# In today's tutorial we focus mainly on







### Classification System for Human Computation

- Motivation
- Quality Control
- Aggregation
- Human Skill
- Process Order
- Task-request Cardinality

### Motivation

How can we motivate people to participate? Even with a low barrier to entry (anyone with an computer can contribute) we still need to make a case why they should contribute.

### Motivation: Pay

- Easiest way to recruit workers.
- Downside: provides incentive to cheat
- Problem might be exacerbated when the crowd workers are anonymous
- MTurk uses micropayments
- Online temping services provide higher wages: LiveOps, ODesk, etc
- CrowdFlower tried non-monetary payments (virtual goods and currencies, SwagBucks)

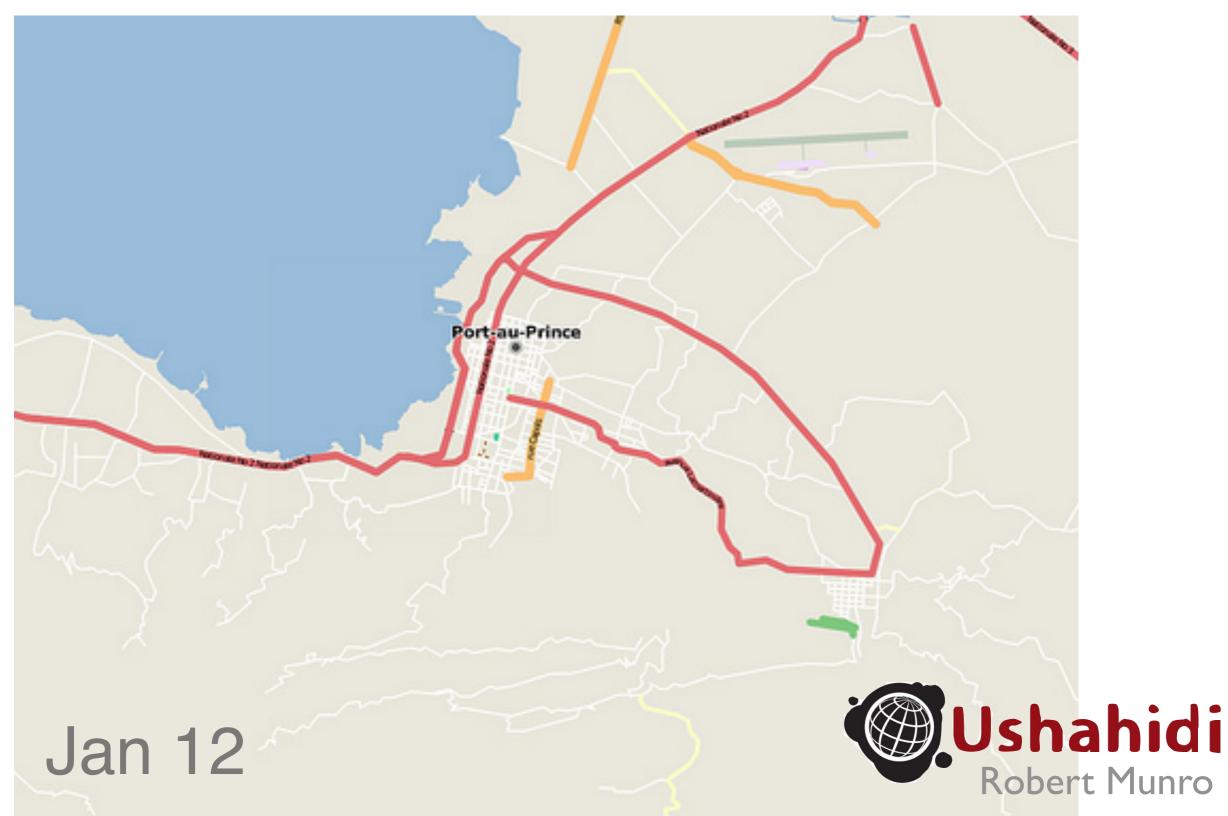
### Motivation: Altruism

- People want to do good
- When Jim Gray went missing, volunteers searched 500k satellite images
- After the Haitian earthquake, diaspora translated 1000 messages per day

