

# Optimizing Scrip Systems

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or: mo' money, mo' problems? or: paying with Kash

paper by: Kash, Friedman, Halpern, 2009  
presented 10/5/09

# What good is money?

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why might we want to introduce a scrip system?

- dictate initial distribution / control policy
- “double coincidence of wants” - ease transactions
- control flows within a system

# The Great Capitol Hill Baby Sitting Co-op

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proof? of an optimum quantity of money?

- 150 couples institute coupon system  
precautionary savings ensue  
more coupons injected  
market crashes
- with strong assumptions, (Hens et al) experiments suggest optimum quantity
- too many hoarders? Or, not a closed model?

# Major results from Kash et al

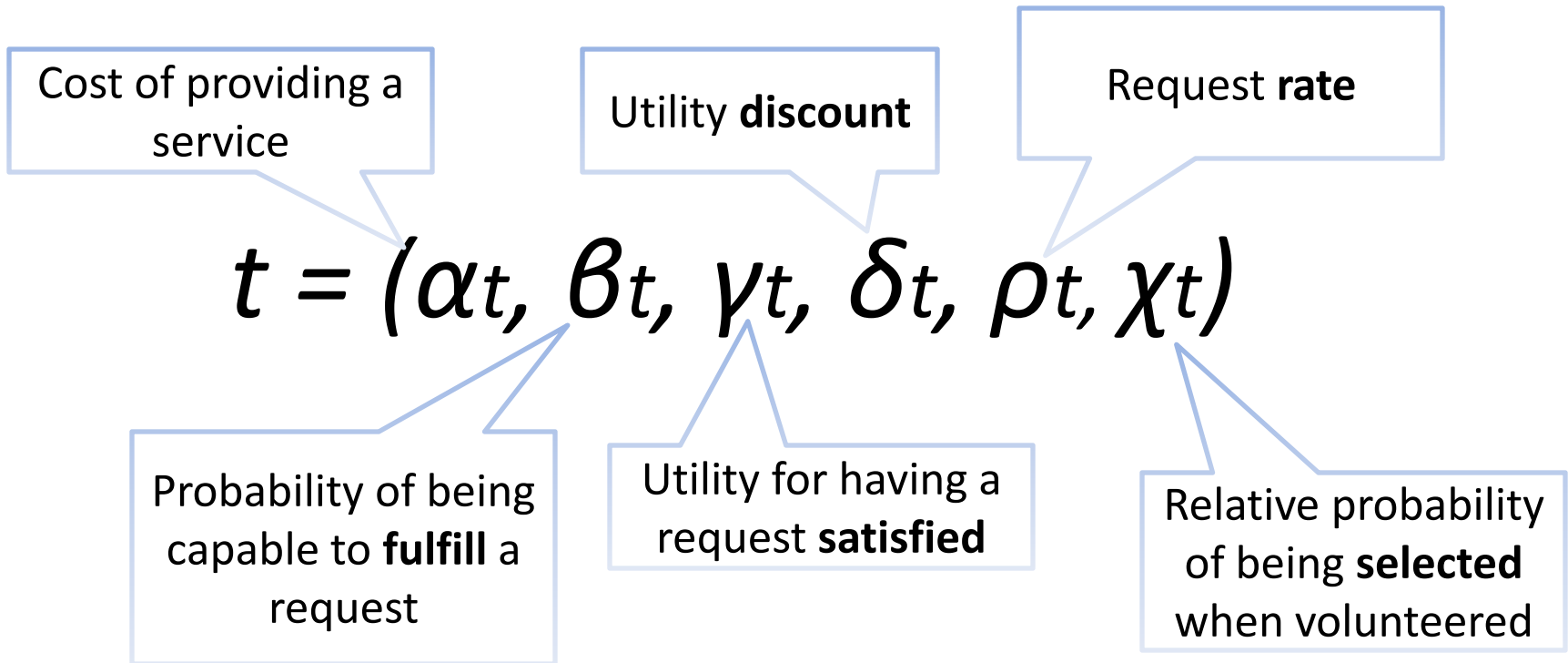
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- Theoretical:
  1. monotonicity of best reply: if all others play threshold, you should play threshold
  2. concentration phenomenon: an entropy-maximizing distribution as  $n \rightarrow \infty$   
( $n$  is agents of a given type)
- Simulation:
  1. collusion doesn't hurt
  2. hoarders and altruists can cause crashes

