

Singapore-ETH Centre Future Cities Laboratory Talk 22 August 2013









#### Australian Government

Department of Broadband, Communications and the Digital Economy

Australian Research Council

#### **NICTA Funding and Supporting Members and Partners**













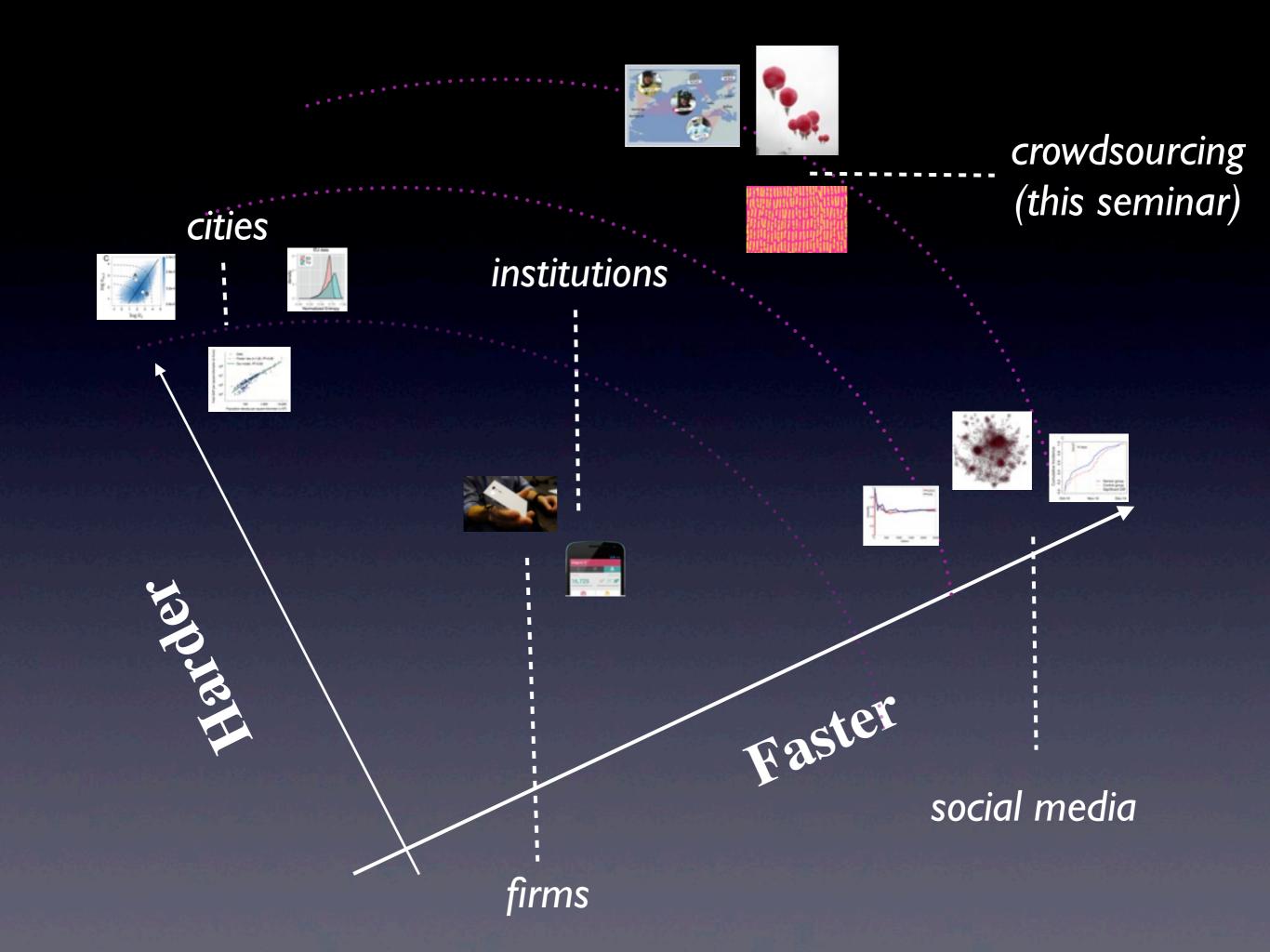








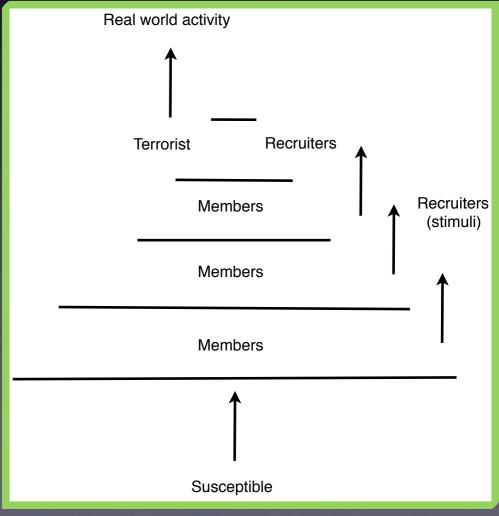


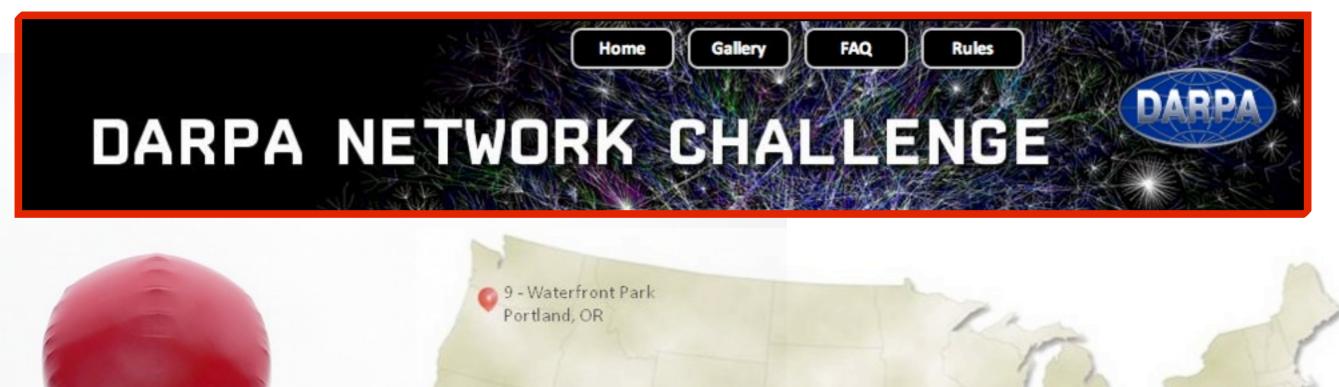






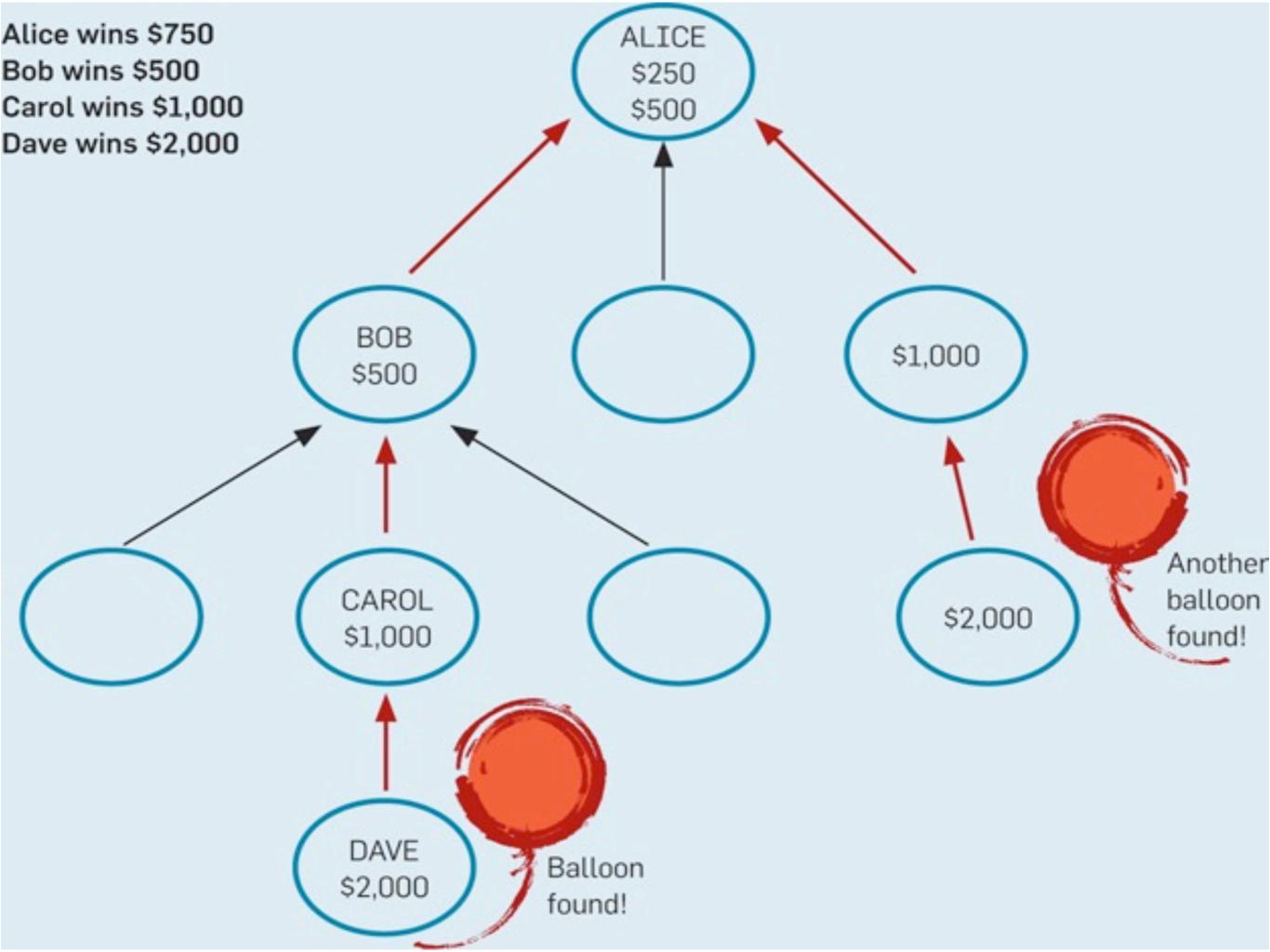




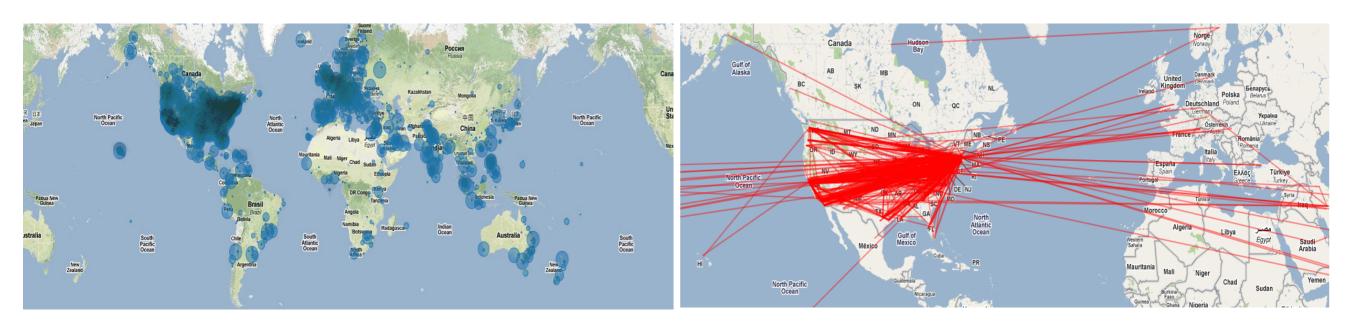


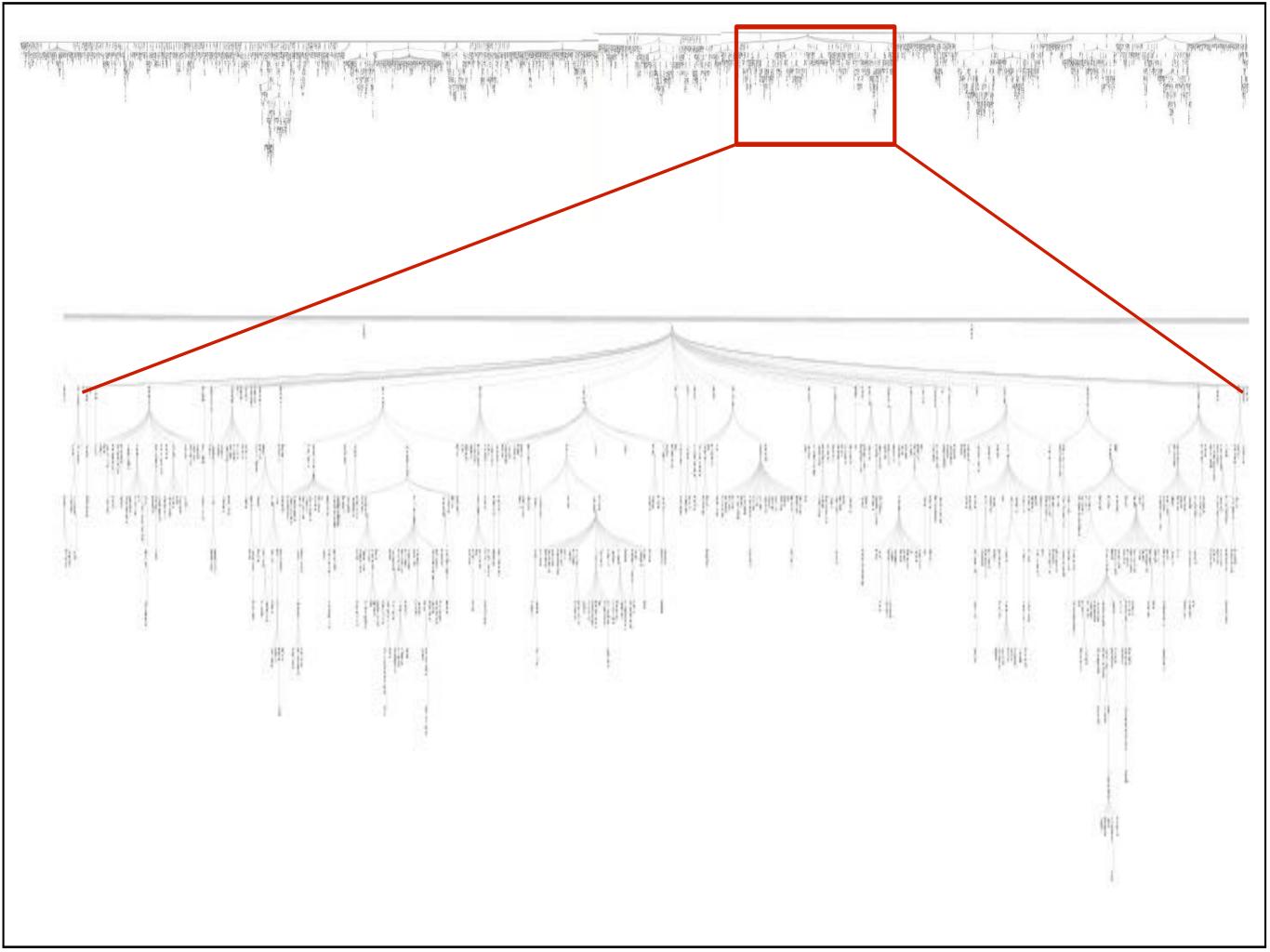












### **Time-Critical Social Mobilization**

Galen Pickard, 1,2\* Wei Pan, 1\* Iyad Rahwan, 1,3\* Manuel Cebrian, 1\* Riley Crane, 1 Anmol Madan, 1 Alex Pentland 1

The World Wide Web is commonly seen as a platform that can harness the collective abilities of large numbers of people to accomplish tasks with unprecedented speed, accuracy, and scale. To explore the Web's ability for social mobilization, the Defense Advanced Research Projects Agency (DARPA) held the DARPA Network Challenge, in which competing teams were asked to locate 10 red weather balloons placed at locations around the continental United States. Using a recursive incentive mechanism that both spread information about the task and incentivized individuals to act, our team was able to find all 10 balloons in less than 9 hours, thus winning the Challenge. We analyzed the theoretical and practical properties of this mechanism and compared it with other approaches.

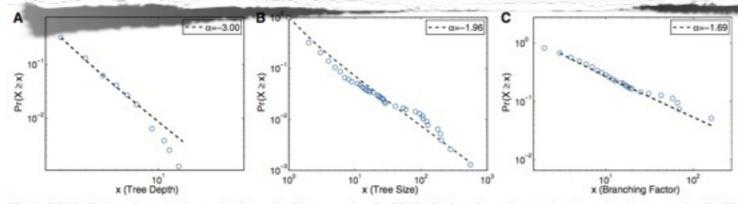


Fig. 1. (A) Distribution of tree depth on a log-log scale with a power law fit. (B) Distribution of tree size on a log-log scale with a power law fit. (C) Distribution of the branching factor on a log-log scale with a power law fit.