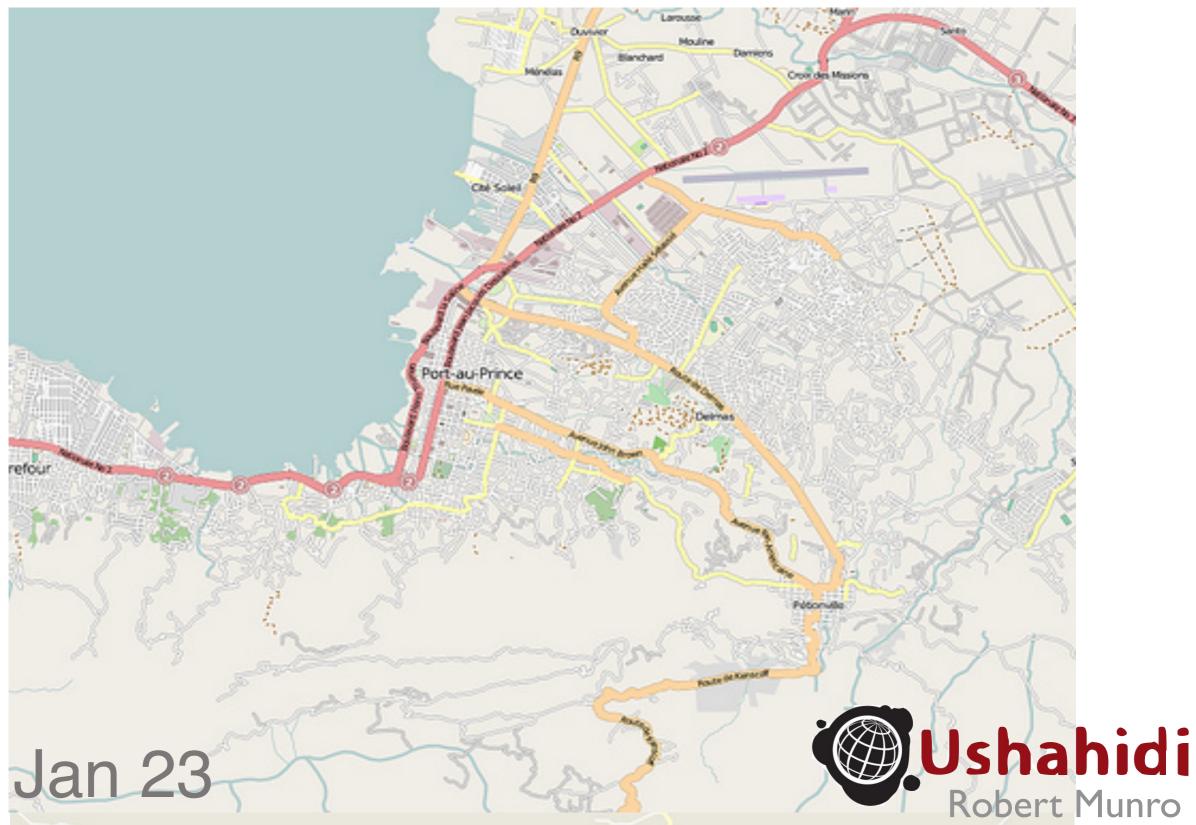
### 2010 Haitian Earthquake

### Disaster Response

#### The maps are bad



### Disaster Response Better maps from Crowdsourcing



### **Disaster Response** The responders don't speak Kreyol

- My family in Carrefour, 24 Cote • Fanmi mwen nan Kafou, 24 Cote Plage, 41A bezwen manje Plage,41A needs food and ak dlo water
- Moun kwense nan Sakre Kè nan Pòtoprens
- Ti ekipman Lopital General genyen yo paka minm fè 24 è
- Fanm gen tranche pou fè yon
   Undergoing children delivery pitit nan Delmas 31

- People trapped in Sacred Heart Church, PauP
- General Hospital has less than 24 hrs. supplies
- Delmas 31





### Motivation: Reputation

- Sometimes people will contribute in order to build their profile within a community
- Example: stackoverflow