# The model (Complete)

- There are  $N$  agents
- A *type set*  $T$
- Frequencies of types  $f_t$
- A type  $t = (\alpha_t, \beta_t, \gamma_t, \delta_t, \rho_t, \chi_t)$
- A game is described by  $G(T, f, h, n, m)$  where
  - $h = \text{base number}$
  - $n = \text{number of replicas for each base and type}$
  - $m = \text{average money } M/N$

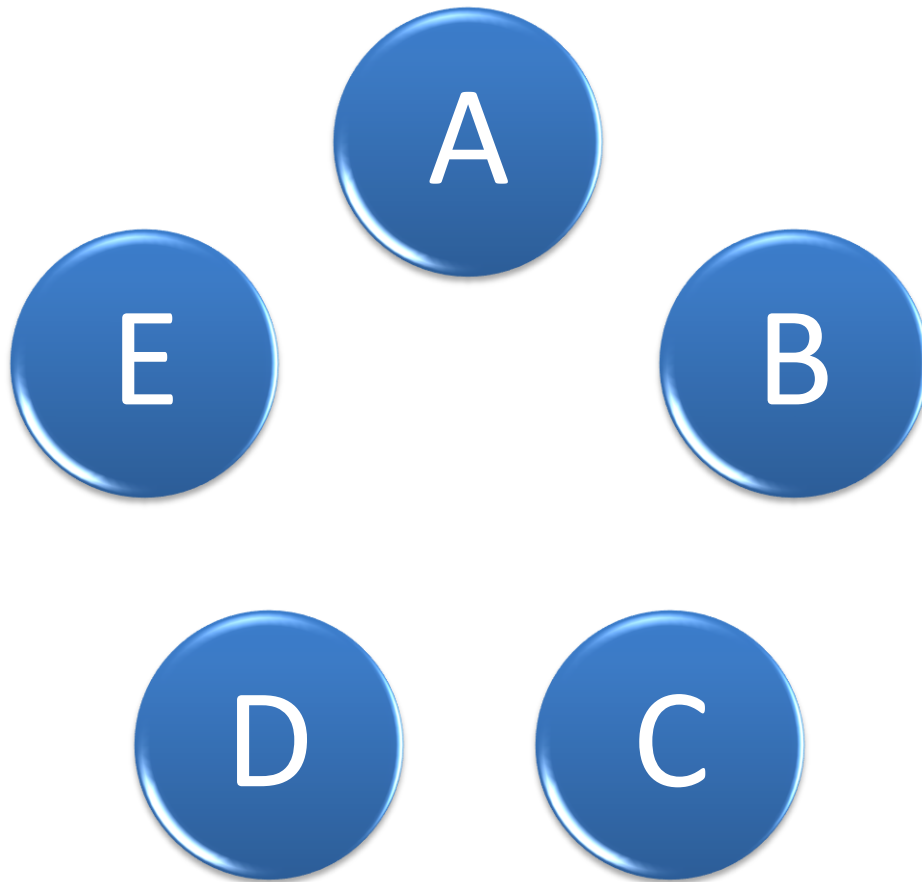
# Decoding types



# The Model (Simplified)

- Just consider only one type:
  - $N$  agents
  - Randomly choose agent  $P$  to *request* service
  - Probability of being **able** to satisfy request,  $\beta$
  - Choose randomly among volunteers agent  $V$ 
    - Payoff of  $V$ ,  $-\alpha$
    - Payoff of  $P$ ,  $+1$
  - Total utility of a player:  $\sum_{t=0}^{\infty} \delta^t u_t$

