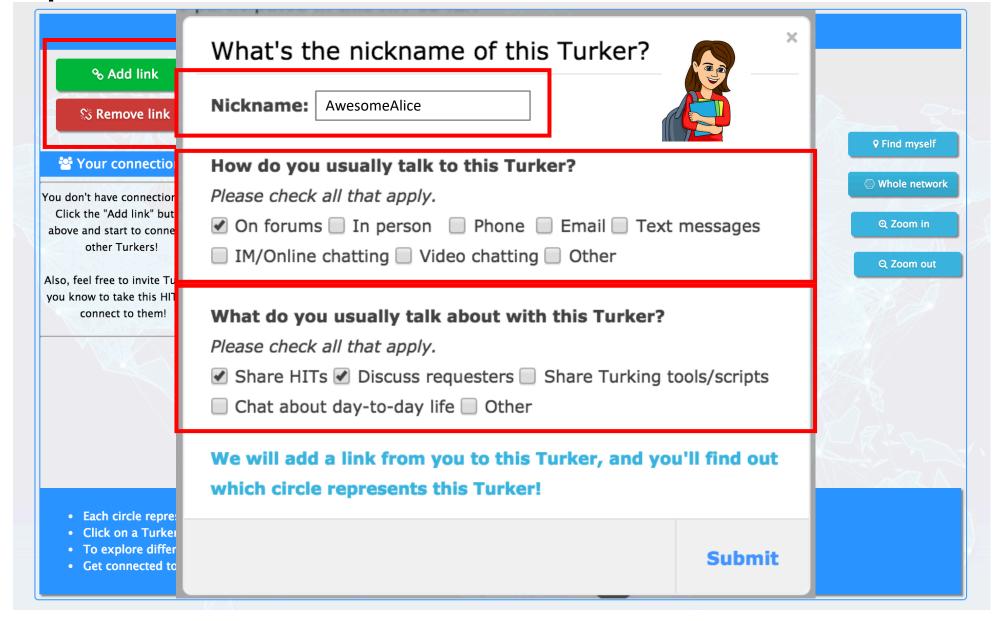
### Explore the Turker Network



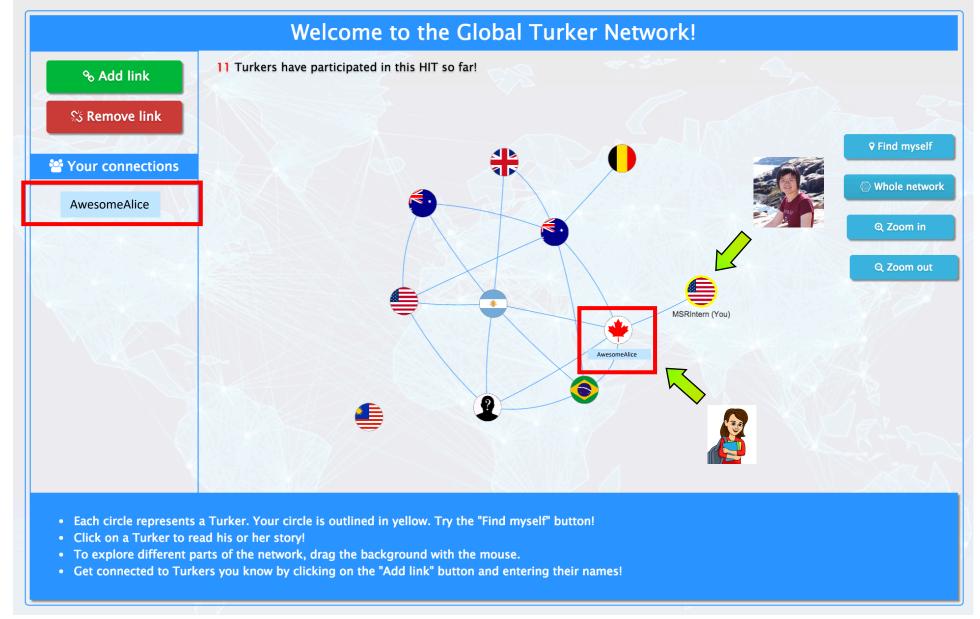
### Explore the Turker Network



## Explore the Turker Network



## Explore the Turker Network



## Explore the Turker Network

Nickname: AwesomeAlice

27 years old; female; living in Canada; with an approval rate of 97.2% on MTurk.

