# Analyzing Crowd Workers in Mobile Pay-for-Answer Q&A

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# Mobile Pay-for-Answer Q&A





What's the name of an exercise device that looks like a jump rope....







### Seeking the wisdom of crowd using mobile phones

# Mobile Pay-for-Answer Q&A



### Real-time knowledge marketplace for mobile users

# **Mobile Pay-for-Answer Q&A**

ChaCha

## Chacha: > 4.5 billion questions (2012)



Jisiklog: > 19 million questions (2012)



Structured workflow for quality control Piece-rate pay on various micro-tasks

# Analyzing Crowd Worker Behaviors & Strategies

- 1. Key motivators of participation
- 2. Working strategies of experienced users
- 3. Longitudinal interaction dynamics

# Methodology

 18.8 million Q&As from Jisiklog (~ 60 months)

Survey study of 245 crowd workers in Jisiklog





# Analyzing Crowd Worker Behaviors & Strategies

- **1.** Key motivators of participation
- 2. Working strategies of experienced users
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# **Key Motivators of Answerers**

Financial	Major source of income Minor source of income	3%	67%
Intrinsic	Fruitful use of spare time Kill time Fun Helping others Learning	16% 30% 17% 26%	47%
Social & System	Level-up Acceptance rate Expert level Leaderboard	4% 5% 4% 2%	

#### Financial > Intrinsic >> Social (& system) factors

# **Key Motivators of Answerers**

### Any motivation differences?



Results: significant difference on minor income source, and fruitful use of spare time, but no significant difference on other major intrinsic factors, and social factors

Monetary incentive does not crowd-out intrinsic and social motivators in mobile pay-for-answer Q&A

# Analyzing Crowd Worker Behaviors & Strategies

- 1. Key motivators of participation
- 2. Working strategies of experienced users
  - Topic selection
  - Answering strategies
  - (Quality assessment)
- 3. Longitudinal interaction dynamics

## **Working Strategies: Topic Selection**

- Literature shows that in most Q&A services, answerers tend to focus on a few topics (say, computers, games)
- Will Jisiklog workers also focus on a few topics?

## **Working Strategies: Topic Selection**

- Measured a user's topical focus using entropy
  - User's avg entropy: 3.14 vs. entropy with random choice: 3.32
    - e.g., high entropy value = low topical focus
  - Entropy variation over time is within 0.05

# Crowd workers tend to respond to a broad range of topics, and this tendency is consistent over time

- Selectively choosing the type of questions to answer (e.g., based on expertise or difficulty)
- Effectively using various information resources (e.g., web search, Jisiklog, dedicated web services)
- Actively maintaining QA resources (e.g., bookmarks, summaries)
- 4. Developing thoughtful and sincere answers

1. Choosing the type of questions to answers (e.g., based on expertise or difficulty)

(Topical interest) Since I'm majoring in chemistry in college, I prefer answering science questions. I usually refer to my textbook and several online forums to answer questions.

(Easy questions) *I prefer answering easy questions like TV schedules, restaurant recommendation, SAT answers, etc.* 



### 2. Effectively using various info resources

**For study and college entrance related questions, I use search results from Naver KiN** and add some personal comments.

For direction and health questions, I use **Naver Map and Encyclopedia**.

For computer related questions, I use Naver KiN and Jisiklog.

I have **a list of dedicated web sites** for various kinds of questions.

- 3. Actively maintaining QA resources, e.g., bookmarks I came up with question categories and arranged the bookmarks of frequently visited web sites based on those categories.
- 4. Developing thoughtful and sincere answers
  - Instead of simply copying and pasting the answers from a web search, I try my best to explain the answer in detail such that if I were the askers, I could also easily understand the answer.

### Working Strategies: Answering Answer delay by crowd workers

- Answer delay = time difference between question pickup and answer posting
- Answer should be made within 3+1 minutes in Jisiklog



Much faster than conventional social Q&A (including mobile social Q&A)

## Working Strategies: Answering Answer delay by crowd workers

Experienced users tend to have smaller delay dispersion
Yet, individual differences are huge even among experienced users (due to <u>attitude differences</u> on knowledge sharing)



Speed is the most important thing; first pickup a question and answer as soon as possible

For direction questions I usually get directions from maps, but I would prefer giving more detailed answers based on my experience.

# Analyzing Crowd Worker Behaviors & Strategies

- 1. Key motivators of participation
- 2. Working strategies of experienced users
- 3. Longitudinal interaction dynamics
  - Working Patterns
  - Community Dynamics

## Longitudinal Interaction Dynamics: Working Patterns



Experienced workers invest lots of time Their working hours are dispersed over a day

## Longitudinal Interaction Dynamics: Community Dynamics



Stability of mobile pay-for-answer Q&A: high churning, but consistent contribution of top k% users

# Discussion

### Design implications:

- Sharing answering resources (e.g., bookmarks)
- Considering intrinsic/social motivations

### Research directions:

- Analyzing labor supply-demand dynamics
- Studying similar mobile pay-for-answer Q&A (e.g., ChaCha)
- Examining cultural differences



- Users are rarely motivated by social factors, but are more motivated by financial incentives and intrinsic factors
- Experienced users have fairly unique working strategies on topic selection, answer search, and answer quality assessment
- Even with high churning, the contribution of top-k% answerers is quite consistent over time