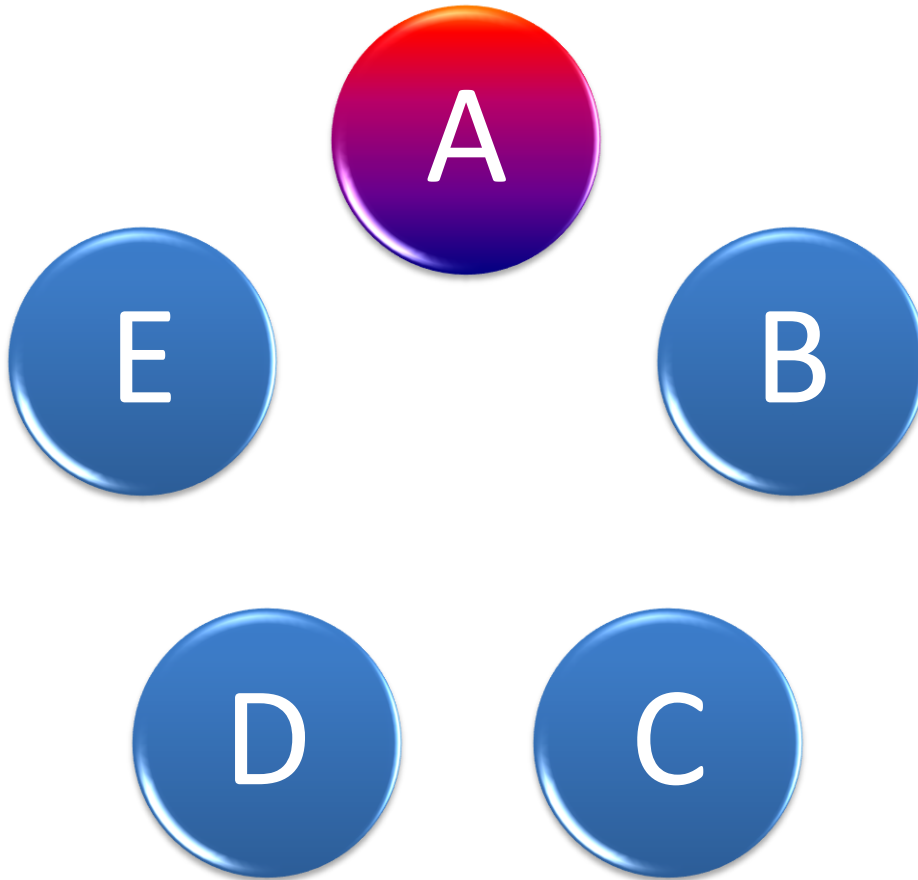
# Sample Run



5 agents in the system



# Sample Run

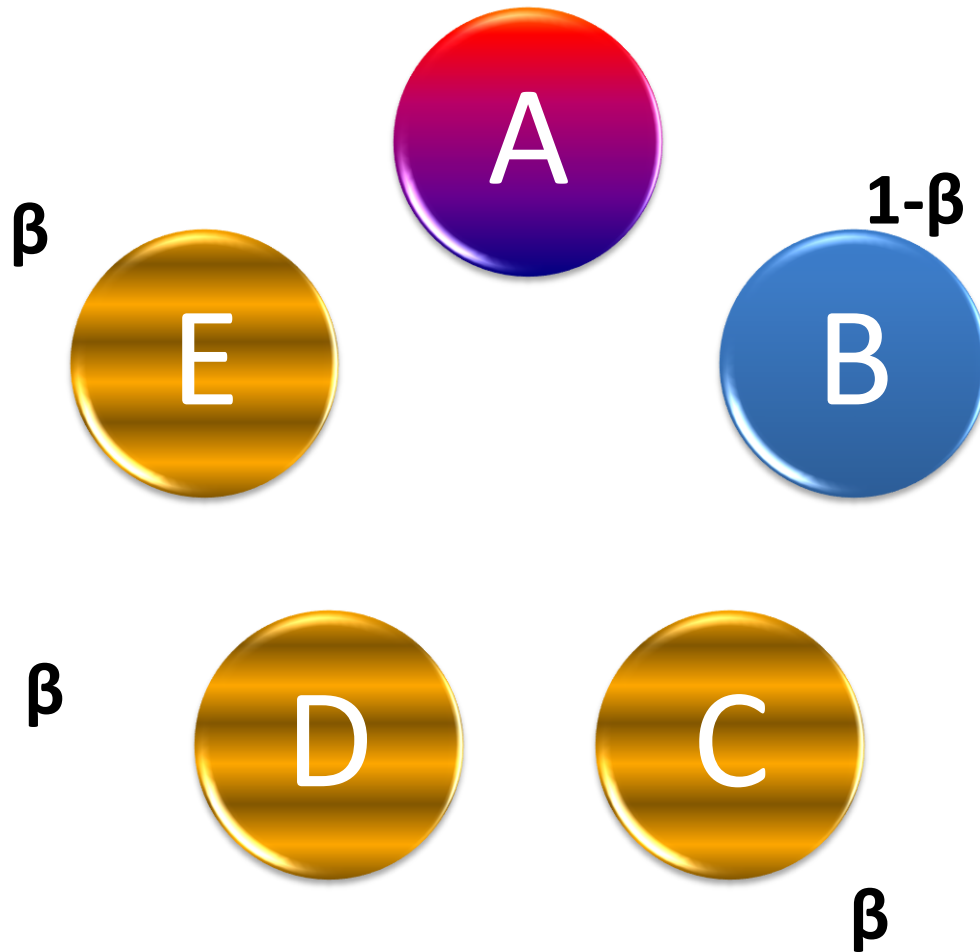


Agent A is chosen to request for a service.

Now we will form a set of volunteers for satisfying this request.

Every other agent has probability  $\beta$  of being able to satisfy the request.

