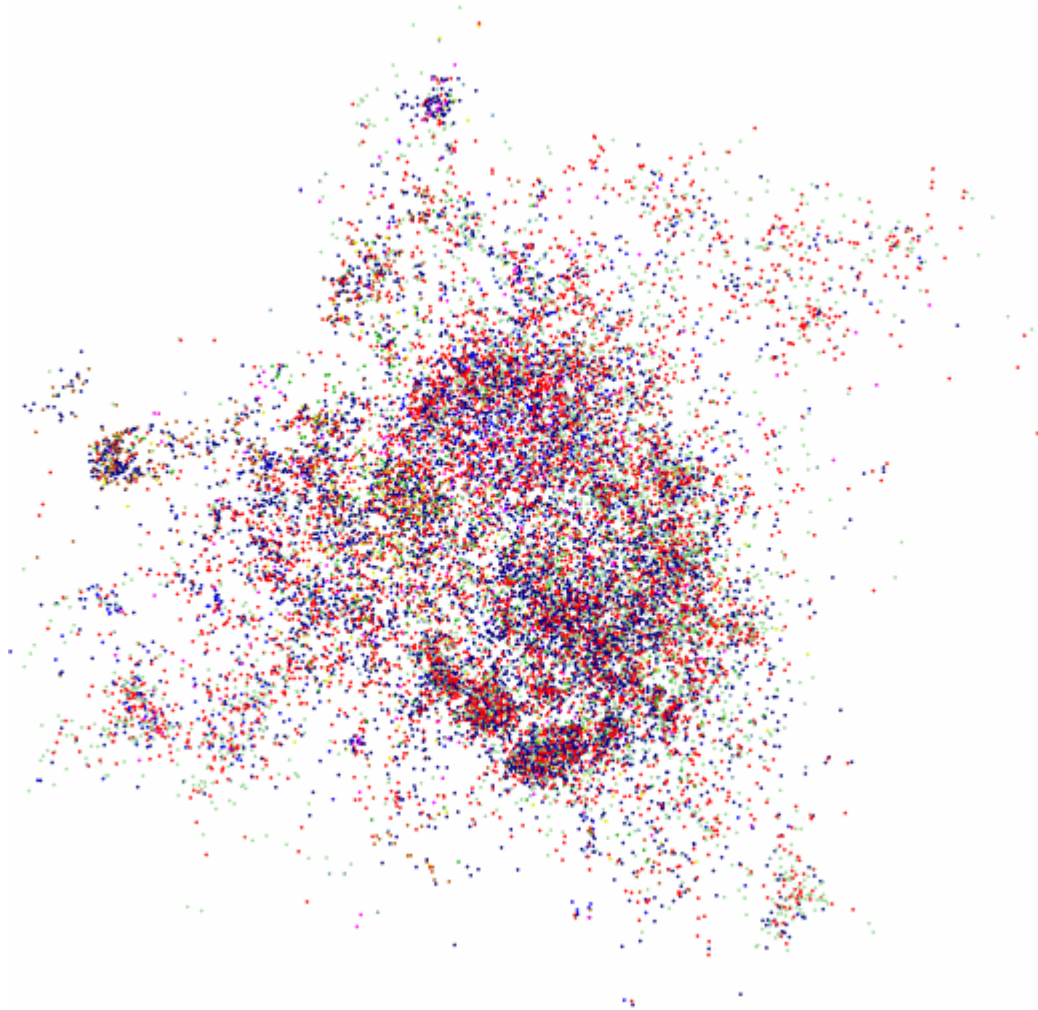


Network Games with Friends and Foes

Stefan Schmid

T-Labs / TU Berlin

Who are the participants in the Internet?