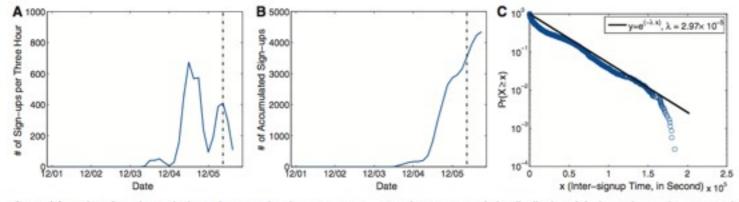


Fig. 2. (A) Number of people recruited over time up to the winner announcement. The dotted line indicates the time the balloons were launched into their positions by DARPA. (B) Cumulative number of people recruited over time. (C)

Complementary cumulative distribution of the inter—sign-up time on a semilog scale with an exponential fit. Shown is a larger-than-exponential drop off at the end of the graph, wich is due to the time-critical nature of the task.

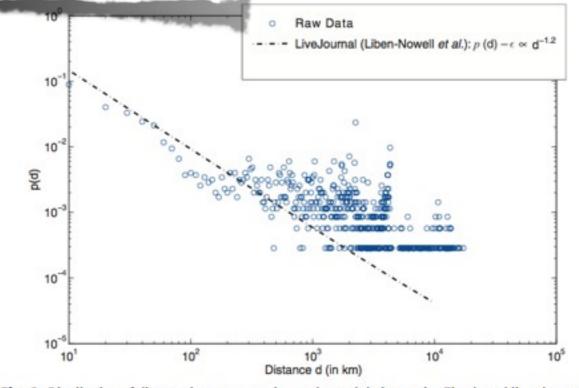


Fig. 3. Distribution of distance between recruiter nodes and their recruits. The dotted line shows the best-fit rank-based friendship model by Liben-Nowell et al. (30). We apply the same treatment to our data points as in Liben-Nowell et al. by rounding distances to multiples of 10 km. Approximate geographic locations were discovered from users' Internet provider addresses during sign-up.

### Limits of social mobilization

Alex Rutherford<sup>a</sup>, Manuel Cebrian<sup>b,c</sup>, Sohan Dsouza<sup>a</sup>, Esteban Moro<sup>d,e</sup>, Alex Pentland<sup>f</sup>, and Iyad Rahwan<sup>a,g,1</sup>

<sup>a</sup>Computing and Information Science, Masdar Institute of Science and Technology, Abu Dhabi 54224, United Arab Emirates; <sup>b</sup>Department of Computer Science and Engineering, University of California at San Diego, La Jolla, CA 92093; <sup>c</sup>National Information and Communications Technology Australia, Melbourne, VIC 3010, Australia; <sup>d</sup>Departmento de Matemáticas and Grupo Interdisciplinar de Sistemas Complejos, Universidad Carlos III de Madrid, 28911 Madrid, Spain; <sup>e</sup>Instituto de Ingeniería del Conocimiento, Universidad Autónoma de Madrid, 28049 Madrid, Spain; <sup>f</sup>Media Laboratory, Massachusetts Institute of Technology, Cambridge, MA 02139; and <sup>g</sup>School of Informatics, University of Edinburgh, Edinburgh EH8 9AB, United Kingdom

Edited\* by Jon Visionard, Cornell University, Ithaca, NY, and approved March 1, 2013 (received for review Contamb

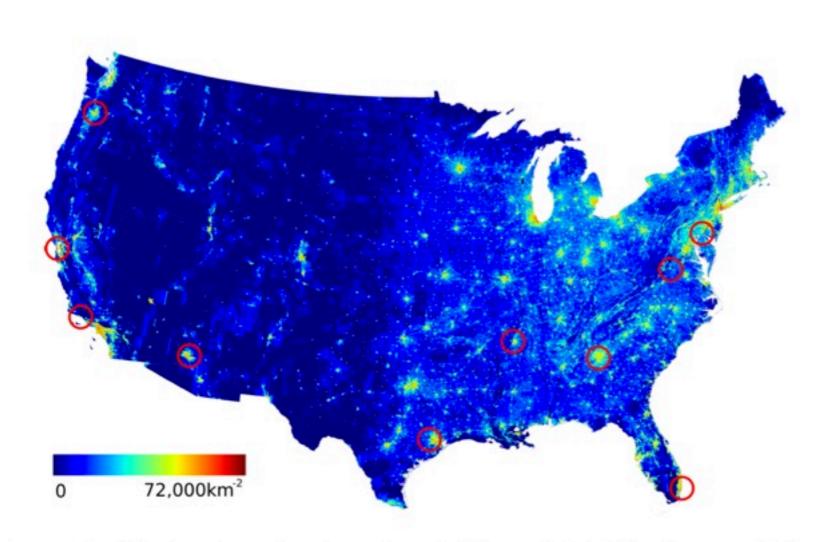
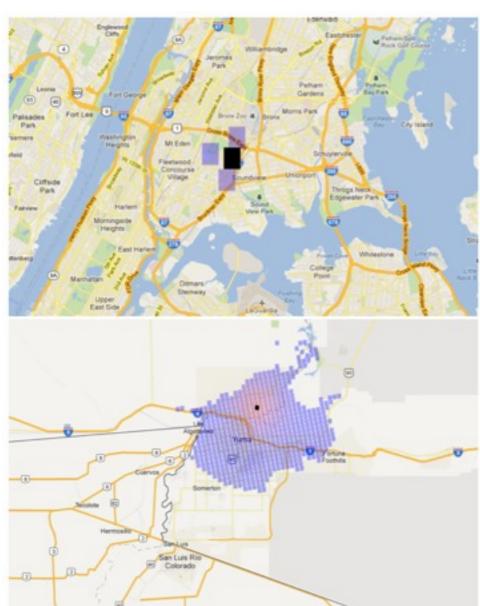


Figure 1: Map of Population Density (logarithmic scale, per km<sup>2</sup>) Across Mainland USA and Locations of Balloons in Red Balloon Challenge. (Lambert Azimuthal Equal Area Projection)



#### Limits of social mobilization Alex Rutherforda, Manuel Cebrianb,c, Sohan Dsouza, Esteban Morod,e, Alex Pentland, and Iyad Rahwana,g,1 <sup>a</sup>Computing and Information Science, Masdar Institute of Science and Technology, Abu Dhabi 54224, United Arab Emirates; <sup>b</sup>Department of Computer Science and Engineering, University of California at San Diego, La Jolla, CA 92093; "National Information and Communications Technology Australia, Melbourne, VIC 3010, Australia; dDepartamento de Matemáticas and Grupo Interdisciplinar de Sistemas Complejos, Universidad Carlos III de Madrid, 28911 Madrid, Spain; "Instituto de Ingeniería del Conocimiento, Universidad Autónoma de Madrid, 28049 Madrid, Spain; Media Laboratory, Massachusetts Institute of Technology, Cambridge, MA 02139; and 9School of Informatics, University of Edinburgh, Edinburgh EH8 9AB, United Kingdom Edited\* by Jon Visionard, Cornell University, Ithaca, NY, and approved March 1, 2013 (received for review Sentemb BLENDABILITY 0.250.200.150.10 0.05 0.00 400 600 800 1000 1200 1400 1600 1800 $t_{complete}(days)$ heavy-tail 0.05 $0.00^{L}_{0}$ Red Bank $t_{complete}(days) \\$ Astur Par POPULATION 72,000km² 0.1 SEARCHABILITY 0.8 9 Searchability Blendability Findability 0.4 0.2 Population= [1,100-13,500] 0.0 BLENDABILITY FINDABILITY 10 100 1000 10000 Population

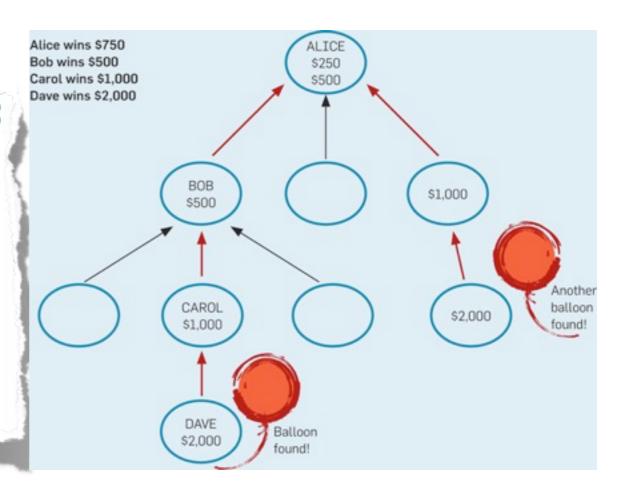
STOC'12, May 19–22, 2012, New York, New York, USA. Copyright 2012 ACM 978-1-4503-1245-5/12/05 ...\$10.00.

### Finding Red Balloons with Split Contracts: Robustness to Individuals' Selfishness

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Andrea Vattani UC San Diego 9500 Gilman Drive La Jolla, CA 92093 avattani@cs.ucsd.edu Lorenzo Coviello UC San Diego 9500 Gilman Drive La Jolla, CA 92093 Icoviell@ucsd.edu

Panagiotis Voulgaris Google Inc. 1600 Amphitheatre Parkway Mountain View, CA 94043 voulg@google.com

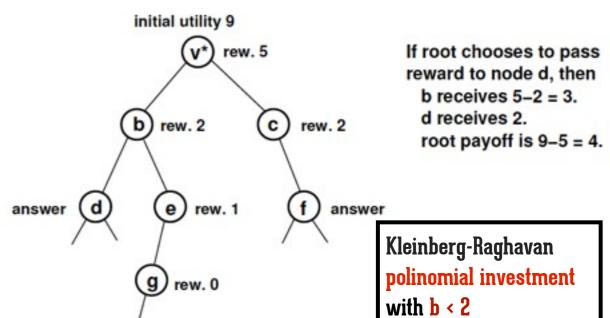


Theorem 15 (Efficiency). Consider any Galton-Watson branching process with b > 1. Then, at equilibrium, the root retrieves the answer with probability at least  $\sigma = 1 - \zeta$  provided an investment of

$$r^* = rac{4}{\epsilon} \cdot \max \left\{ rac{1}{b-1}, rac{1}{\epsilon} \cdot rac{1}{1-\Psi'(\zeta)} 
ight\} \cdot h_{\Psi}(\epsilon, n).$$

In the case of a ray, with b=1 and  $c_0=\zeta=0$ , an insert of  $r^*=4\cdot\frac{n}{\epsilon^2}\cdot h_\Psi(\epsilon,n)=4\cdot\frac{n^2}{\epsilon^2}\ln\frac{1}{\epsilon}$  suffices.

## linear investment in any arbitrary Galton-Watson process with b > 1



Finding 10 balloons across the U.S. illustrates how the Internet has changed the way we solve highly distributed problems.

BY JOHN C. TANG, MANUEL CEBRIAN, NICKLAUS A. GIACOBE, HYUN-WOO KIM, TAEMIE KIM, AND DOUGLAS "BEAKER" WICKERT

# Reflecting on the DARPA Red Balloon Challenge

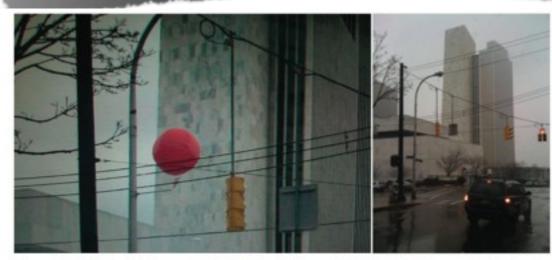
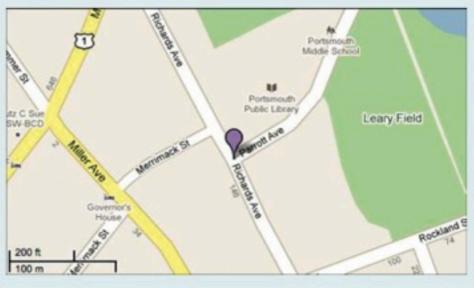


Figure 5. Fabricated photo posted during the challenge (left) (http://twitpic.com/s9kun) and photo taken by a pre-recruited observer in Albany, NY (right).

Figure 3. Typical real (top) and false (bottom) locations of balloons, with bottom map depicting five submissions with identical locations.





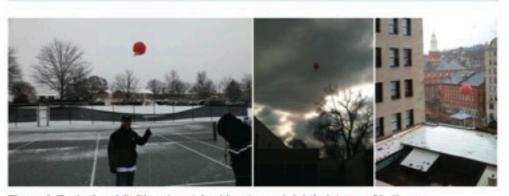


Figure 4. Typical real (left) and contrived (center and right) pictures of balloons.



Comment by <u>LittleDagny</u> on December 3, 2009 at 11:09pm Other teams we need to infiltrate!!

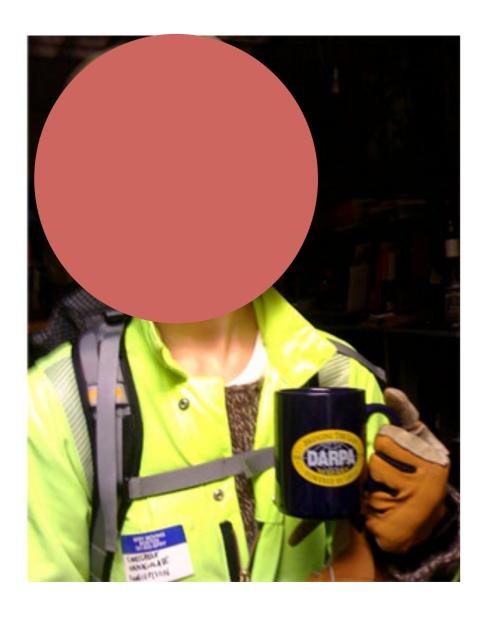
http://balloon.media.mit.edu/ - the MIT team

http://balloonfinder.superfunhappy.com/doku.php

http://theredballoons.com/ - seems pretty dead-ish

http://www.darpaballoon.com/ - Stiff competition, they even have "outreach posts" for facebook, myspace, twitter, etc.

http://www.ispyaredballoon.com/ - Georgia Tech's group







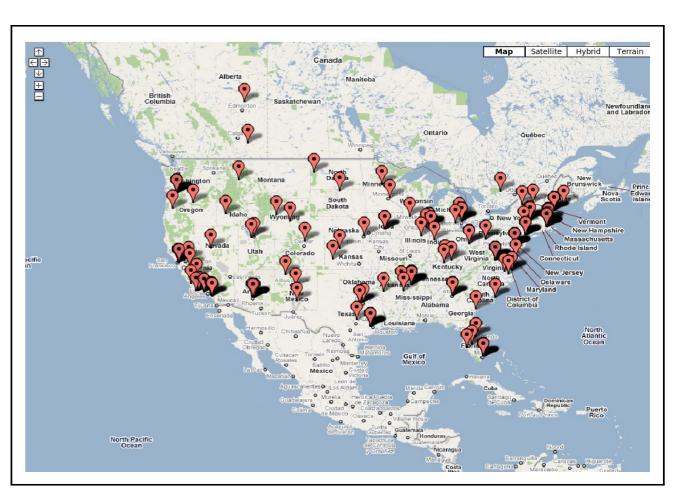
#### someone else's balloon



Darpa red balloon challenge going on... a friend of mine in Boulder sent this pic to me... wow, hope they win!

We had a good time romping about and sending balloons up in Cambridge, Belmont, Somerville and some other places. We didn't have time to stick around and pretend to be DARPA employees, but once back home, we uploaded some photos from iphones with hacked exif data to modify the GPS coordinates.





(a) Correct Locations

(b) Submissions

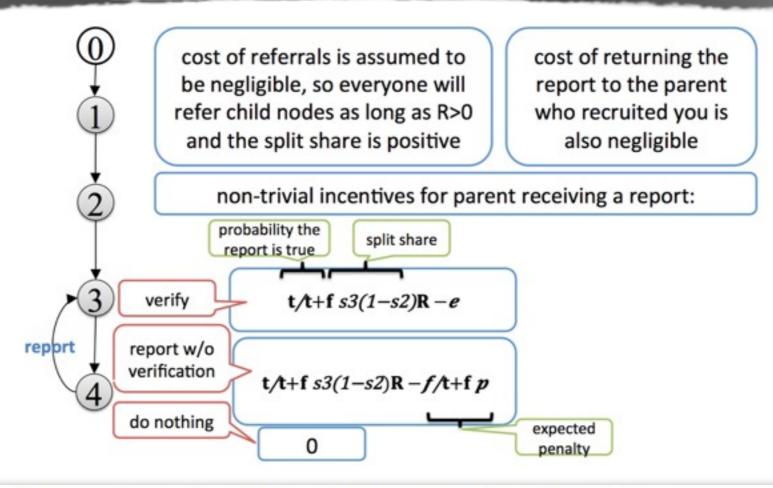
85% of submissions were incorrect.