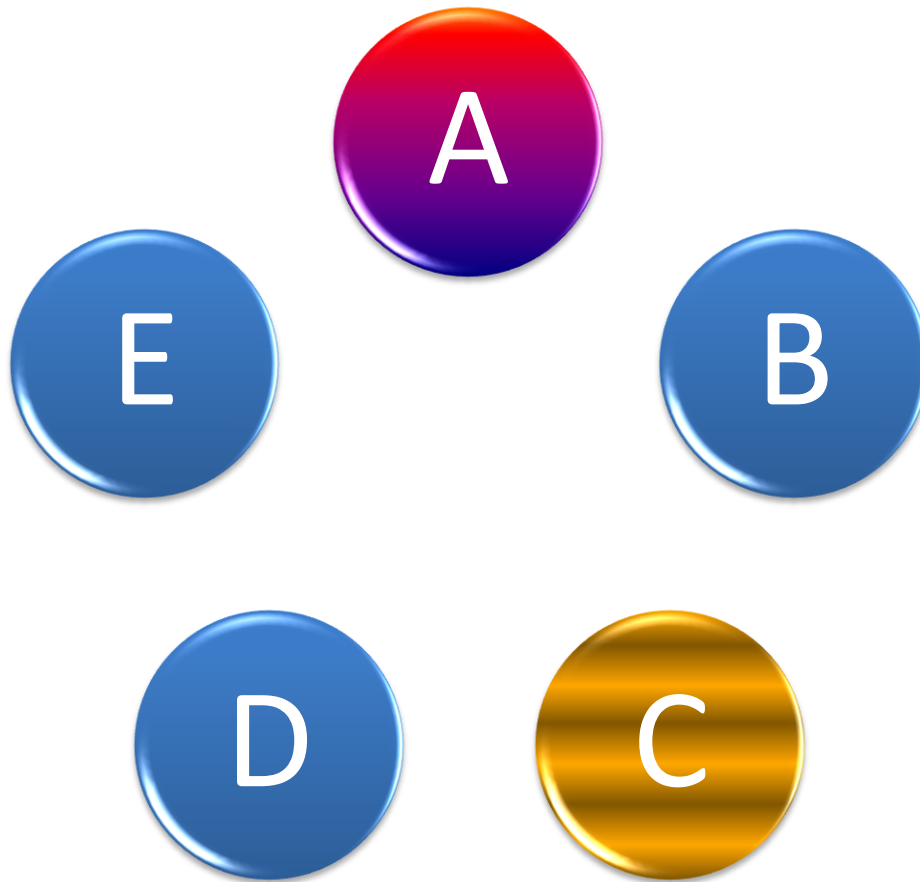
# Sample Run



Agents **E**, **C** and **D** are selected as **capable** of serving a request

Now agents will have to decide if they want to volunteer