Questions



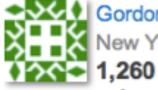
Users Tour

#### Users

reputation

new us

Type to find users:



Gordon Linoff New York, United States sql, mysql, sql-server



java, spring, spring-mvc



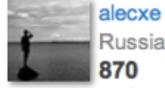
Arun P Johny Bangalore, India 960 jquery, javascript, html



Jon Skeet Reading, United Kingdom 915 c#, java, .net



Hans Passant Madison, WI 905 c#, .net, winforms



Russia 870 python, django, scrapy



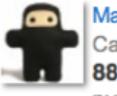
falsetru Seoul, South Korea 800

python, regex, ruby



BalusC Willemstad, Curaçao 855 java, jsf, jsf-2





Martijn Pieters Cambridge, United Kingdom 880 python, python-2.7, list

0	dasblir
Ð	United
	825
	c#, c+

nkenlight States +, java

arshajii Boston, MA 777 java, python, string

# Motivation: Enjoyment

- Games with a purpose is a strategy to try to make a task fun
- In the ESP game two players look at an image and try to guess what words the other is thinking
- In doing so they label images on the web

score



time
2:21

### What do you see?

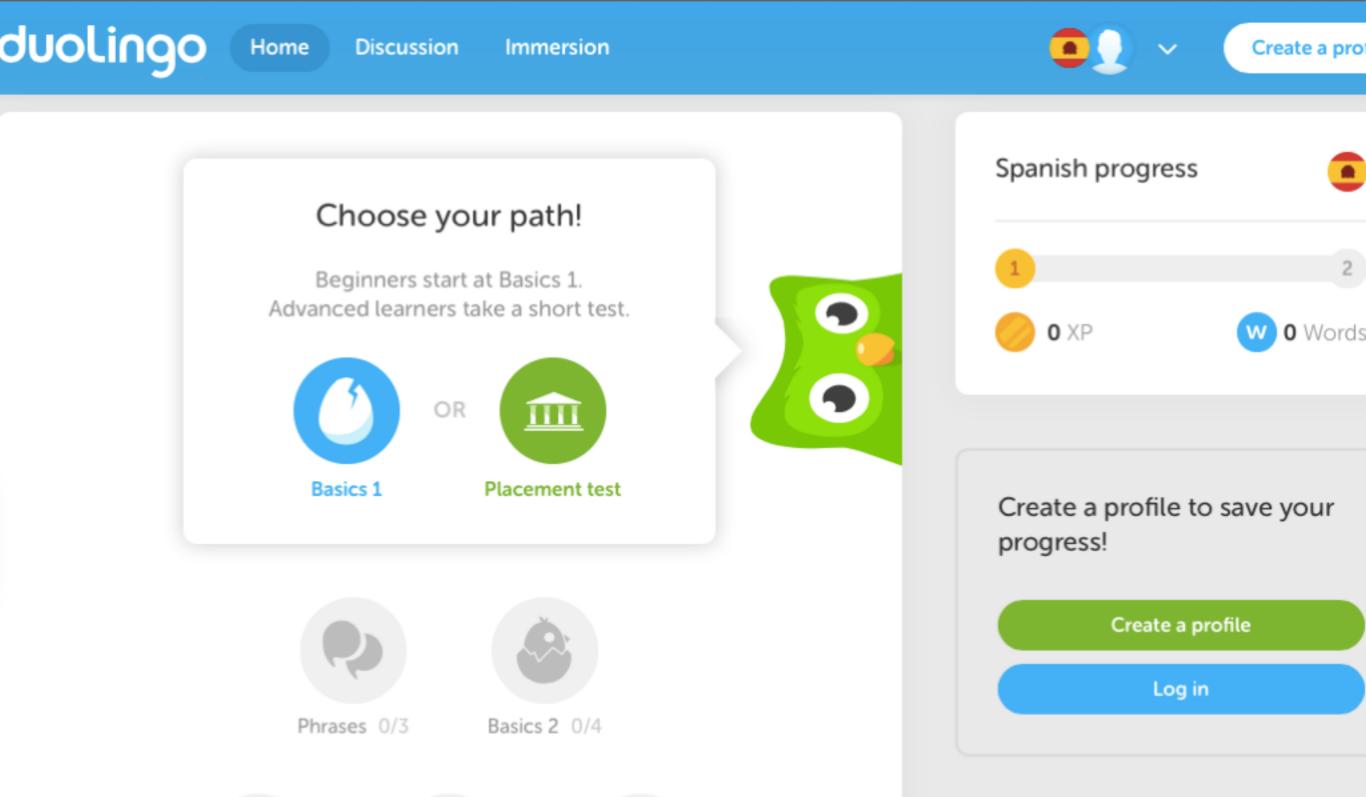
taboo words

peace lay

P



guesses sheeps... sheep  $\mathbb{P}$ submit ⇒ pass



Follow Duolingo

f 300k

90k

.

g+ 70k











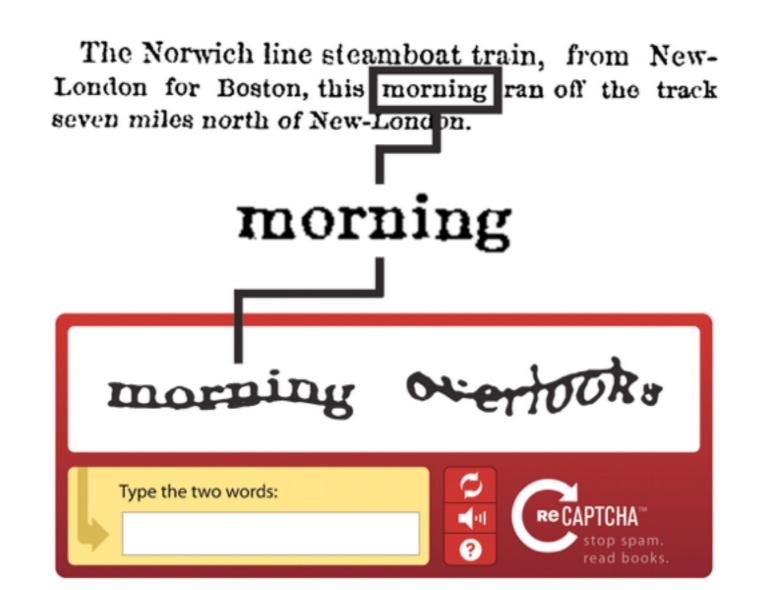
#### Luis Von Ahn == Tom Sawyer



Tom Sawyer (Whitewashing the Fence), 1936

### Motivation: Implicit Work

 It is sometimes possible to make people do work alongside some other task



### Motivation

- Pay
- Altruism
- Reputation
- Enjoyment
- Implicit Work
- Can you think of others?

### Quality Control

Even if people are motivated to participate, how do we know that they are doing work conscientiously? Can we trust them not to cheat or sabotage the system? Even if they are acting in good faith, how do we know that they're doing things right?