### Verification in Referral-Based Crowdsourcing

Victor Naroditskiy<sup>1</sup>\*, Iyad Rahwan<sup>2,3</sup>, Manuel Cebrian<sup>4,5</sup>, Nicholas R. Jennings<sup>1,6</sup>

1 Electronics and Computer Science, University of Southampton, Southampton, United Kingdom, 2 Masdar Institute of Science and Technology, Abu Dhabi, United Arab Emirates, 3 School of Informatics, University of Edinburgh, Edinburgh, United Kingdom, 4 Department of Computer Science and Engineering, University of California at San Diego, La Jolla, California, United States of America, 5 National Information and Communications Technology Australia, Melbourne, Victoria, Australia, 6 Department of Computing and Information Technology, King Abdulaziz University, Jeddah, Saudi Arabia



**Proposition 2.** The minimum reward sufficient to encourage participation of node i is

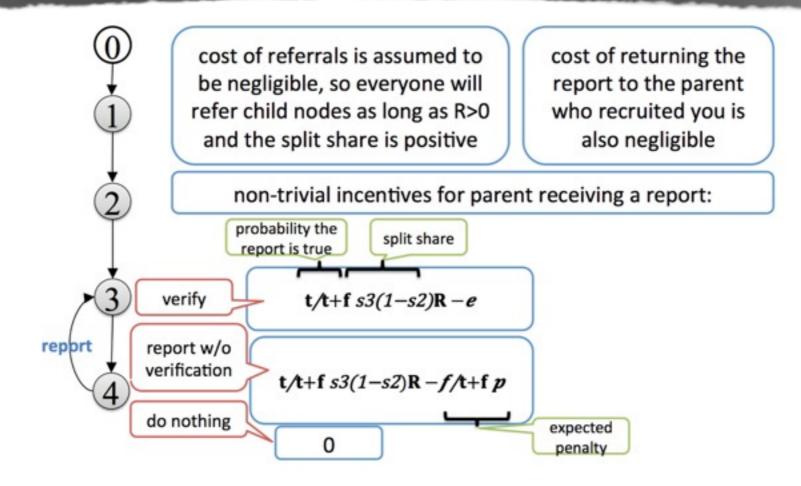
$$r_i^{\min} = e \frac{t+f}{(1-s_{i-1})s_i t} = \frac{e}{(1-s_{i-1})s_i} (1+\frac{f}{t})$$
 (3)



### Verification in Referral-Based Crowdsourcing

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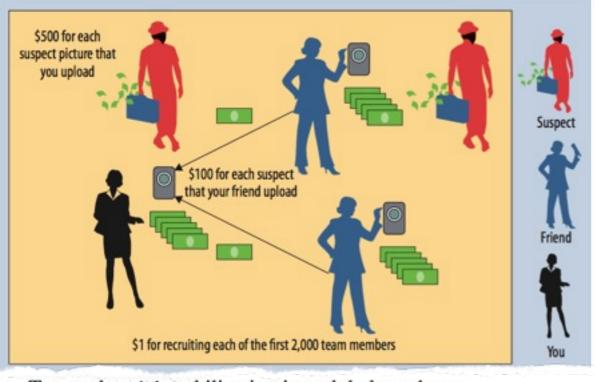
1 Electronics and Computer Science, University of Southampton, Southampton, United Kingdom, 2 Masdar Institute of Science and Technology, Abu Dhabi, United Arab Emirates, 3 School of Informatics, University of Edinburgh, Edinburgh, United Kingdom, 4 Department of Computer Science and Engineering, University of California at San Diego, La Jolla, California, United States of America, 5 National Information and Communications Technology Australia, Melbourne, Victoria, Australia, 6 Department of Computing and Information Technology, King Abdulaziz University, Jeddah, Saudi Arabia



**Theorem 1.** The  $\frac{1}{2}$ -split contract minimizes the reward required to recover the answer.









#### Targeted social mobilization in a global manhunt

Alex Rutherford <sup>1,\*</sup>, Manuel Cebrian <sup>3,4,\*</sup>, Iyad Rahwan <sup>1,2,\*,†</sup>, Sohan Dsouza <sup>1</sup>, James McInerney <sup>5</sup>, Victor Naroditskiy <sup>5</sup>, Matteo Venanzi <sup>5</sup>, Nicholas R. Jennings <sup>5</sup>, J.R. deLara <sup>6</sup>, Eero Wahlstedt <sup>7</sup>, Steven U. Miller <sup>8</sup>

<sup>5</sup>Computing and Information Science, Masdar Institute of Science and Technology, Abu Dhabi 54224, UAE; <sup>2</sup>School of Informatics, University of Edinburgh, Edinburgh EH8 9AB, UK; <sup>3</sup>National Information and Communications Technology Australia, Melbourne, Victoria 3010, Australia; <sup>4</sup>Department of Computer Science and Engineering, University of California at San Diego, La Jolla, CA 92093, USA; <sup>5</sup>School of Electronics and Computer Science, University of Southampton, Southampton SO17 1BJ, UK; <sup>6</sup>George Washington University, Washington DC 20052, USA; <sup>7</sup>University of Oxford, Oxford OX1 2JD, UK; <sup>8</sup>Champlain College, Burlington, VT 05401, USA

\*A.R., M.C., and I.R. contributed equally to this work.

To who and a mondager of the addressed Empile igahwan@acm.org



FOR IMMEDIATE RELEASE April 4, 2012 www.tag-challenge.com tagchallenge@gmail.com

#### Crowdsourcing contest ends with partial victory for MIT team

Simulated person search sheds light on reach of social media; Winning team locates "suspects" in three out of five cities in a single day.

Washington, D.C. – The 2012 TAG Challenge drew competition from teams across North America, Europe, and the Middle East, as participants organized online in an effort to locate five fictitious "jewel thieves" in the U.S. and Europe.

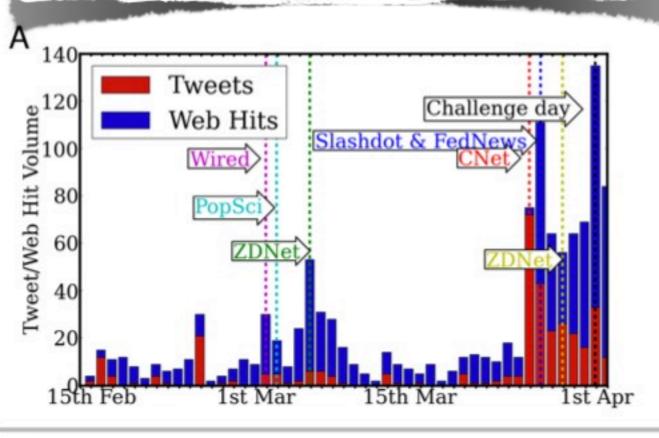
The best performing team, the MIT-affiliated CrowdScanner, found suspects in Bratislava, Washington DC, and New York City, and submitted their photographs to the contest website by 7:17pm EST, 17 hours after the contest began.

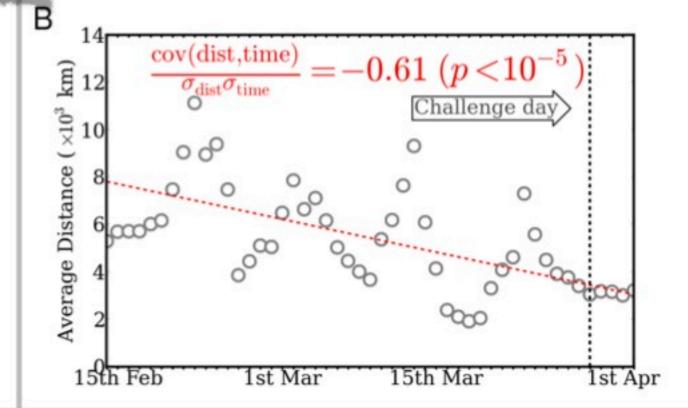
#### Targeted social mobilization in a global manhunt

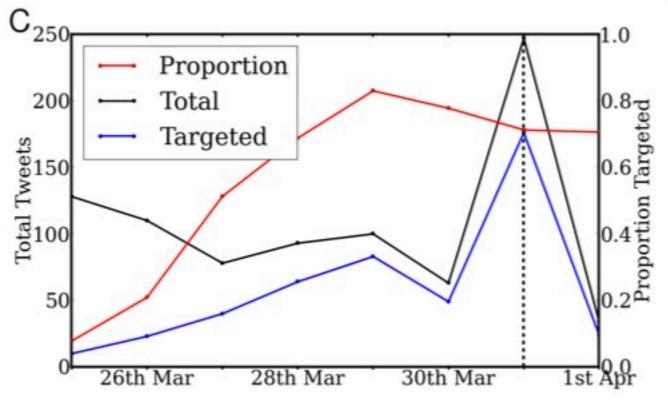
Alex Rutherford <sup>1,\*</sup>, Manuel Cebrian <sup>3,4,\*</sup>, Iyad Rahwan <sup>1,2,\*,†</sup>, Sohan Dsouza <sup>1</sup>, James McInerney <sup>5</sup>, Victor Naroditskiy <sup>5</sup>, Matteo Venanzi <sup>5</sup>, Nicholas R. Jennings <sup>5</sup>, J.R. deLara <sup>6</sup>, Eero Wahlstedt <sup>7</sup>, Steven U. Miller <sup>8</sup>

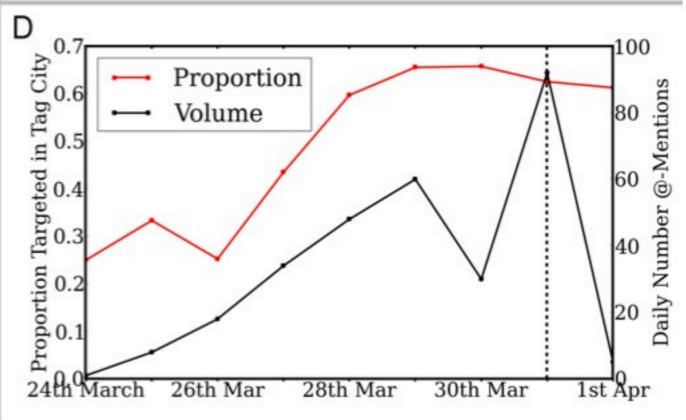
<sup>1</sup>Computing and Information Science, Masdar Institute of Science and Technology, Abu Dhabi 54224, UAE; <sup>2</sup>School of Informatics, University of Edinburgh, Edinburgh EH8 9AB, UK; <sup>3</sup>National Information and Communications Technology Australia, Melbourne, Victoria 3010, Australia; <sup>4</sup>Department of Computer Science and Engineering, University of California at San Diego, La Jolla, CA 92093, USA; <sup>5</sup>School of Electronics and Computer Science, University of Southampton, Southampton SO17 1BJ, UK; <sup>6</sup>George Washington University, Washington DC 20052, USA; <sup>7</sup>University of Oxford, Oxford OX1 2JD, UK; <sup>8</sup>Champlain College, Burlington, VT 05401, USA

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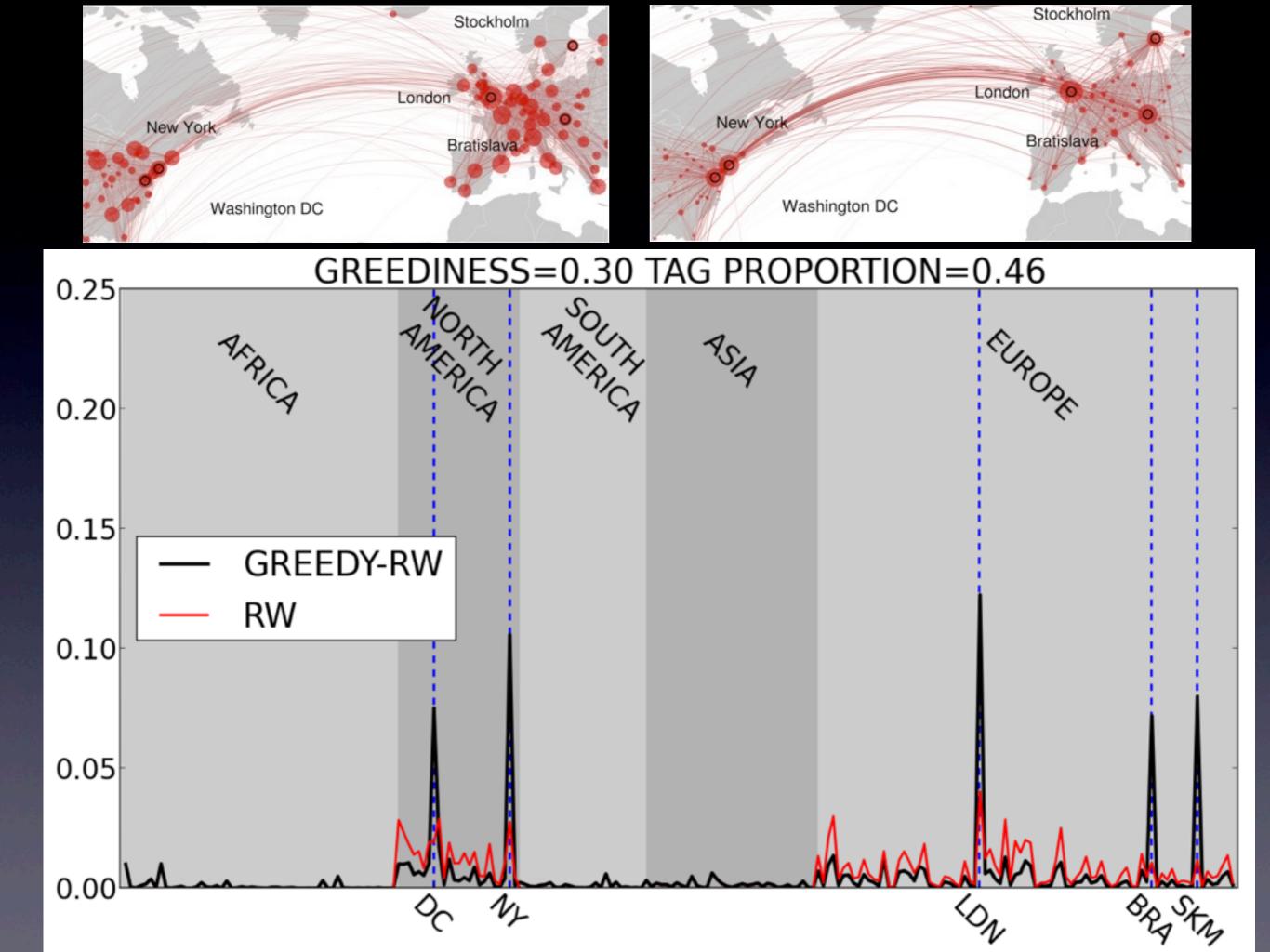






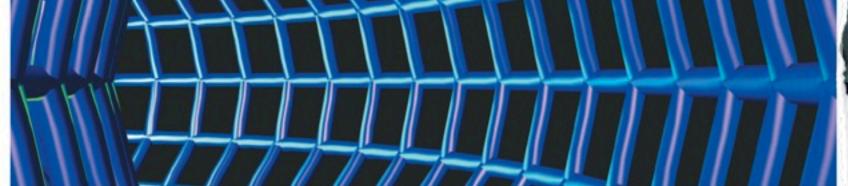


<sup>&</sup>quot;A.R., M.C., and I.R. contributed equally to this work.









# Global Manhunt Pushes the Limits of Social Mobilization

Iyad Rahwan, Sohan Dsouza, and Alex Rutherford, Masdar Institute of Science & Technology, UAE

Victor Naroditskiy, James McInerney, Matteo Venanzi, and Nicholas R. Jennings University of Southampton, UK

Manuel Cebrian, National ICT Australia and Massachusetts Institute of Technology

Mighty enemies!

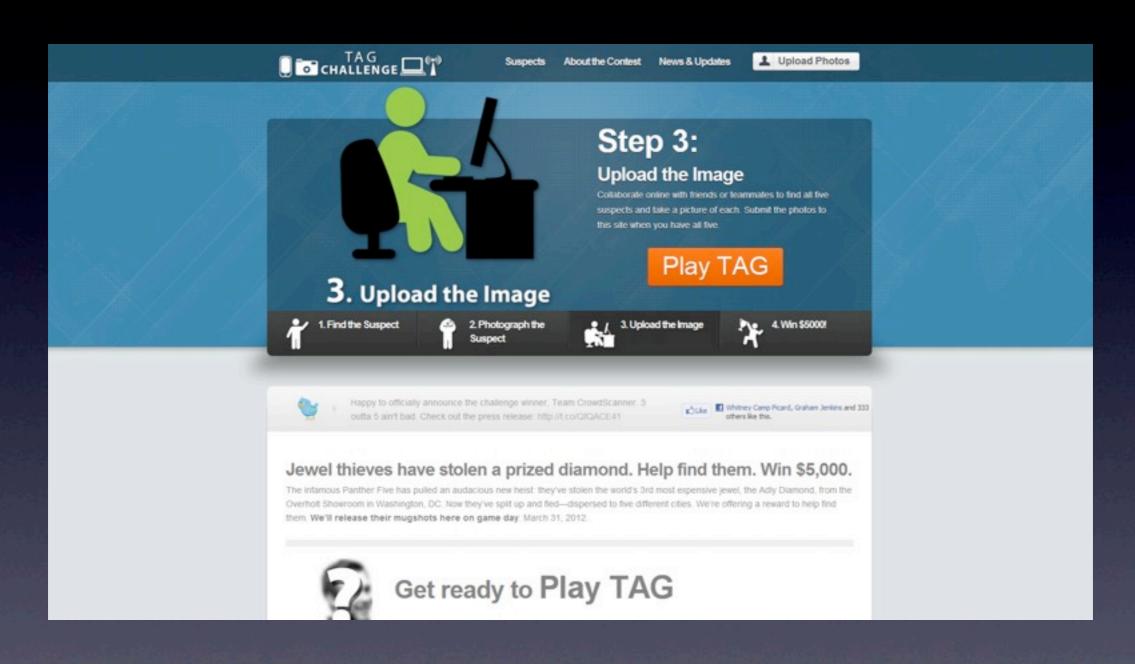
Zachary Rabold

Gilbert Watson

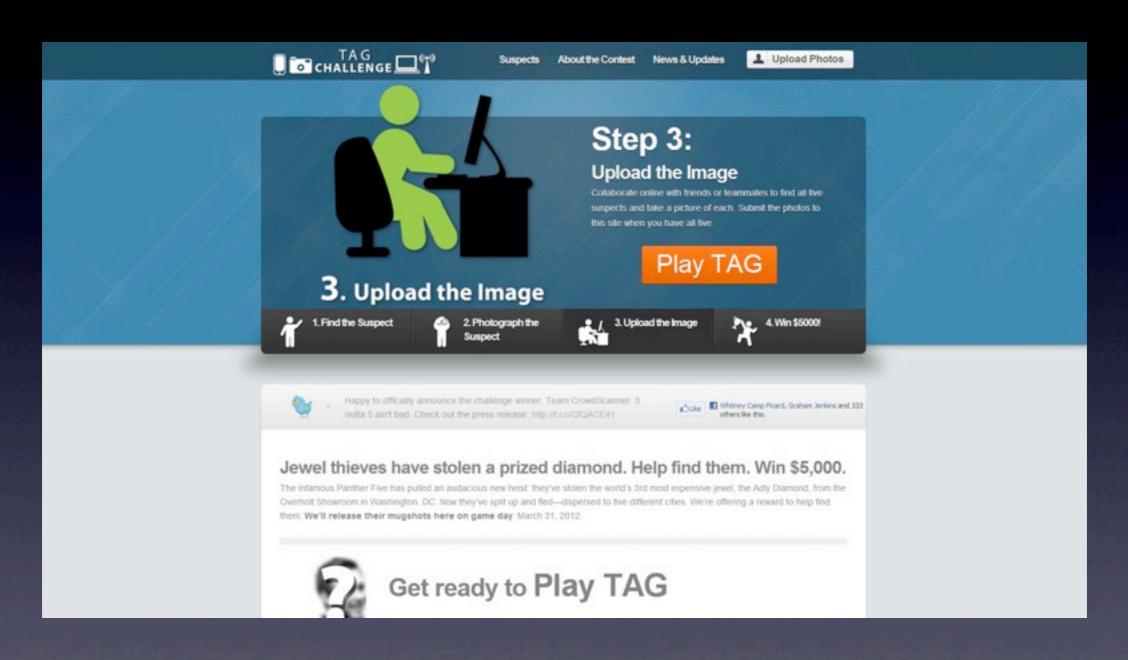
Institute for Defense Analyses

2\_\_\_3

### Official Website: www.tag-challenge.com



### Our Website: www.tag-challenge.org



### Twitter Spoofing



A contest to test social media in international public safety: Find 5 jewel thieves in 5 cities, win \$5,000. March 31, 2012. DC-NYC-London-Stockholm-Bratislava.

http://tag-challenge.com

Followed by TagTeam (Back Again) and Graham Jenkins .