# Sample Run

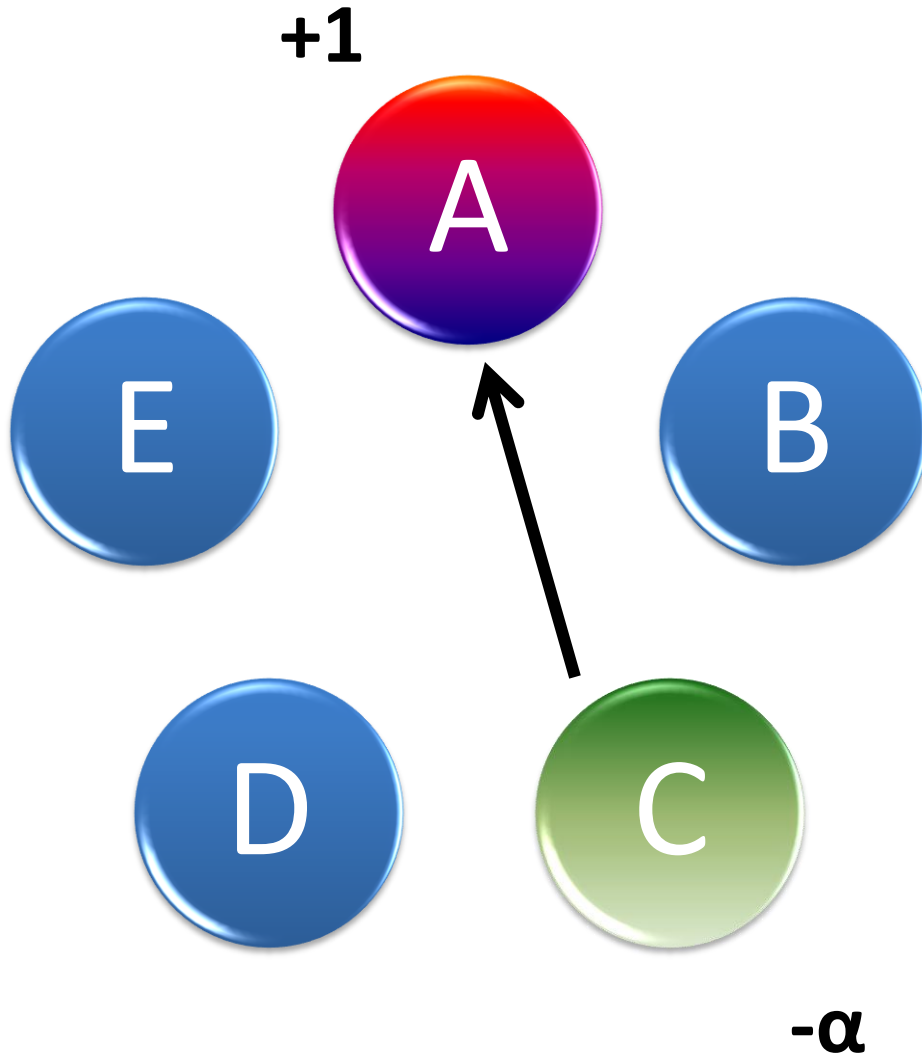


Agent **C** decides to be a volunteer. This decision is based on his particular **strategy**.