# Quality Control

- Reputation check
- Agreement and redundancy
- Gold standard + automatic reviewing
- Multi-level review
- Defensive task design
- Statistical filtering
- Economic incentives

### Aggregation

Part of the process of human computation is to combine all contributions to solve a global problem. The class of problem may determine what strategy is best.

# Aggregation

- Wisdom of Crowds
- Collection
- Search
- Iterative improvement
- None?

### Human Skill

"Human Computation is a paradigm for utilizing human processing power to solve problems that computers cannot yet solve." –Luis von Ahn. Doctoral Thesis, 2005.

### Human Skill

- Visual recognition
- Language understanding
- Translation
- Reasoning
- What other skills might be useful for human computation tasks?

### Process order

- Three roles in Human Computation: Requester, Worker, Computer
- **Requester** is the end user who benefits from the computation
- Worker is the person performing the task
- **Computer** only comes into play when it plays a role in solving the problem (not just aggregating results or being the information channel)

### Task-Request Cardinality

When a service is powered by human computation, many human workers may produce the result. Sometimes, just one or a few workers may suffice. The structure of the problem dictates the cardinality.

### Task-Request Cardinality

- One-to-one: ChaCha question answering
- Many-to-many: Image labeling / search
- Many-to-one: Search for Jim Gray
- Few-to-one: VizWiz has a few people respond to each blind person's query