143	204	37
TWEETS	FOLLOWING	FOLLOWERS



TAG Challenge @TAG\_challenge 3 Apr

RT @dagrier: Pop Sci has has nice summary of
@TAGChallenge #crowdsourcing contest of last Saturday at
bit.ly/HRy7mA

TAG Challenge @TAG\_challenge 1 Apr

With three suspects found and photographed by 7:17pm

EST, Team Crowdscanner has won TAG Challenge!

Congratulations!



A contest to test social media in international public safety: Find 5 jewel thieves in 5 cities, win \$5,000. March 31, 2012. DC-NYC-London-Stockholm-Bratislava.

http://tag-challenge.com

Followed by TagTeam (Back Again), EM Simpson, Graham Jenkins and Danger Room.

229	189	119
TWEETS	FOLLOWING	FOLLOWERS

TAG Challenge @TAGchallenge 4 Apr
Happy to officially announce the challenge winner, Team
CrowdScanner. 3 outta 5 ain't bad. Check out the press
release: ow.ly/a55I5
Details

TAG Challenge @TAGchallenge 1 Apr
With three suspects found and photographed by 7:17pm
EST, Team Crowdscanner has won TAG Challenge!
Congratulations!
Details

TAG Challenge @TAGchallenge 1 Apr Suspects were located in NYC, DC, and Bratislava. Thanks to all those who participated. Official press release to follow. Details

### **Discredit**



### TagTeam (Back Again) @TagTeam\_

27 Mar

Don't help amateur comedians, help @TagTeam\_ win @TAG\_challenge this weekend. tagteambackagain.com cc:@sohandsouza #buschleague Expand



### TagTeam (Back Again) @TagTeam\_

28 Mar

- @abdulapopoola #buschleague refers to the former second tier of the great American sport of NASCAR. Join @TagTeam\_ for the @TAG\_challenge
- View conversation



### TagTeam (Back Again) @TagTeam\_

31 Mar

- @TeamRave Why would I care about tweets to your whopping 16 followers #posers #DARPAleftovers
- View conversation

### **Discredit**



Zack Rabold @ThisIsTheZemix

31 Mar

Help upset the #"pros" @CrowdScannerHQ by finding this girl @Starbucks #NationalMall #DC #CherryBlossoms @TagTeam\_pic.twitter.com/UBC7xd7x

View photo



Zack Rabold @ThisIsTheZemix

31 Mar

It's still #MarchMadness - help @TagTeam\_ upset the #NuttyProfessors at @CrowdScannerHQ find her and DM us pic.twitter.com/ss84Tn2A



Zack Rabold @ThisIsTheZemix

31 Mar

Hey #DC - help @TagTeam\_ defend our hometurf and defeat the #NuttyProfessors at @CrowdscanningHQ #99percent pic.twitter.com/EazpRy7j

View photo



Zack Rabold @ThisIsTheZemix

31 Mar

I thought @CrowdScannerHQ was going to solve this in #onehour #BuschLeague

Expand

### **Discredit**



### TagTeam (Back Again) @TagTeam\_

27 Mar

Don't help amateur comedians, help @TagTeam\_ win @TAG\_challenge this weekend. tagteambackagain.com cc:@sohandsouza #buschleague Expand



### TagTeam (Back Again) @TagTeam\_

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- @abdulapopoola #buschleague refers to the former second tier of the great American sport of NASCAR. Join @TagTeam\_ for the @TAG\_challenge
- View conversation

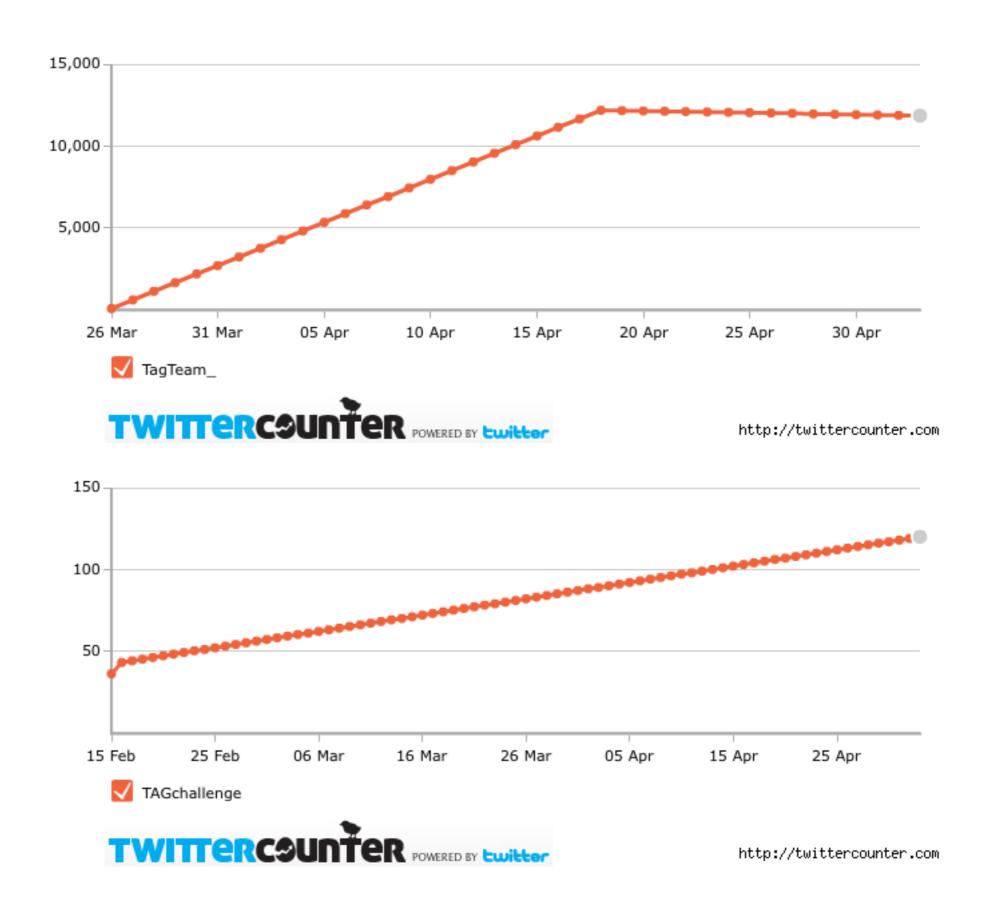


### TagTeam (Back Again) @TagTeam\_

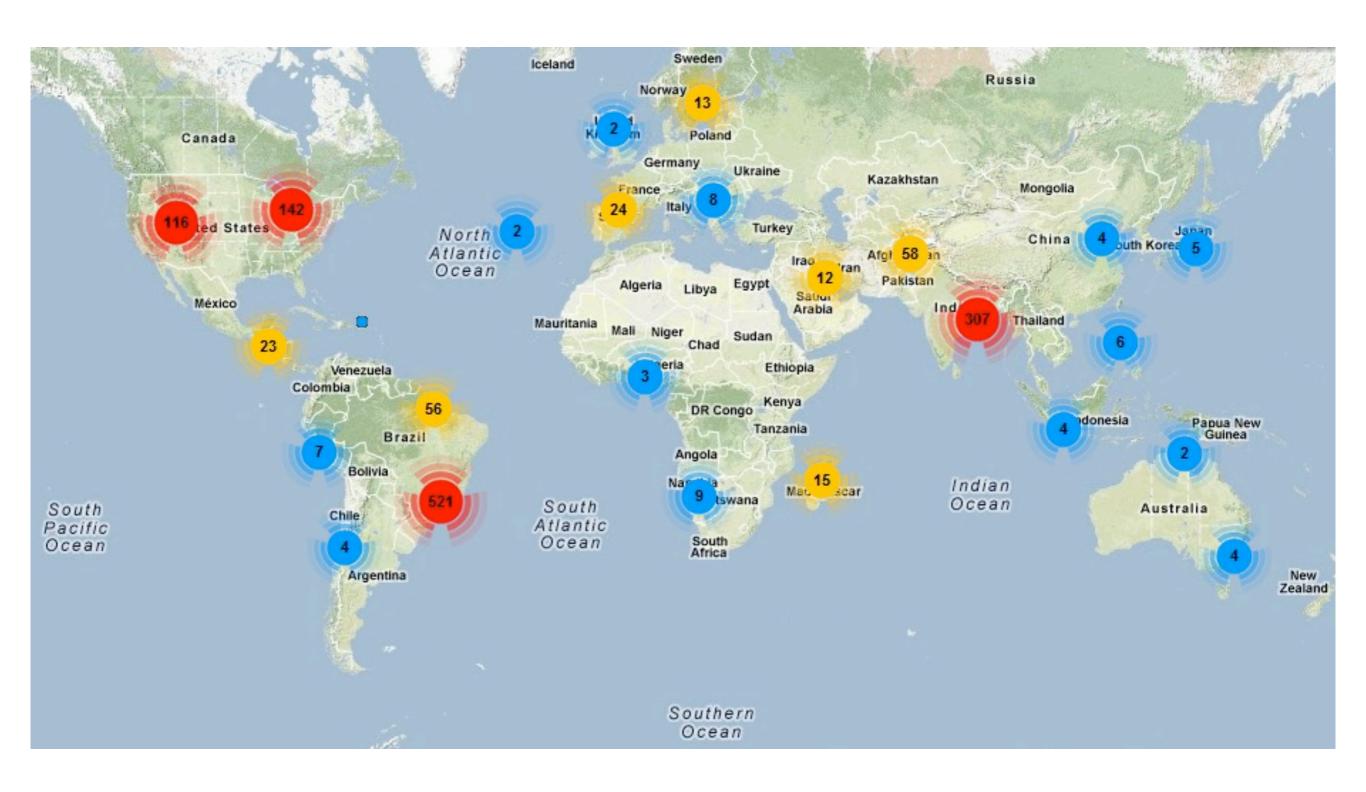
31 Mar

- @TeamRave Why would I care about tweets to your whopping 16 followers #posers #DARPAleftovers
- View conversation

### Fake followers?



### Where Our Followers Were Located (Sample Size = 5000 Followers)





Allows people to perform a service call "Get Friends Fast" or GFF. We elected to buy this service to help create a "buzz" around our twitter profile.

From the Twitter glossary:

GFF [Get Followers Fast]: Sites that promise to get you more followers if you provide your username and password. After signing up, these sites send spam from your account. Don't use them.

### Identified the wrong target!

#### Body identified as student falsely implicated in Boston bombing

smh.com.au

Apr 26th 2013



Credibility in the Age of Twitter: A Town Hall on the Marathon Bombing this Wednesday at the Nieman Foundation

by Seth Mnookin, blogs.plos.org

April 30th 2013



Misidentified Target



Actual Stockholm Target



by Email, theatlantic.com

April 19th 2013 3:23 P7

Sn ( Sunn Tripathi: The Anatomy of a

formation Disaster



How the Internet Accused a High School Student of Terrorism

Reddit, Bos

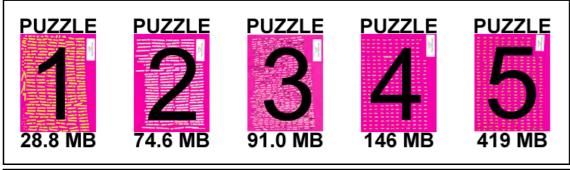
by Winston Ross, thedailybeast.com

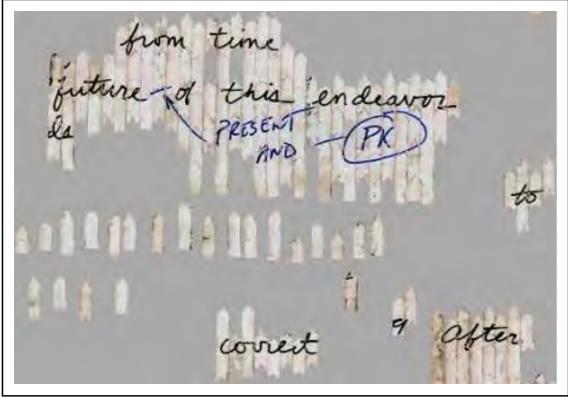
Reddit, Boston and the missing student

by Alex Hern, newstatesman.com

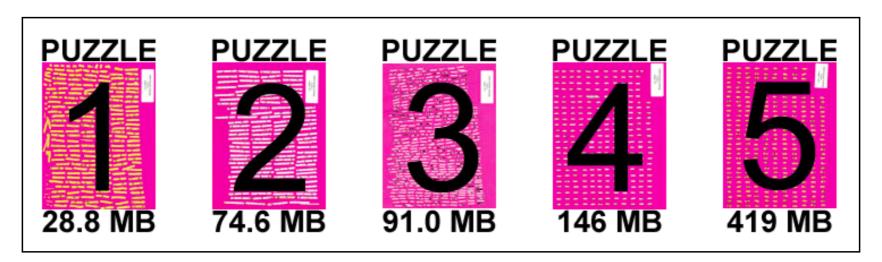
April 19th 2013

### **DARPA Shredder Challenge (2011)**

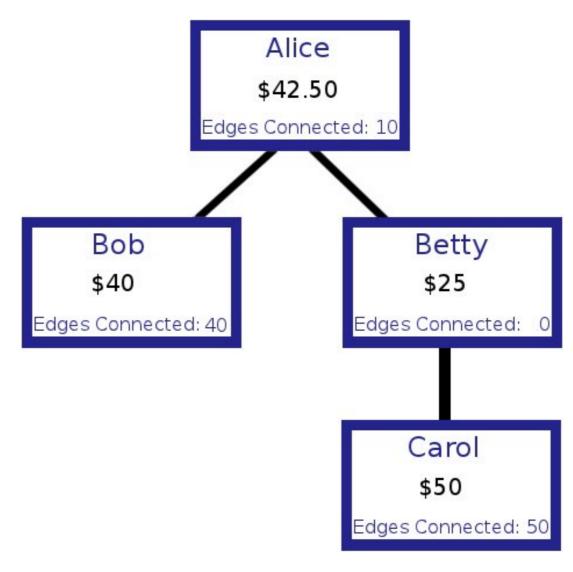




- ► \$50,000 reward.
- Why time-critical?
  - Assemble for 1 month.
  - Essentially no recruitment time.
- ▶ Why social?
  - ► NP-complete problem.
  - ► 224, 373, 1115, 2340, 6068 pieces.
- Social mobilization for a combinatorial problem.