The transaction is completed in the subsequent phase

$$S_C^r = \{Volunteer\}$$

# Sample Run



Agent **C** was selected to satisfy the request uniformly from the set.

Agent **A** gets **1\$** for having his request satisfied and **B** gets **-α**

# Strategies?

- Consider an agent  $j$ 
  - Money :  $x_j$  dollars
  - Round :  $r$
- How to decide if to be a volunteer ?
- Threshold strategies  $S_k$  ( $k$ -comfort level)
  - IF  $x_j < k$  then volunteer
    - $S_0 = \text{never volunteer}$
- Others?

# The two arguments

- Existence of approximate equilibrium in the model
  - *Existence of  $\varepsilon$ -best replies*
- *Concentration phenomenon* of wealth distribution
  - *The distribution of money converges (quickly) to a specific distribution, given a **big** enough agent set, and a **long** enough process*
  - *When playing threshold strategies*

# The distribution $d^*$

- Wealth per agent type converges to

$$d^*(t, i) = \frac{f_t \cdot \lambda_i \cdot q(t, i)}{\sum_{j=0}^{k_t} \lambda_j \cdot q(t, j)}$$

- $d(t, i)$  = The fraction of agents of type  $t$  that have  $i$  dollars

# The Volunteer's Dilemma

- If *no*, his money does not change
- If *yes*, agent agrees to
  - Pay an amount  $a_t$
  - Receive a discounted  $\gamma_t$  in the future
- The decision is based on the estimation on how long will it take (say  $J$ ) to finally *spend* the 1\$

$$a_t \leq \delta_t^J \cdot \gamma_t$$



# Optimal Threshold Policy

$$a_t \leq \delta_t^J \cdot \gamma_t$$

- The maximum *comfort level*  $k$  defines the optimal threshold policy
- $J(k)$  is the mean time in which an agent is *depleted* of money, if starting with  $k$  dollars

# Equilibrium through an MDP

- The evolution of the model can be described by a Markov Chain
- States are agent money savings
- Agent optimal response can be modeled through an MDP :
  - $P_u = \text{probability of earning a dollar at each round}$
  - $P_d = \text{probability of making a request at each round}$

# $\varepsilon$ -best replies

- Given an agent of type  $t$ , then for *large enough* agent populations and a large enough *type discount*, the optimal threshold policy is an  $\varepsilon$ -best reply to all others playing *threshold strategies*

**Theorem 5.1.** *For all games  $G = (T, \vec{f}, h, m, n)$ , all vectors  $\vec{k}$  of thresholds, and all  $\varepsilon > 0$ , there exist  $n_\varepsilon^*$  and  $\delta_{\varepsilon, n}^*$  such that for all  $n > n_\varepsilon^*$ , types  $t \in T$ , and  $\delta_t > \delta_{\varepsilon, n}^*$ , an optimal threshold policy for  $\mathcal{P}_{G, \vec{S}(\vec{k}), t}$  is an  $\varepsilon$ -best reply to the strategy profile  $\vec{S}(\vec{k})_{-i}$  for every agent  $i$  of type  $t$ .*

# Monotonicity

- The *best-reply* function is *non-decreasing* in  $k$ . When all others increase their *thresholds*, one does not improve by lowering his own threshold
- Last “piece”: There *exists* a *threshold vector* such that the best reply is strictly higher than this vector

**Lemma 5.3.** *For all games  $G = (T, \vec{f}, h, m, n)$ , there exists a  $\delta^* < 1$  such that if  $\delta_t > \delta^*$  for all  $t$ , there is a vector  $\vec{k}$  of thresholds such that  $BR_G(\vec{k}) > \vec{k}$ .*