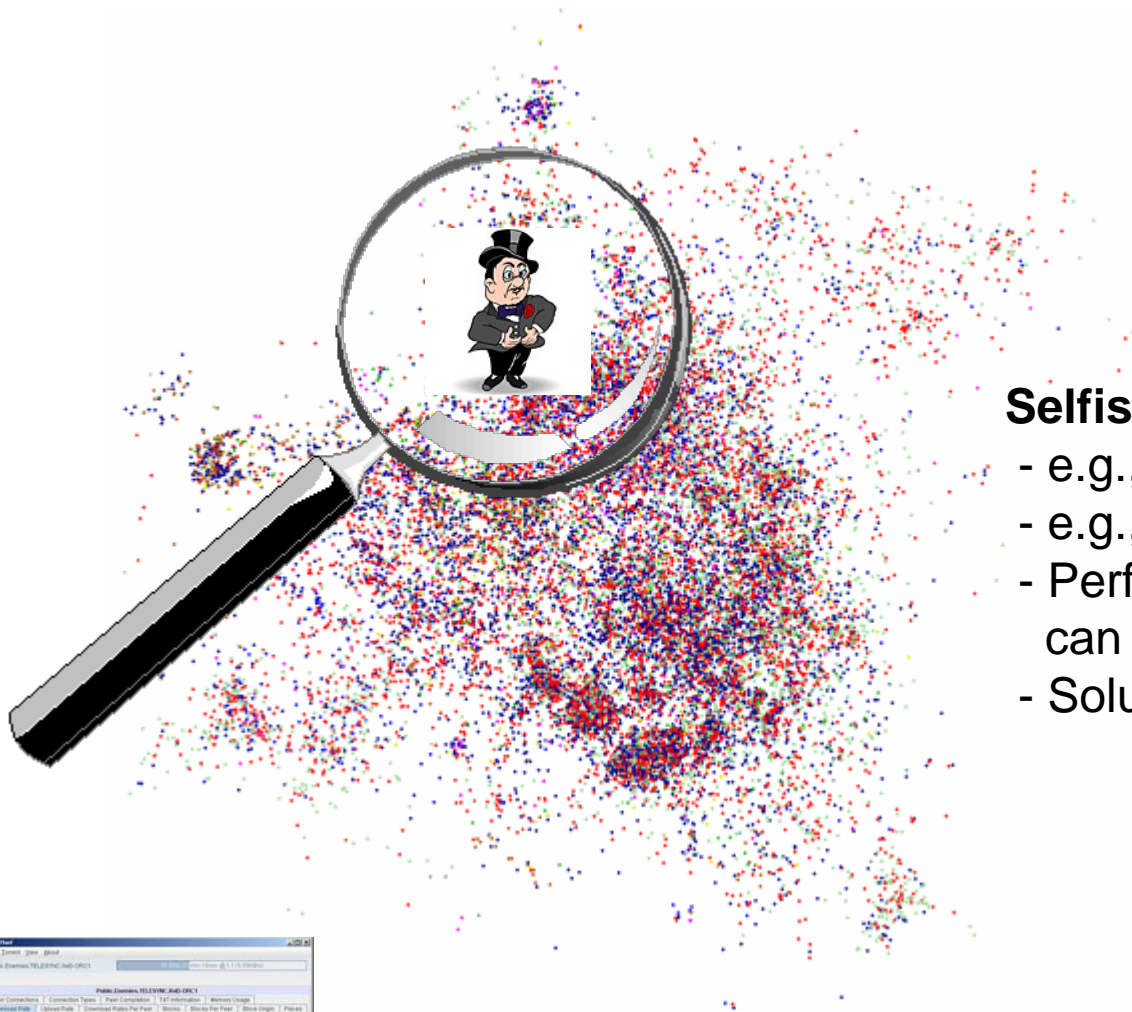
How to Model the Internet?



„Normal participants“:

- e.g., running „standard protocols“
- optimized for overall welfare (?)
or perfectly „collaborating“
- e.g., „peer-to-peer“ systems?

How to Model the Internet?