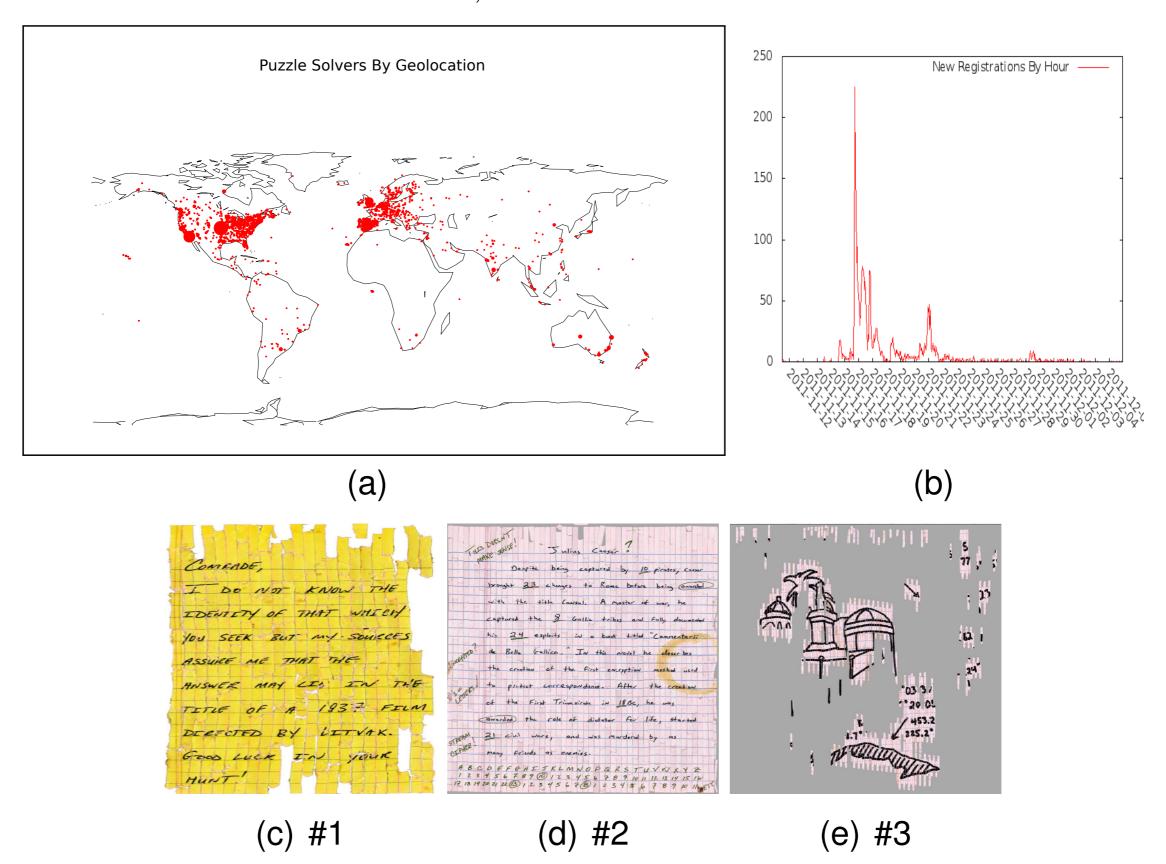


(a) 224, 373, 1115, 2340, 6068 pieces  $\approx$  25000 connections.



(b) Query incentive networks, again.

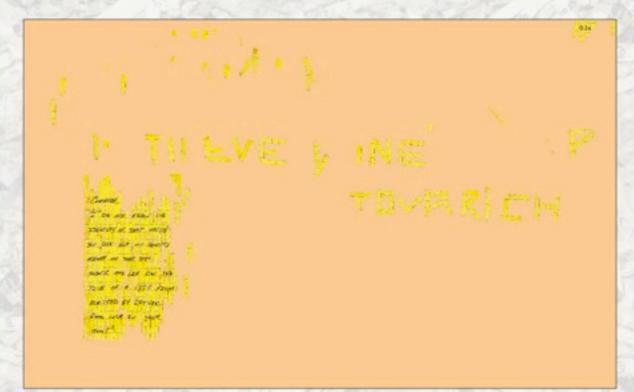
## 3,667 recruits.



### **Honorable Mention Submissions**

The following page contains spoiler information.

### Puzzle 1



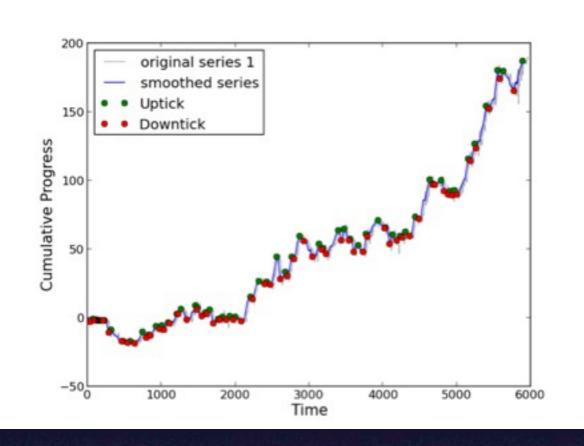
UCSD (16 Nov)

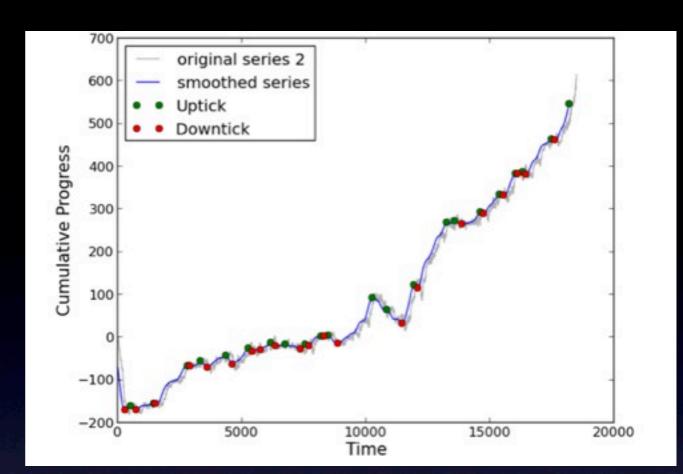
#### Ladaci Loar a Summilary Final Score **Display Name Place All Your Shreds** 50 Are Belong To U.S. Schroddon 30 wasabi 26 MKI 22 mmvd 22 **University of** California, San 22 6 Diego **Craig Landrum** 19 mkelly 19

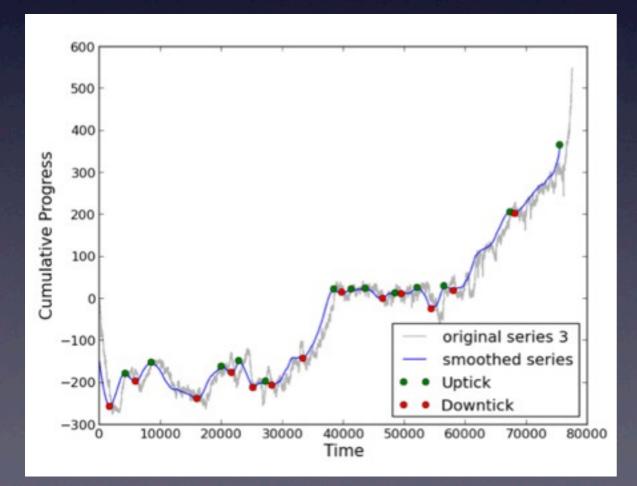
**Icandoit** 

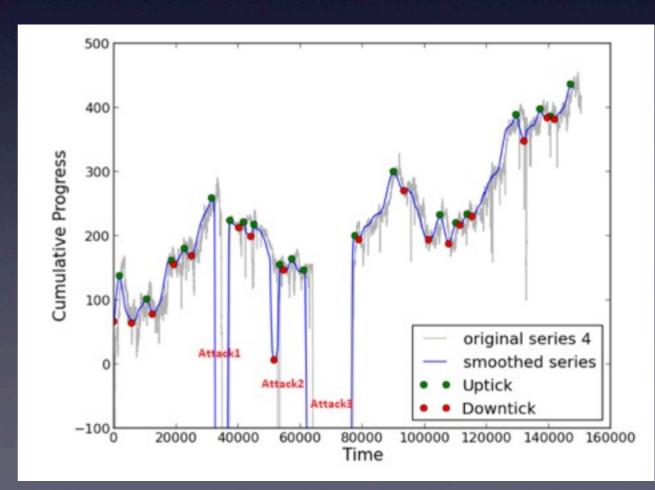
Goldsong

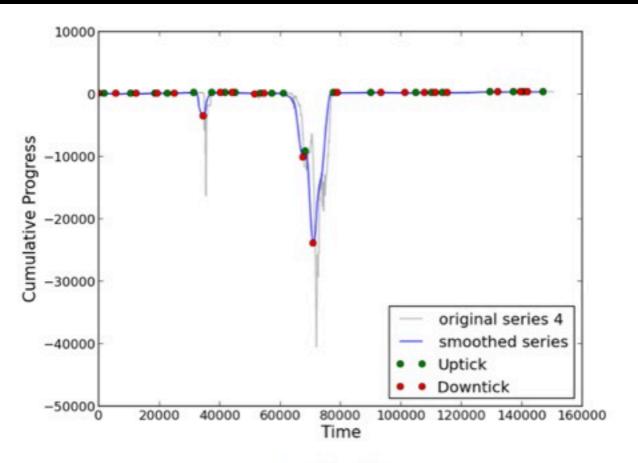
19



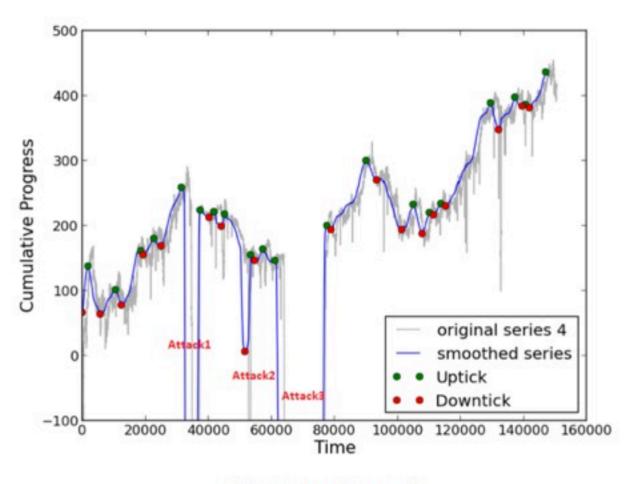




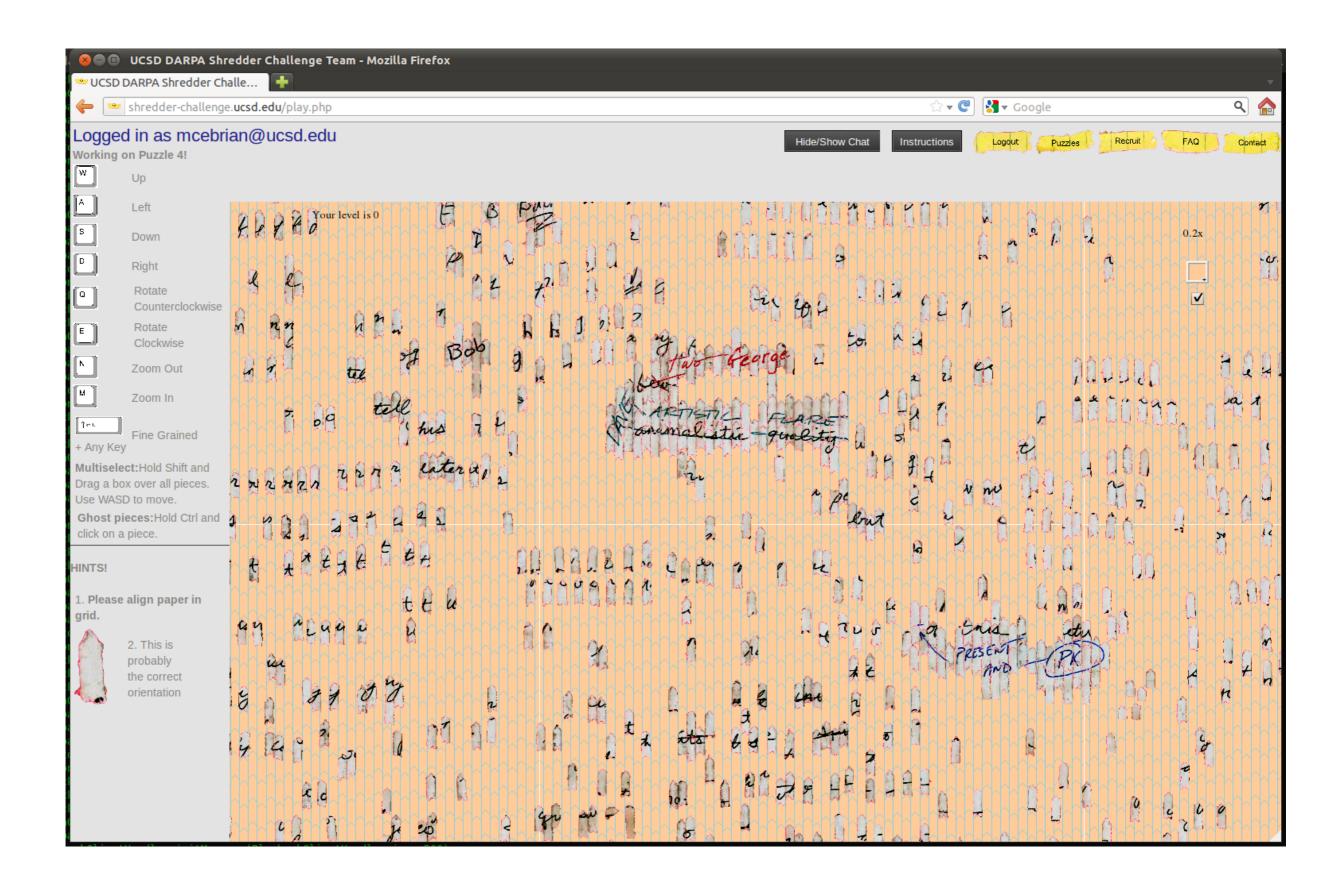




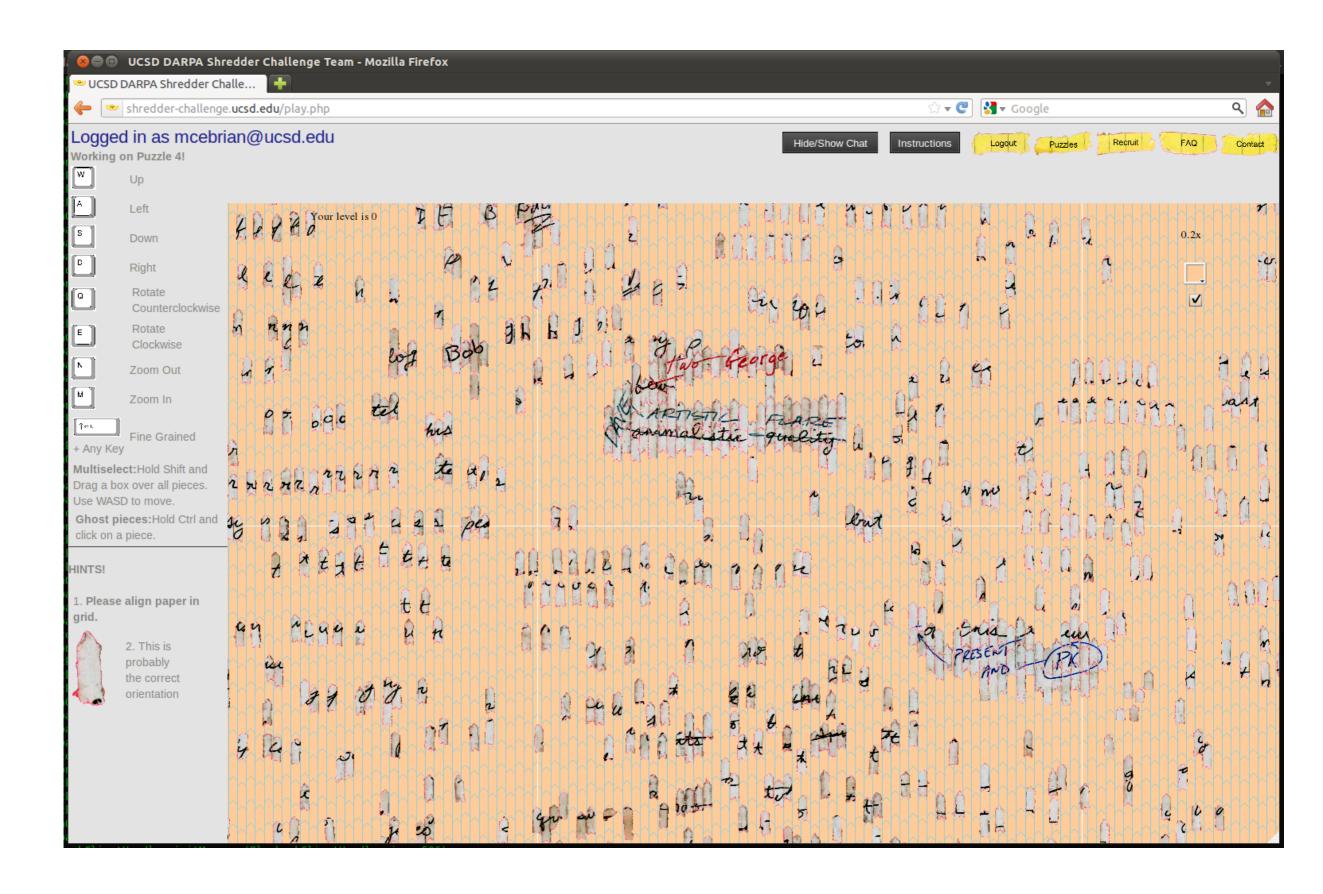
(a) Puzzle4



(b) Puzzle4 (Zoomed)