# Main theorem – Existence of equilibrium

- There exists a non-trivial equilibrium where all agents play threshold strategies

**Theorem 5.2.** *For all games  $G = (T, \vec{f}, h, m, 1)$  and all  $\epsilon$ , there exist  $n_\epsilon^*$  and  $\delta_{\epsilon, n}^*$  such that, if  $n > n_\epsilon^*$  and  $\delta_t > \delta_{\epsilon, n}^*$  for all  $t$ , then there exists a nontrivial vector  $\vec{k}$  of thresholds that is an  $\epsilon$ -Nash equilibrium. Moreover, there exists a greatest such vector.*

- Other equilibria?

# Some equations

- Total amount of agents =  $h * n$
- Agents of type  $t$  =  $f_t * h * n$
- Total amount of money  $M = h * n * m$

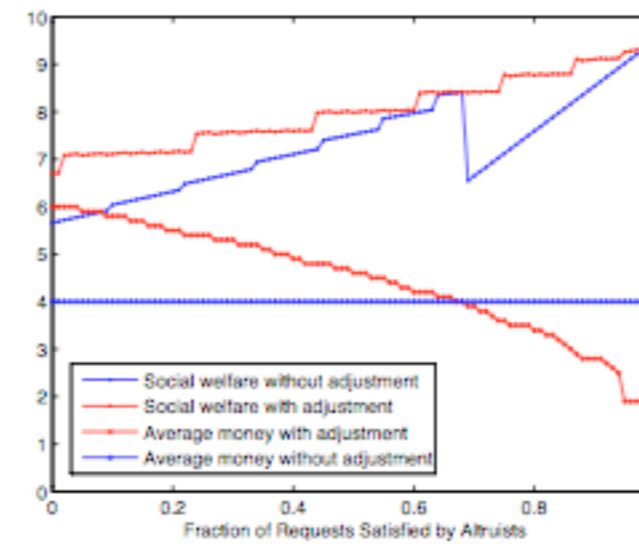
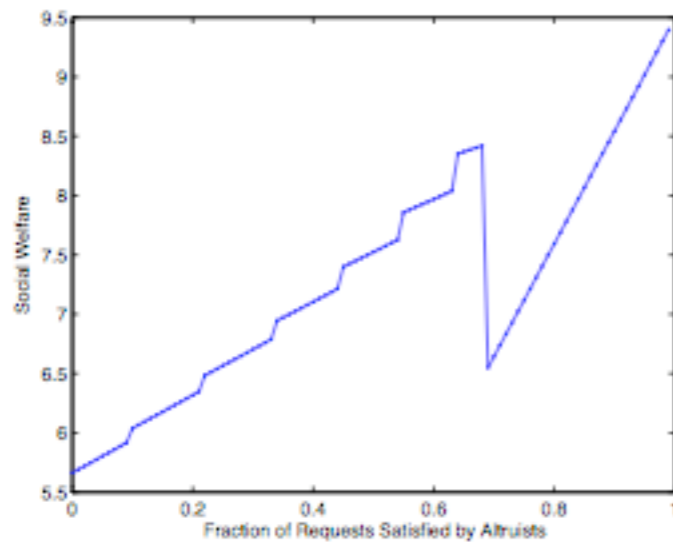
# Simulations: hoarders

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- Hoarders (defined here as non-volunteers) can cause system to break down
- Non-monetary strategy to discourage hoarder? Forced volunteerism?
- Response is to increase  $m$  (although babysitters example shows downside, if hoarding strategy is fleeting)