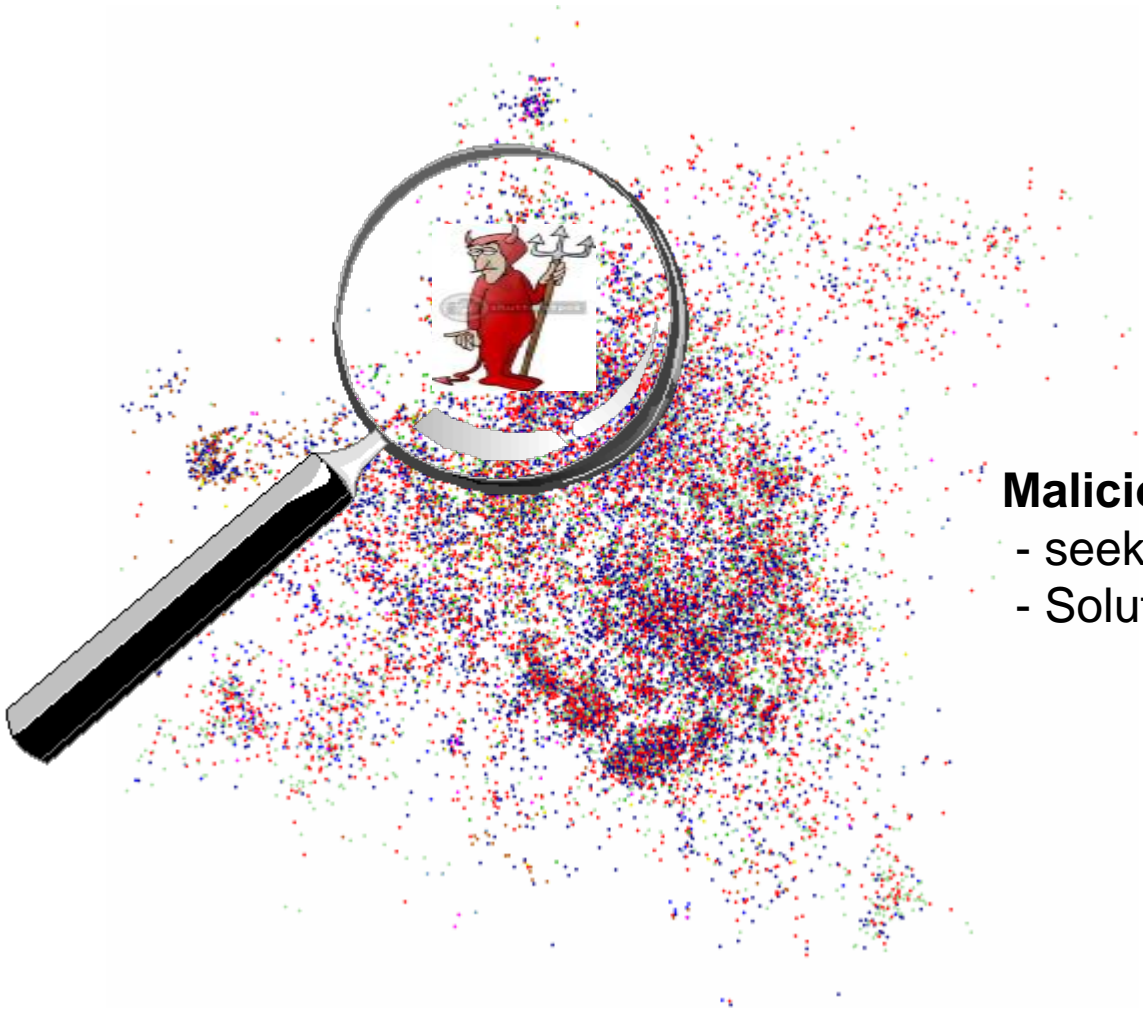
Selfish players à la Game Theory...:

- e.g., profit-maximizing company?
- e.g., **BitThief** BitTorrent client*?
- Performance / Nash equilibrium can be sub-optimal
- Solution: **mechanism design**?



* **BitThief**: Downloading without reciprocating (i.e., uploading), see <http://dcg.ethz.ch/projects/bitthief/>

How to Model the Internet?



Malicious players:

- seek to harm the system (e.g., p2p)
- Solution: access control?

How to Model the Internet?



Social networks:

- Player selfish...
- ... but supports friends!

Socio-Economic Complexity (Papadi' 2001)

„The Internet is unique among all computer systems in that it is **built, operated, and used** by a multitude of diverse **economic interests**, in varying relationships of collaboration and competition with each other.“

„This suggests that the mathematical tools and insights most appropriate for understanding the Internet may come from a fusion of algorithmic ideas with concepts and techniques from **Mathematical Economics and Game Theory**.“



Game Theory Reveals Interesting Phenomena

Example: **Windfall of Malice**

The presence of malicious players can yield better outcomes!

„When Selfish Meets Evil“ / „Price of Malice“

Moscibroda, Schmid, Wattenhofer (PODC 2006 + IM 2010)

**When selfish players are afraid of malicious players, they play more safely.
This can lead to better outcomes.**

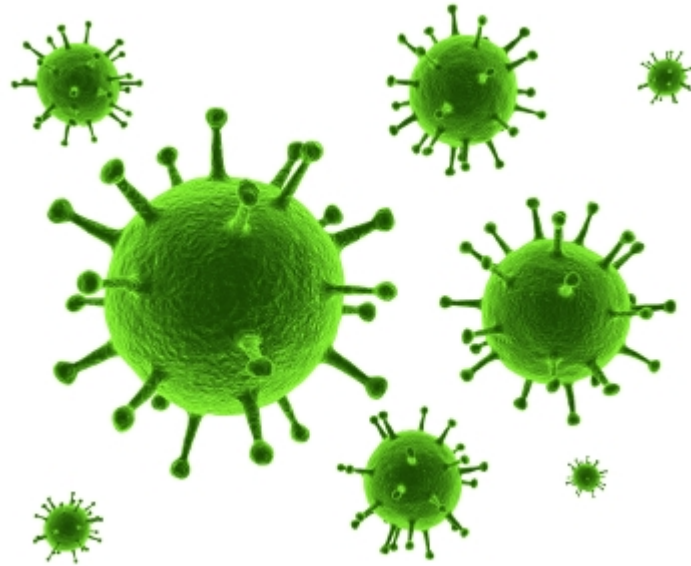
„Congestion Games with Malicious Players“