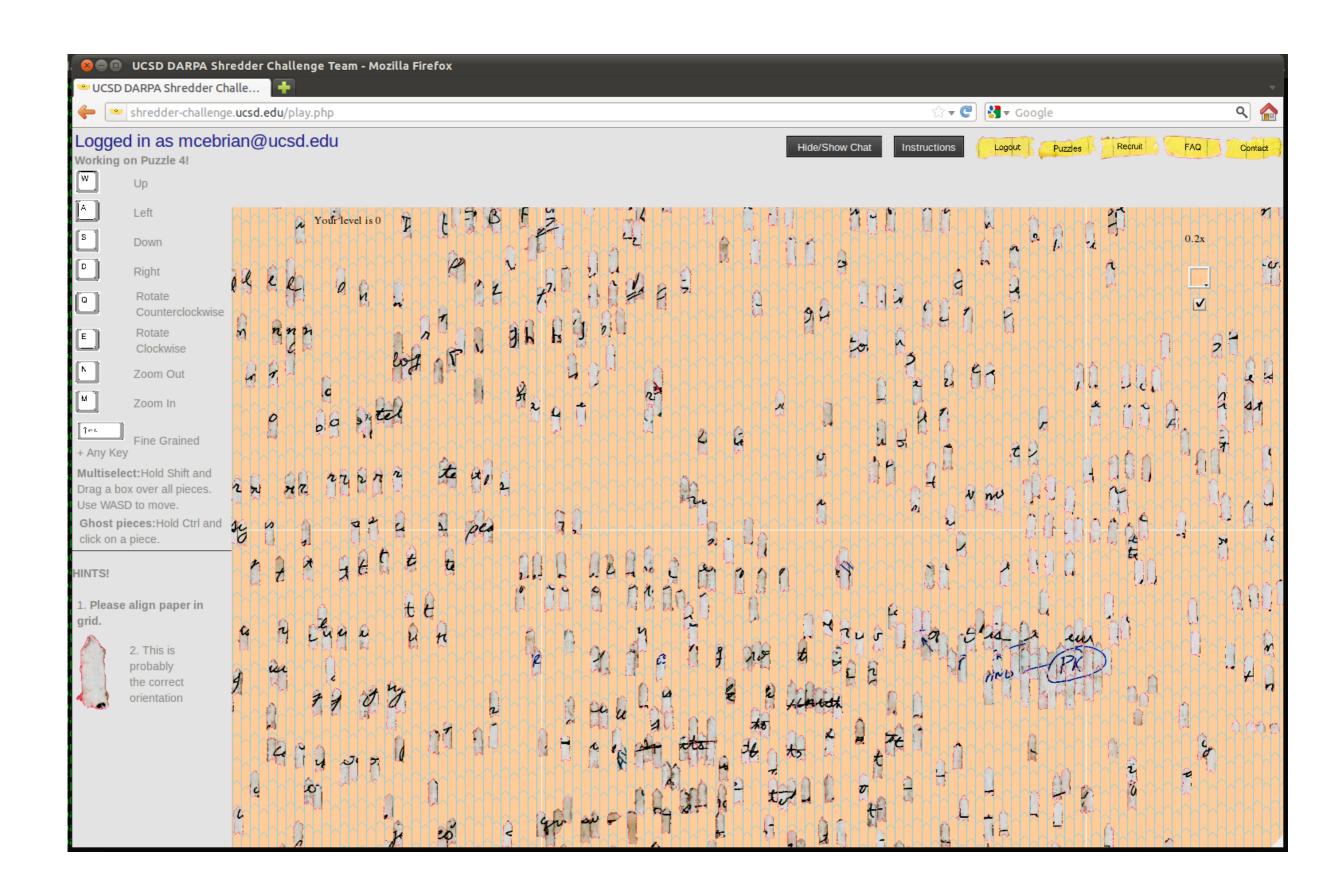
Before the attack.



Probing with unconnected pieces.



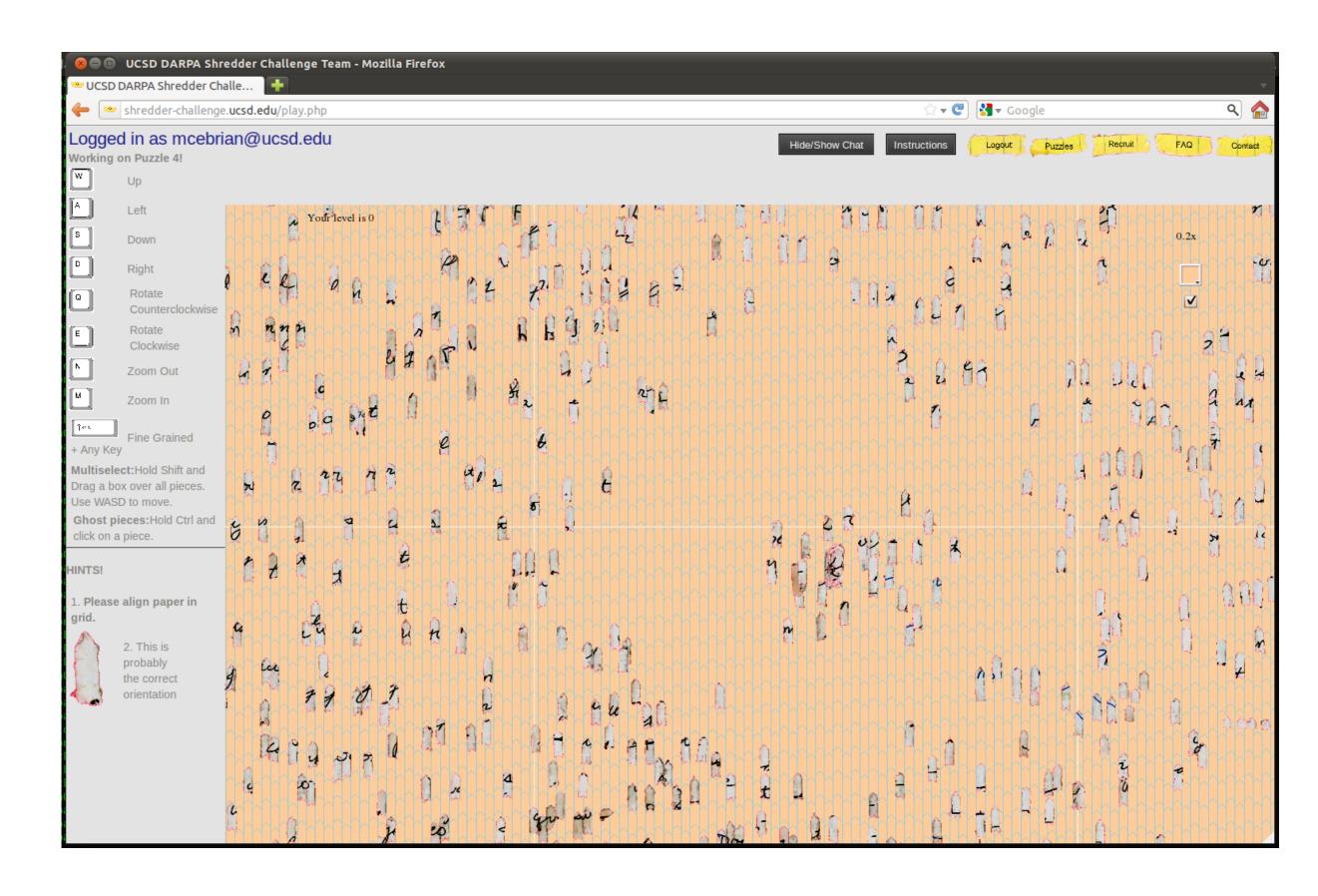
Small structures under attack.



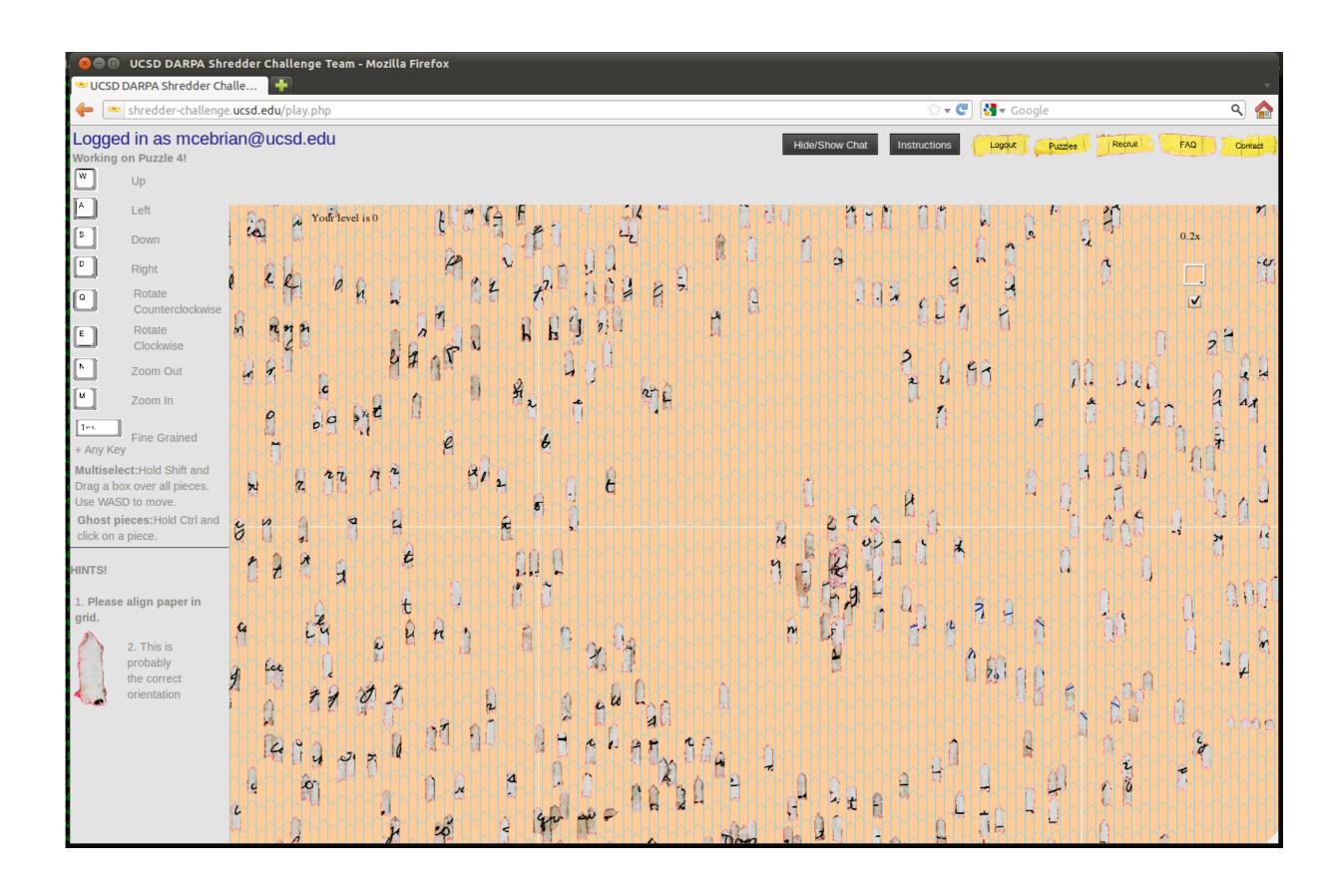
Main structure gone.



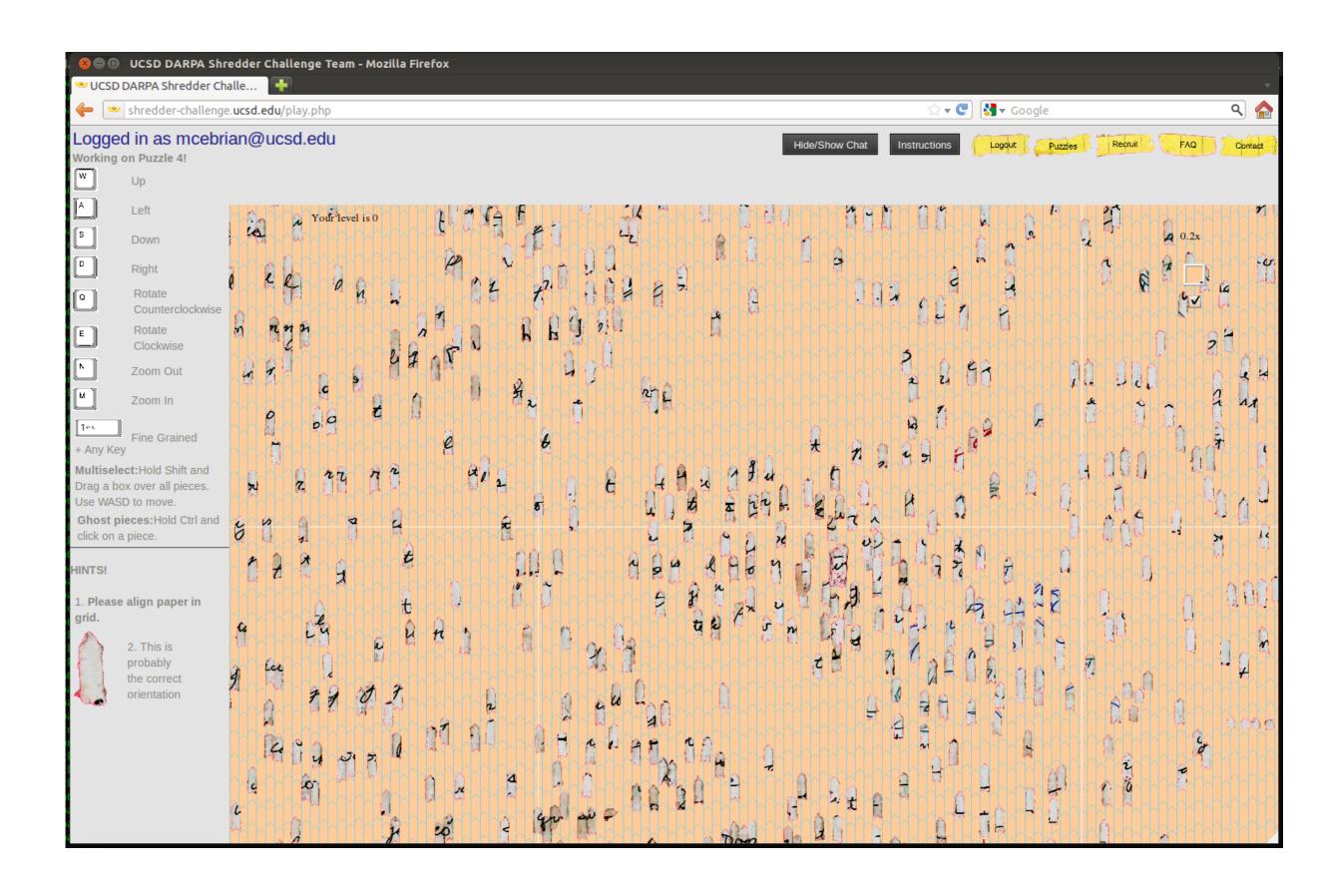
All progress gone.



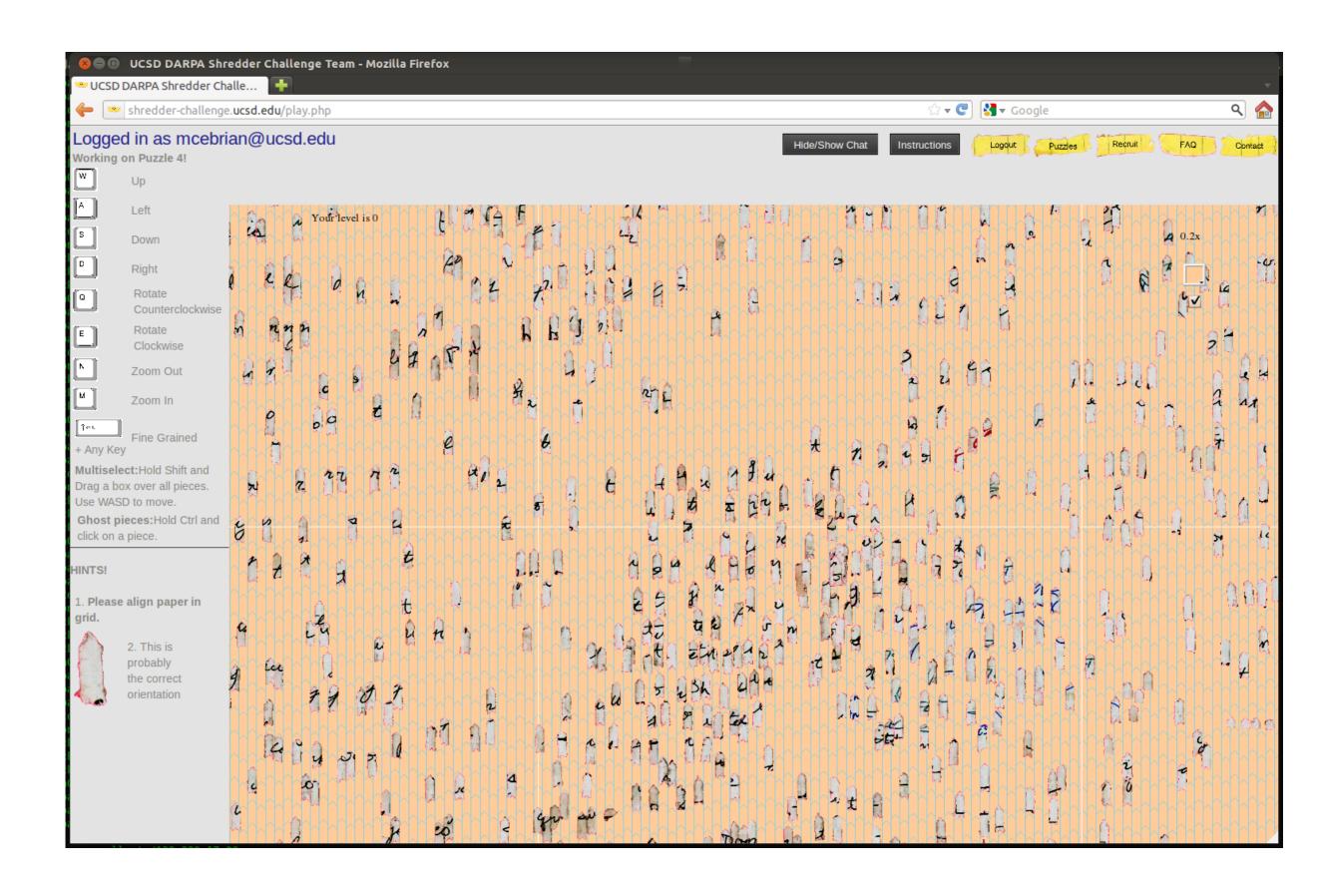
Participants trying to recover the progress.