# Simulations: altruists

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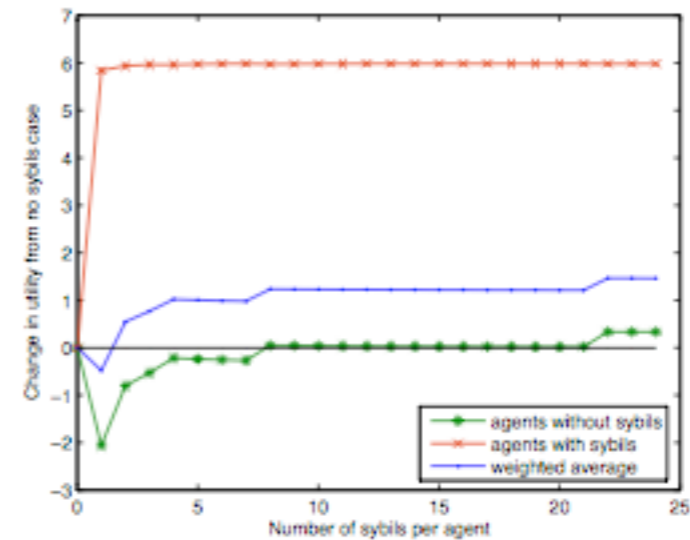
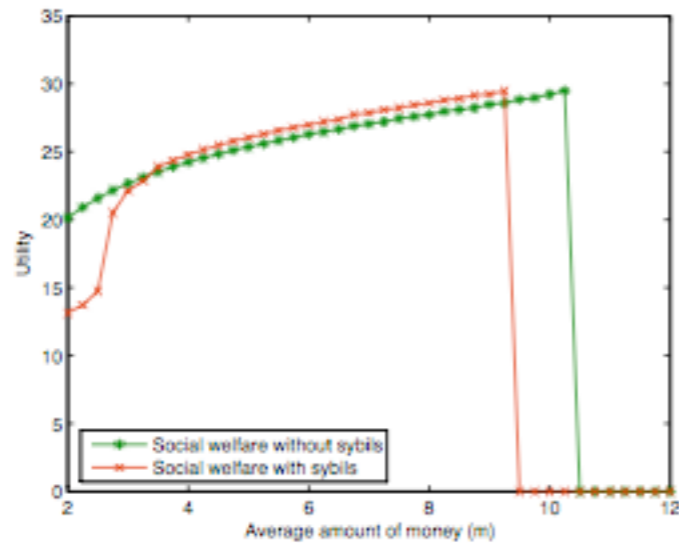


- A little altruism is good; too much can cause a crash



# Simulations: sybils

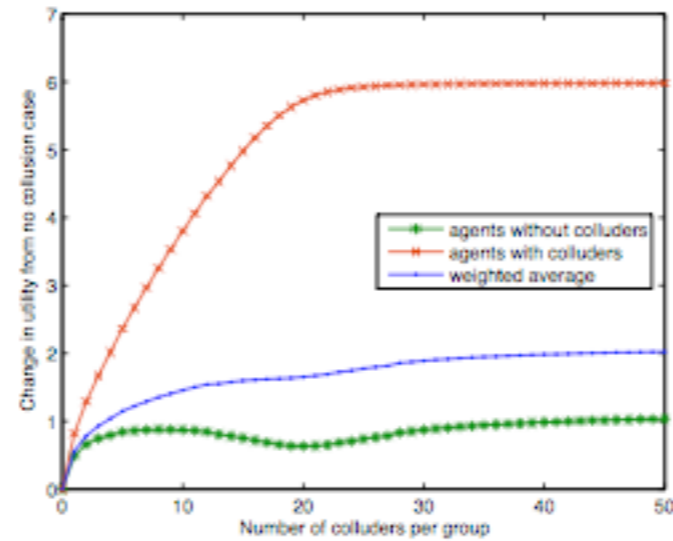
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- Only modest gains for sybils if no other agents act as sybils
- However, self-reinforcing process - as number of sybils grows, so does incentive to sybilize - can lead to crash

# Simulations: collusion

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- Colluders keep money in the system - do not reduce utility - work done by colluding group must = work paid for - net zero
- Implications for loans?