Tasks mostly done on MTurk: Data entry; Survey

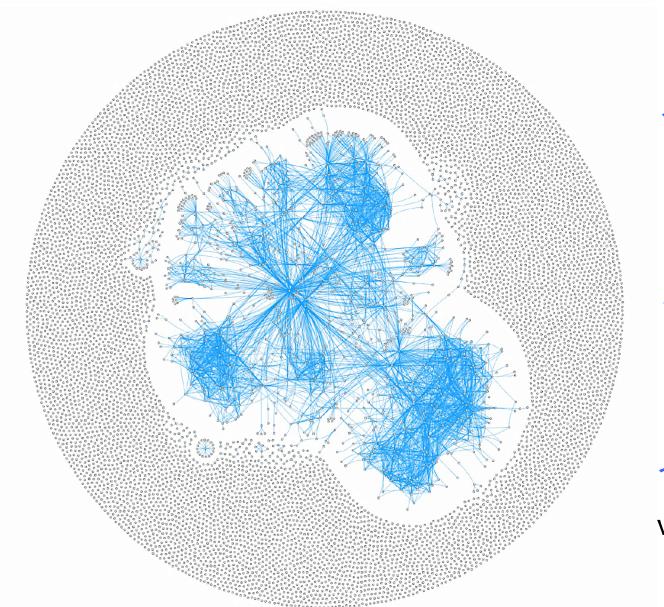
Why did you start Turking: My sister found out about it on reddit.com and told me about it. I like doing turks to build up my amazon gift card balance. I like how you can transfer the money you earn immediately to amazon whenever you want.

What motivates you to keep Turking: My motivation is money! I buy a lot of stuff off of amazon so I use the extra money to buy myself books and other stuff that I want.



- Each circle represents a Turker. Your circle is outlined in yellow. Try the "Find myself" button!
- · Click on a Turker to read his or her story!
- To explore different parts of the network, drag the background with the mouse.
- Get connected to Turkers you know by clicking on the "Add link" button and entering their names!

## After 18 Days...



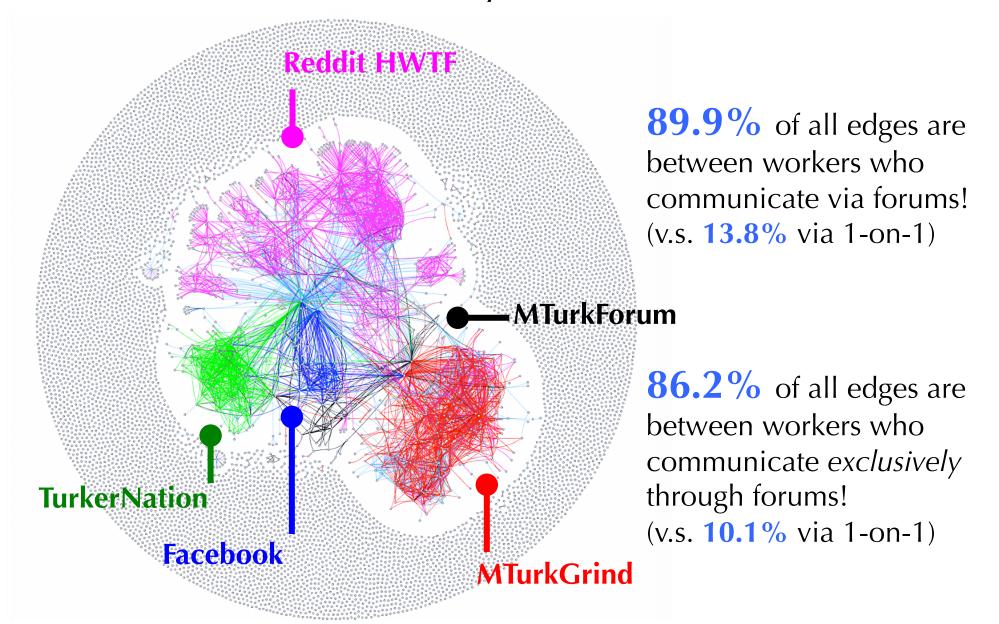
**10,354** workers

5,268 connections

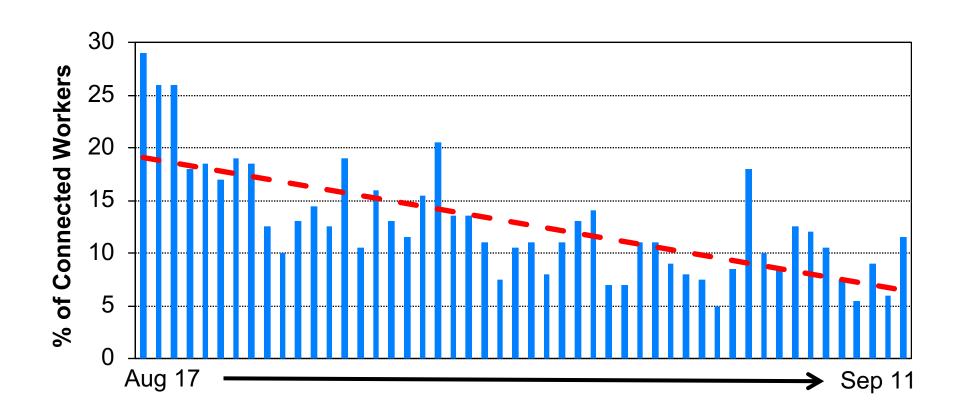
1,389 (13.4%)