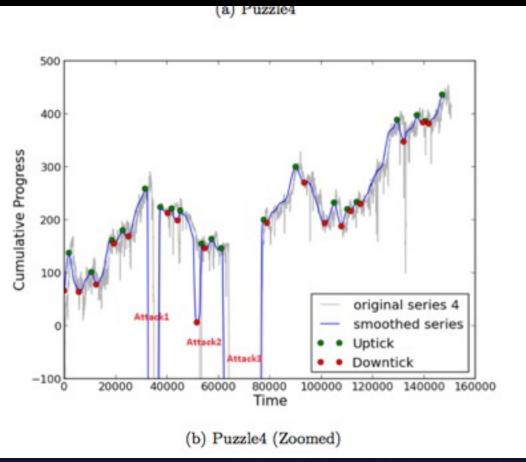
Participants trying to recover the progress.

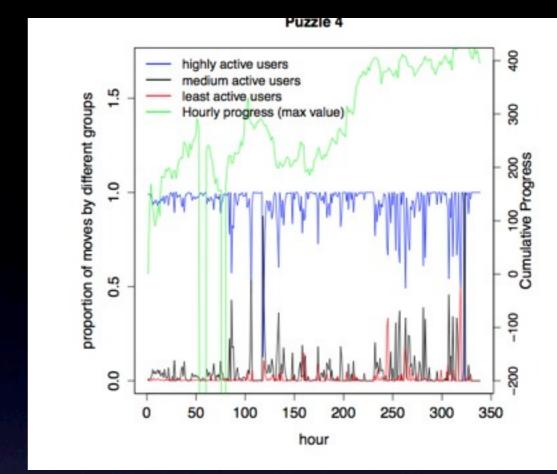


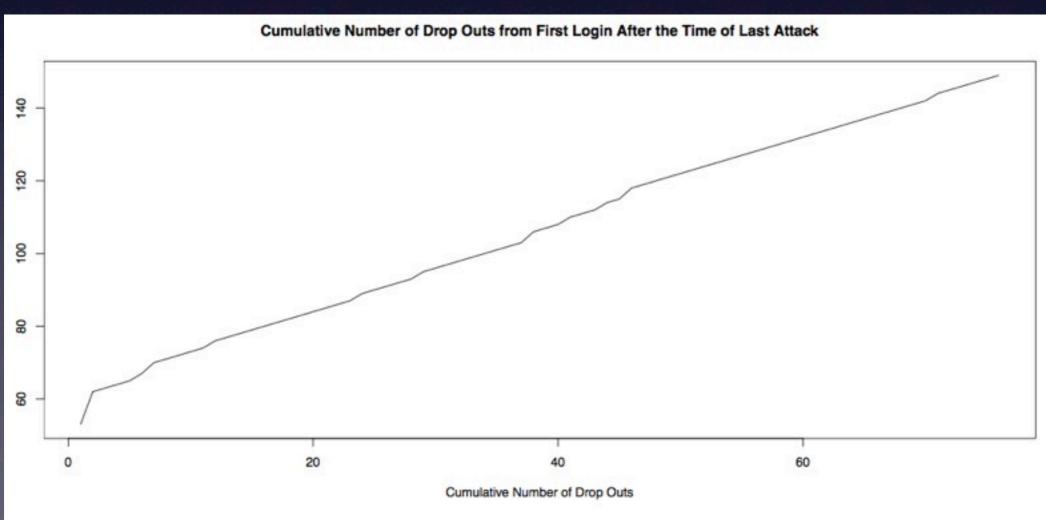
Participants trying to recover the progress.



Participants trying to recover the progress.







from ucsdsaboteur@hushmail.com

to mcebrian@ucsd.edu

date Thu, Nov 24, 2011 at 4:20 AM

subject UCSD Shredder Challenge Sabotage

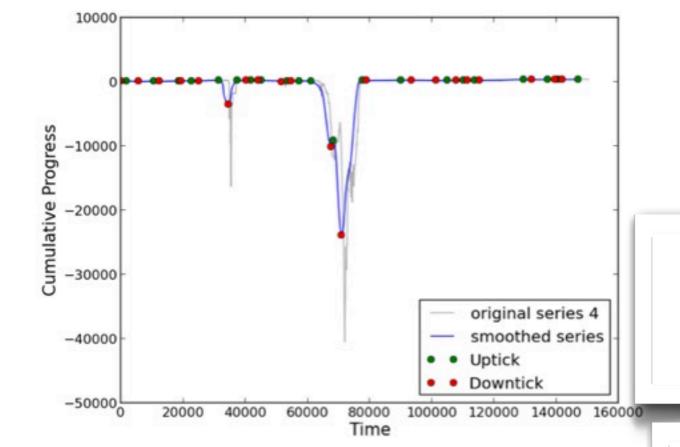
"I appreciate your acknowledging the cleverness of my exploitation of the weaknesses in your shredder challenge puzzle solving implementation." "For my first attack, everything was wide open. I made a post to 4chan to recruit people instructing them to disconnect any connected pieces and then start moving all the pieces into a single pile [...] However, it seemed all you did was lock the pieces together and ban my IP address."

"Which led me to my second attack, using a VPN and a neighbors wireless for some new IP addresses, it was still very easy to just select all the pieces and place them on top of each other, but this got old soon and was too easily spotted by the puzzle solvers."

«So I decided to get <u>a bit more sneaky</u> when I realized your implementation didn't have any check on the bounds of the virtual table when moving pieces. <u>I selected a number of pieces</u>, enough to make solving the puzzle difficult with the missing pieces and not so much that people would immediately notice, and then just moved them <u>off the top of the virtual table</u>.»

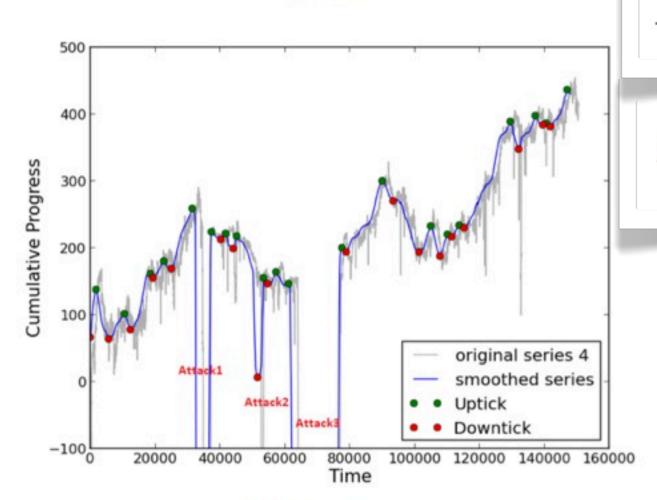
«Anyways...<u>I thoroughly enjoyed myself</u>, and hope you all learned something about crowd sourcing and will give a bit more thought to security when considering your next implementation. Whatever and when ever that may be. »

«As for my motivation, I too am working on the puzzle and personally feel that crowd sourcing is basically cheating (and I'm not the only one that feels this way). Sure, if you get enough people together and working on it they will be able to solve nearly any puzzle. It's only a matter of time, however for what should be a programming challenge about computer vision algorithms, crowd sourcing really just seems like a brute force and ugly plan of attack, even if it is effective.»



$$\dot{P}(t) = \frac{\beta}{\alpha \gamma - 1} D(t).$$

$$D(t) = \frac{\alpha \gamma - 1}{\beta} \left( aP(t) + f(t) \right).$$



$$\dot{D}(t) = \frac{\alpha \gamma - 1}{\beta} \left( a\dot{P}(t) + bP(t) + f(t) \right).$$

$$\ddot{D}(t) = \frac{lpha\gamma-1}{eta}\left(a\ddot{P}(t)+b\dot{P}(t)+cP(t)+f(t)
ight).$$

$$\frac{d^2}{dx^2}P + a^2P = A^2e^{\sqrt{A^2 - a^2}x}$$

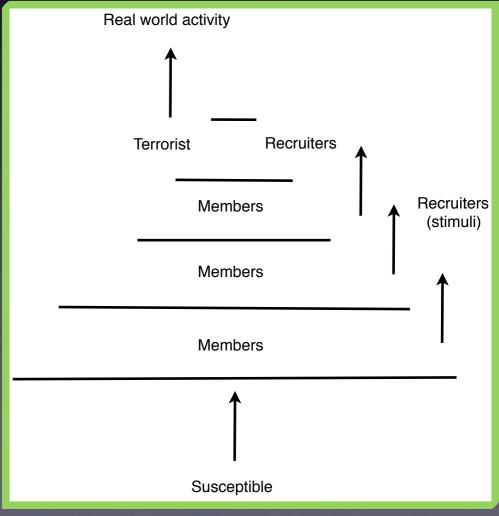
Cebrian, Amigo, Huerta, et al., 2013.

(b) Puzzle4 (Zoomed)













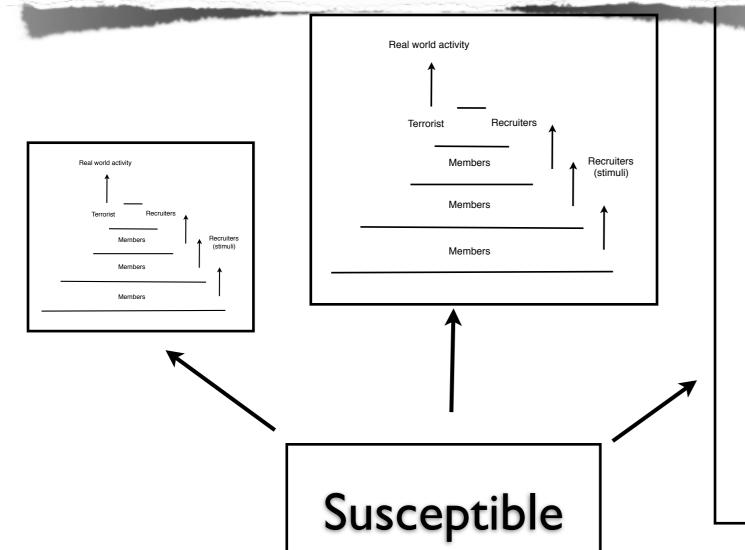
# Violent extremist group ecologies under stress

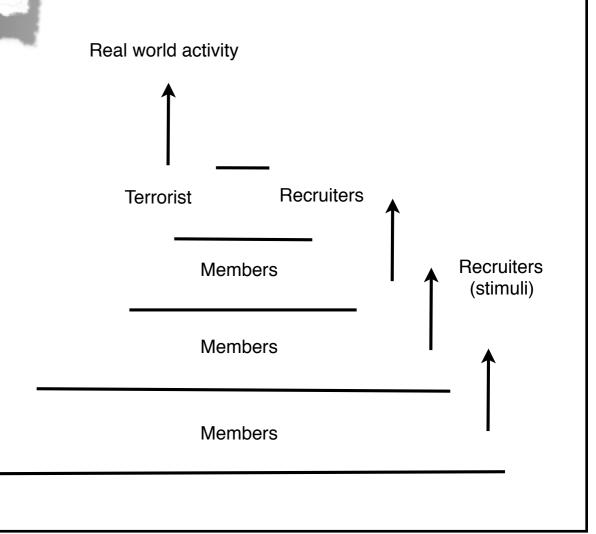
SUBJECT AREAS: POPULATION DYNAMICS PSYCHOLOGY AND BEHAVIOUR BEHAVIOURAL ECOLOGY ECOLOGICAL NETWORKS

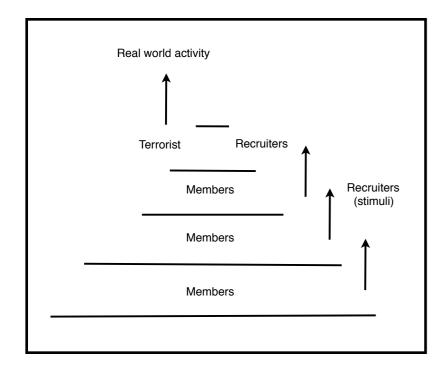
> Received 24 August 2012

Manuel Cebrian<sup>1,2,3</sup>, Manuel R. Torres<sup>4,5</sup>, Ramon Huerta<sup>6</sup> & James H. Fowler<sup>7,8</sup>

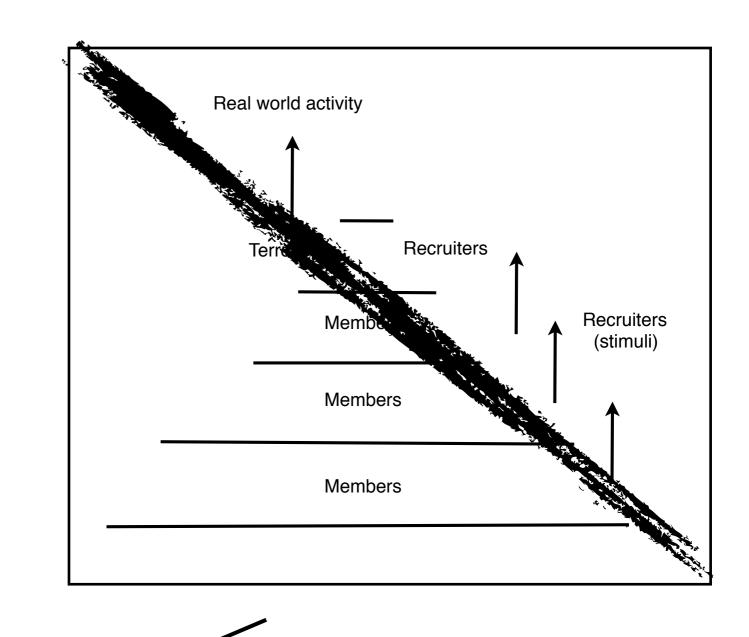
Media Laboratory, Massachusetts Institute of Technology, Cambridge, Massachusetts 02139, USA, <sup>2</sup>Department of Computer Science and Engineering, University of California at San Diego, La Jolla, California 92093, USA, <sup>3</sup>NICTA, University of Melbourne, Melbourne, Victoria 3010, Australia, <sup>4</sup>Political Science Department, Pablo de Olavide University, Seville 41014, Spain, <sup>5</sup>Weatherhead Center for International Affairs, Harvard University, Cambridge, Massachusetts 02138, USA, <sup>6</sup>Biocircuits Institute, University of California at San Diego, La Jolla, California 92093, USA, <sup>7</sup>Medical Genetics Division, University of California at San Diego, La Jolla, California 92093, USA, <sup>8</sup>Political Science Department, University of California at San Diego, La Jolla, California 92093, USA,

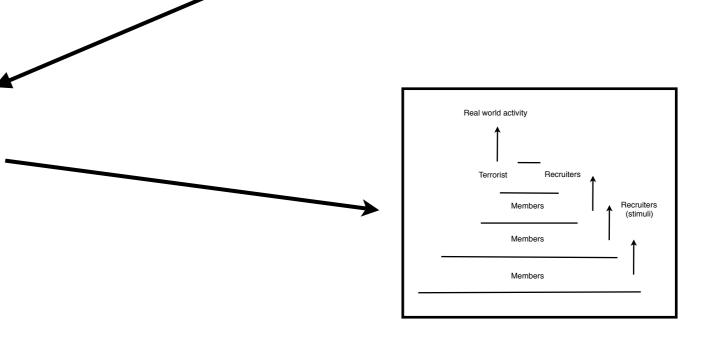


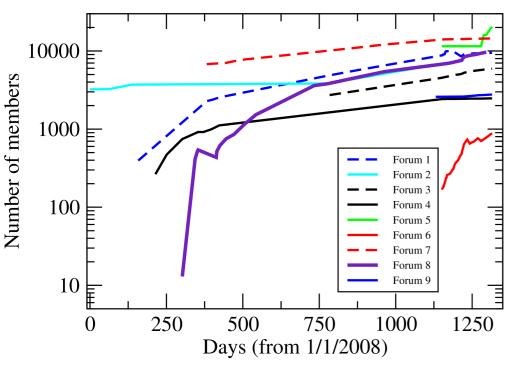


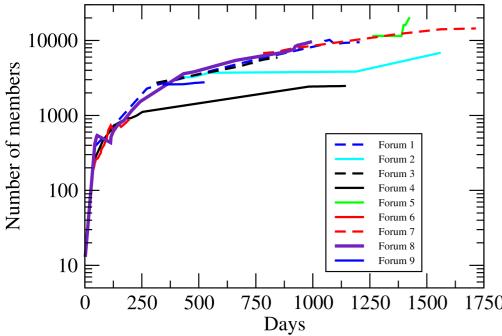












$$\frac{dX_1}{dt} = \pi_{1,0}N - \pi_{21}X_1$$

$$\frac{dX_i}{dt} = \pi_{i,i-1}X_{i-1} - \pi_{i+1,i}X_i$$

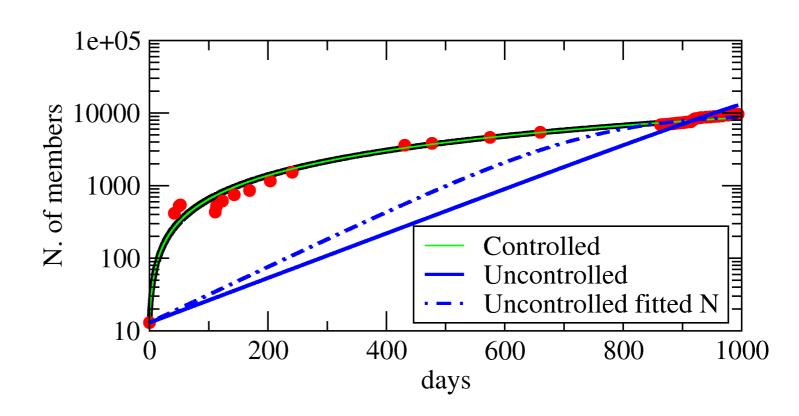
$$\frac{dX_L}{dt} = \pi_{L,L-1}X_{L-1} - p_{O,R}R - p_{R,R}R$$

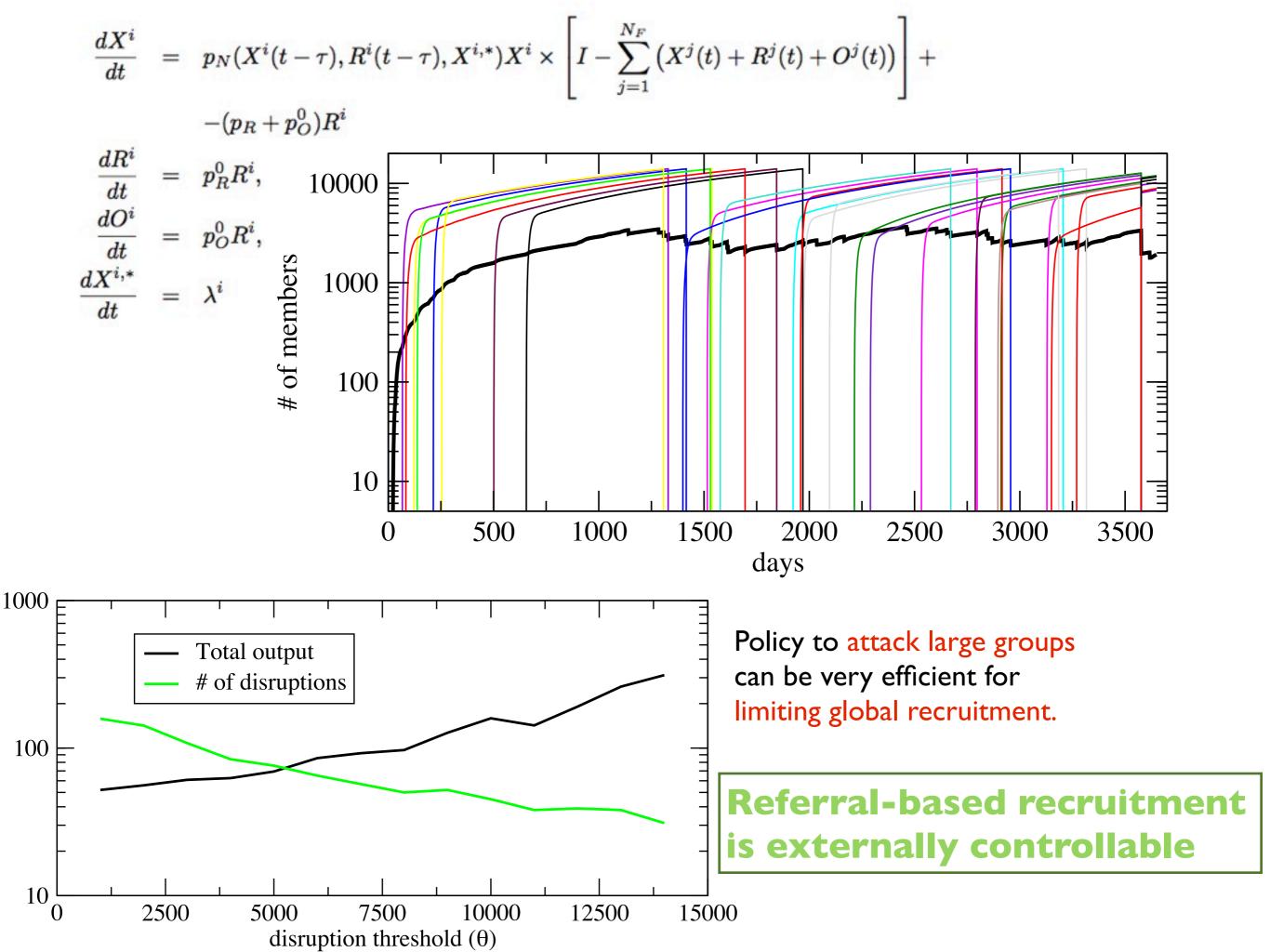
$$\frac{dR}{dt} = p_{R,R}R$$

$$\frac{dO}{dt} = p_{O,R}R$$
population dynamics

$$p_N(X^*) = \frac{(p_R^0 + p_O^0)R^*}{NX^*} =: p_N^*,$$
 volume contro

$$p_N(X,R) = \left\{ egin{array}{ll} rac{p_N^0 + p_O^0}{NX^*} R + p_N^0(X^* - X), & ext{if} & X < X^* + rac{p_N^*}{p_N^0} \\ 0, & ext{otherwise} \end{array} 
ight.$$



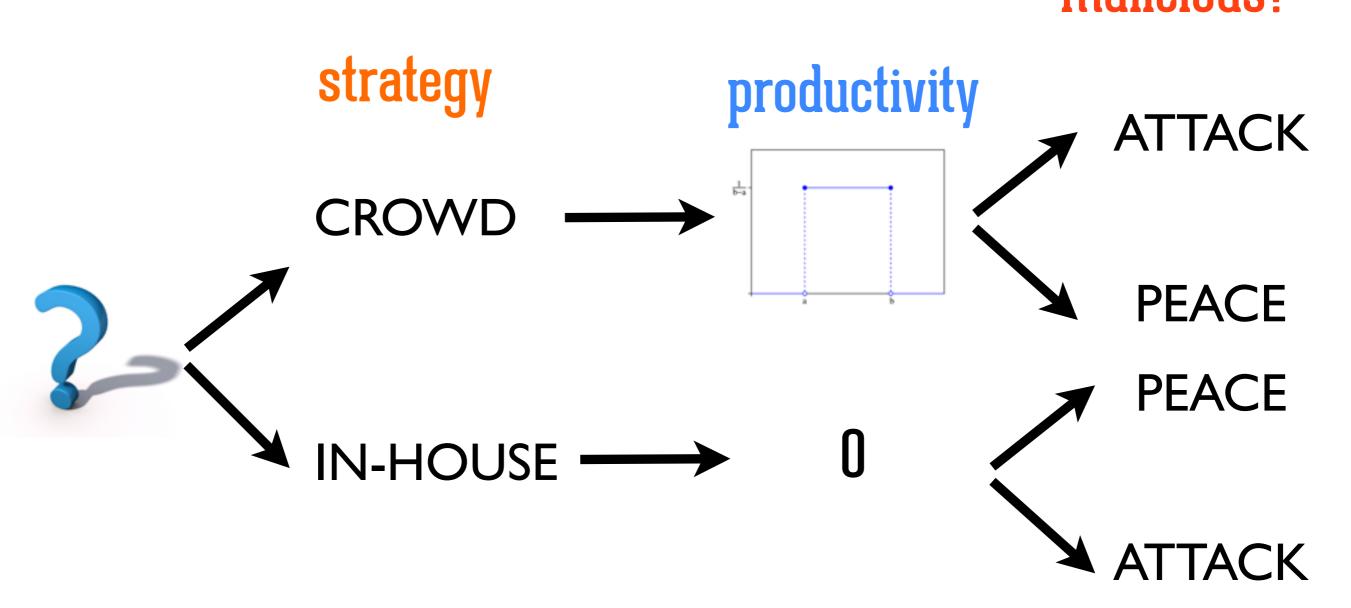


# **Crowdsourcing Dilemma**

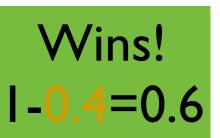
Victor Naroditskiy \*, Jennings \* , Pascal Van Hentenryck † ‡, and Manuel Cebrian ‡

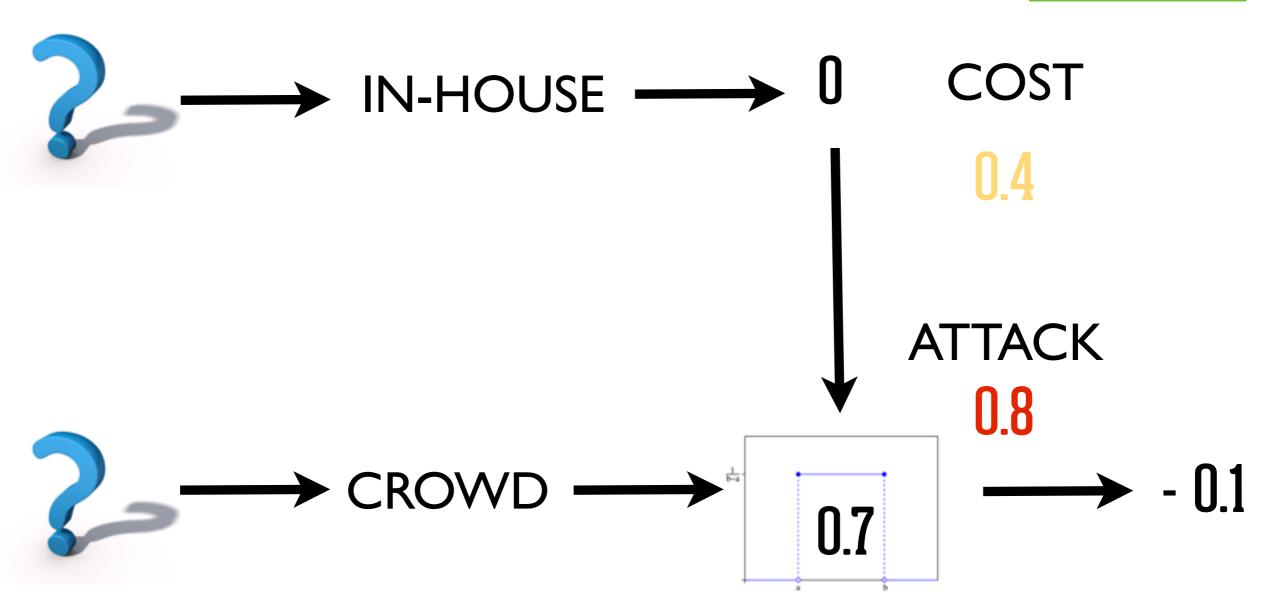
\*University of Southampton, United Kingdom, University of Melbourne, Australia, and National Information and Communications Technology Australia, Australia Submitted to Proceedings of the National Academy of Sciences of the United States of America

malicious?



# 2-player, 1 shot game





Cost of the attack  $q \in [0, 1]$  [fraction of the total reward] The damage inflicted by the attack  $d \in [0, 1]$ .

$$C = \frac{C}{\frac{1}{2} - (d - \frac{d^2}{2})q, \frac{1}{2} - (d - \frac{d^2}{2})q} = \frac{S}{1 - d, d(1 - q)} \\ S = \frac{d(1 - q), 1 - d}{\frac{1}{2}, \frac{1}{2}}$$

Table 1: Expected payoff matrix for the crowdsourcing game.

$$d < \frac{1}{2} \longrightarrow \operatorname{Both} \operatorname{CROWDSOURCE}$$
 and ATTACK

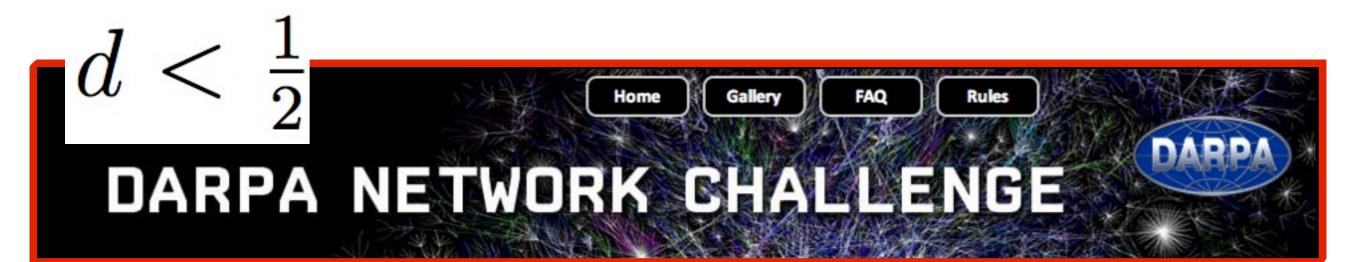
$$d > \frac{1}{2}$$
 and  $q < \frac{2d-1}{d^2} \longrightarrow$  Both IN-HOUSE

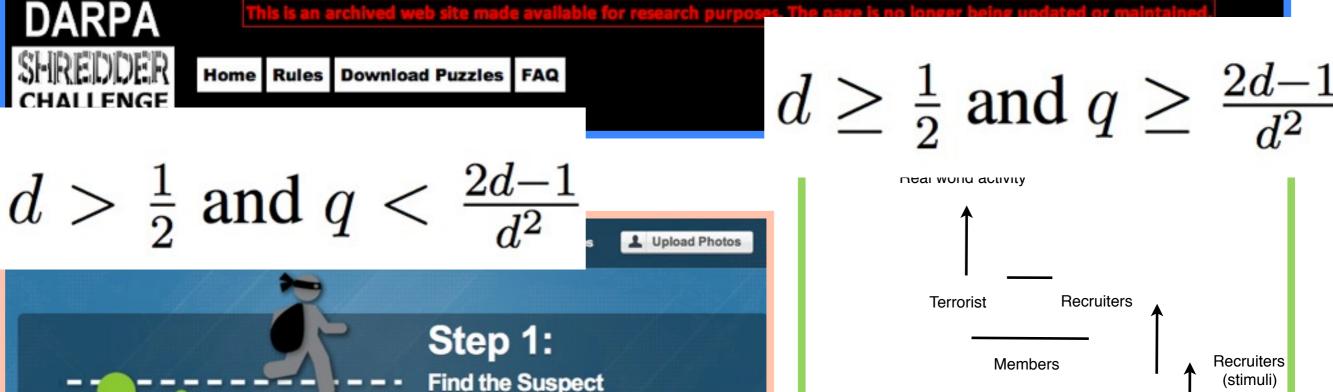
$$d \geq \frac{1}{2} \text{ and } q \geq \frac{2d-1}{d^2} \longrightarrow \frac{\text{ATTACK}}{\&}$$

Always attack (once) regardless of the cost of attack!

Both CROWDSOURCE +
ATTACK
&

**Both IN-HOUSE** 







# DARPA Network Challenge:

4 years, 4 lessons

I. Hierarchical, incentive-based mobilization can be fast, large, cheap.

II. Exhibits large variability (you have to be lucky, or try many times).

III. Can be made robust to misinformation, but not sabotage.

IV. Sabotage is the expected behavior.





#### ARTICLE

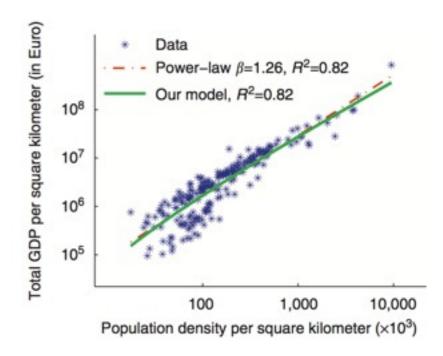
Received 4 Dec 2012 | Accepted 30 Apr 2013 | Published 4 Jun 2013

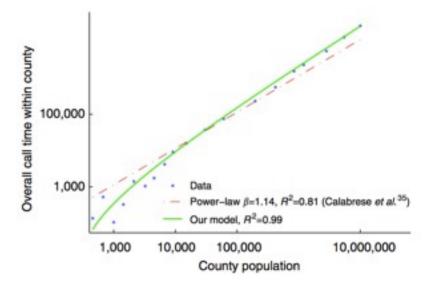
DOI: 10.1038/ncomms2961

# Urban characteristics attributable to density-driven tie formation

Wei Pan<sup>1</sup>, Gourab Ghoshal<sup>1,†</sup>, Coco Krumme<sup>1</sup>, Manuel Cebrian<sup>1,2,3</sup> & Alex Pentland<sup>1</sup>

Motivated by empirical evidence on the interplay between geography, population density and societal interaction, we propose a generative process for the evolution of social structure in cities. Our analytical and simulation results predict both super-linear scaling of social-tie density and information contagion as a function of the population. Here we demonstrate that our model provides a robust and accurate fit for the dependency of city characteristics with city-size, ranging from individual-level dyadic interactions (number of acquaintances, volume of communication) to population level variables (contagious disease rates, patenting activity, economic productivity and crime) without the need to appeal to heterogeneity, modularity, specialization or hierarchy.





Why do cities super-scale?

# Why do only cities super-scale? crowdsourcing cities\_ institutions Faster social media firms