workers are connected!

## A Network Enabled By Forums



### Connected Workers Find HITs Earlier



## Connected Workers Get Emotional Support

When I'm down, I talk with my friend who also does MTurk. She *keeps me motivated* as she has the same goals as me.

Being on a forum is a must. You feel less alone, learn a lot, and it keeps it interesting.

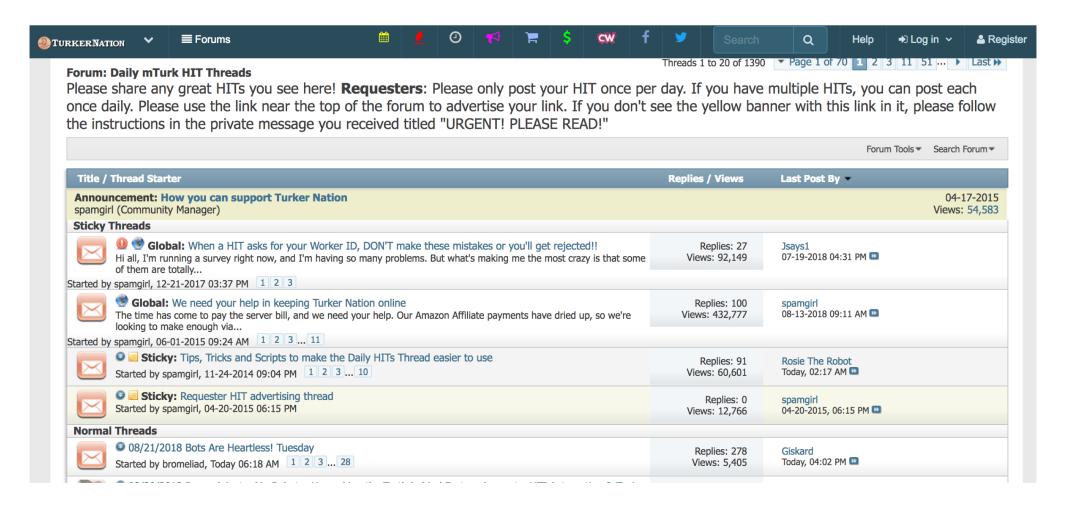
I have a community of turkers that we all chat together on a *video cam* so we *keep ourselves motivated* throughout the day with this interwoven community we've made.

## Discussion

What are the implications of this study?

Are there any limitations?

# Another Angle: Delve into the Digital Trace



# Purposes and Earnings

### Why do the work?

- Money
- "While I do find some of the HITS fun and actually learn an incredible amount by doing HITS, I do it for the cash."

### How much they earn in a year?

• \$1,179 to \$14,476.93. Rather low-paid!

### Why do they "choose this wage"?

- From primary income to make ends meet to supplementary
- A safety-net for some!

# Requester-Worker Relationship

- Asymmetric information: Workers share information on "requesters hall of fame/shame"
  - Good requesters: fair pay, quick approval, willing to communicate
  - Bad requesters: rejections without clear reasons, demeaning comments, unfair treatment
- Asymmetric power and limited communication (provided by the platform):
  - Requesters can reject work but workers can hardly appeal
  - Requesters can block workers but workers can't easily block requesters

## Invisible Work

- Search for good HITs / good requesters
- Learn how to best set up computers/ tools
- Learn how to best improve skills in a certain task
- Learn how to manage turking and record keeping

### Discussion

- Do you see any limitations of such methodology (i.e., ethnographic analysis of worker's digital trace)?
- Based on your own experience of being a worker in assignment 1, are there any other issues you see from the perspectives of workers?
- What else is missing from the current crowd work environment compared to traditional work environment?
- What are some possible improvements of the platform that you can envision based on what you read and have experienced?

## Next Class

- No reading!
- Create a HIT on MTurk
- Sign up as a requester on MTurk following the instructions "Be an MTurk Requester (Part 1)" before next class
- Bring laptops to class!