Babaioff, Kleinberg, Papadimitriou (EC 2007 + GEB 2009)

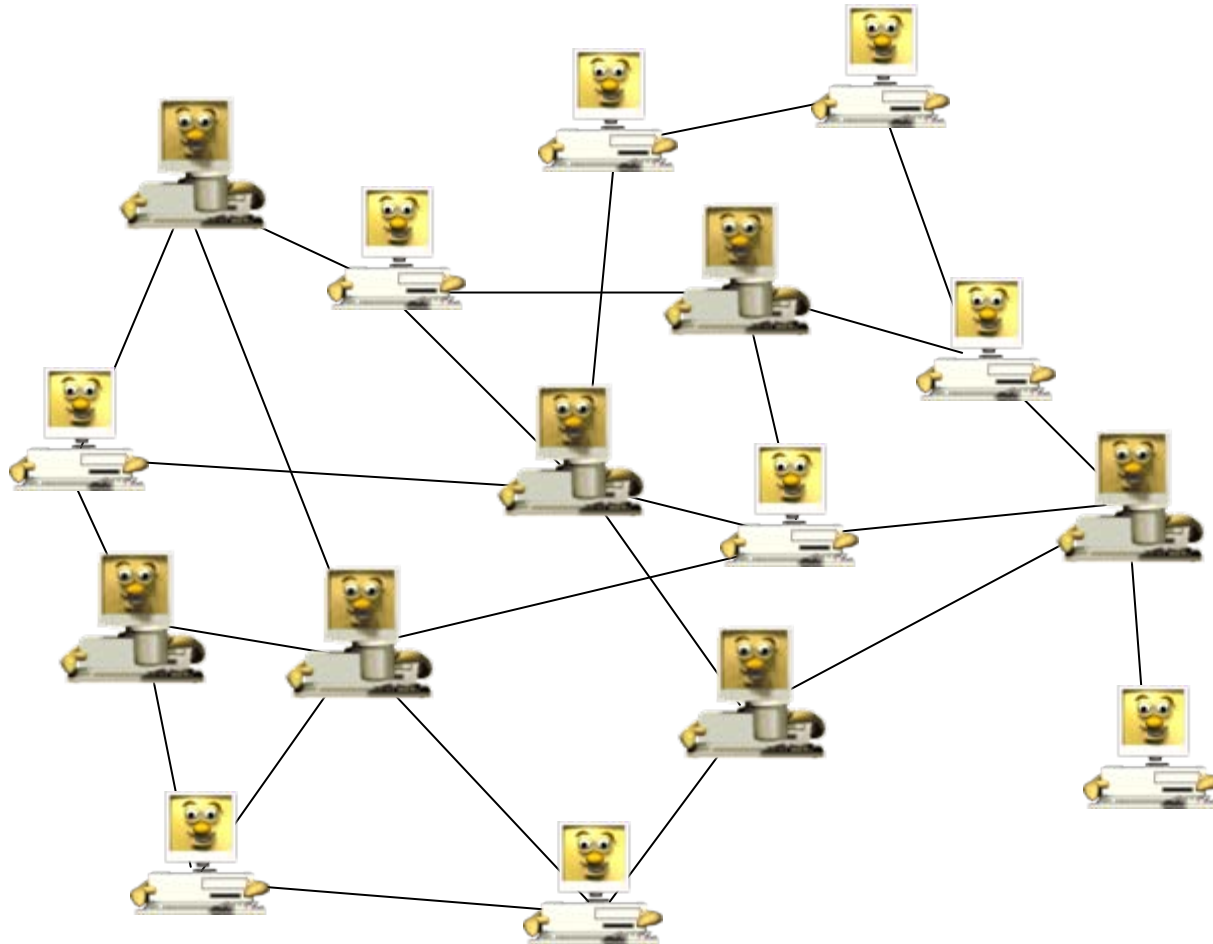
**When malicious players need to route traffic through the network as well,
inefficiencies of Braess paradoxes may be avoided, yielding a better outcome.**

Example:

The Virus Inoculation Game



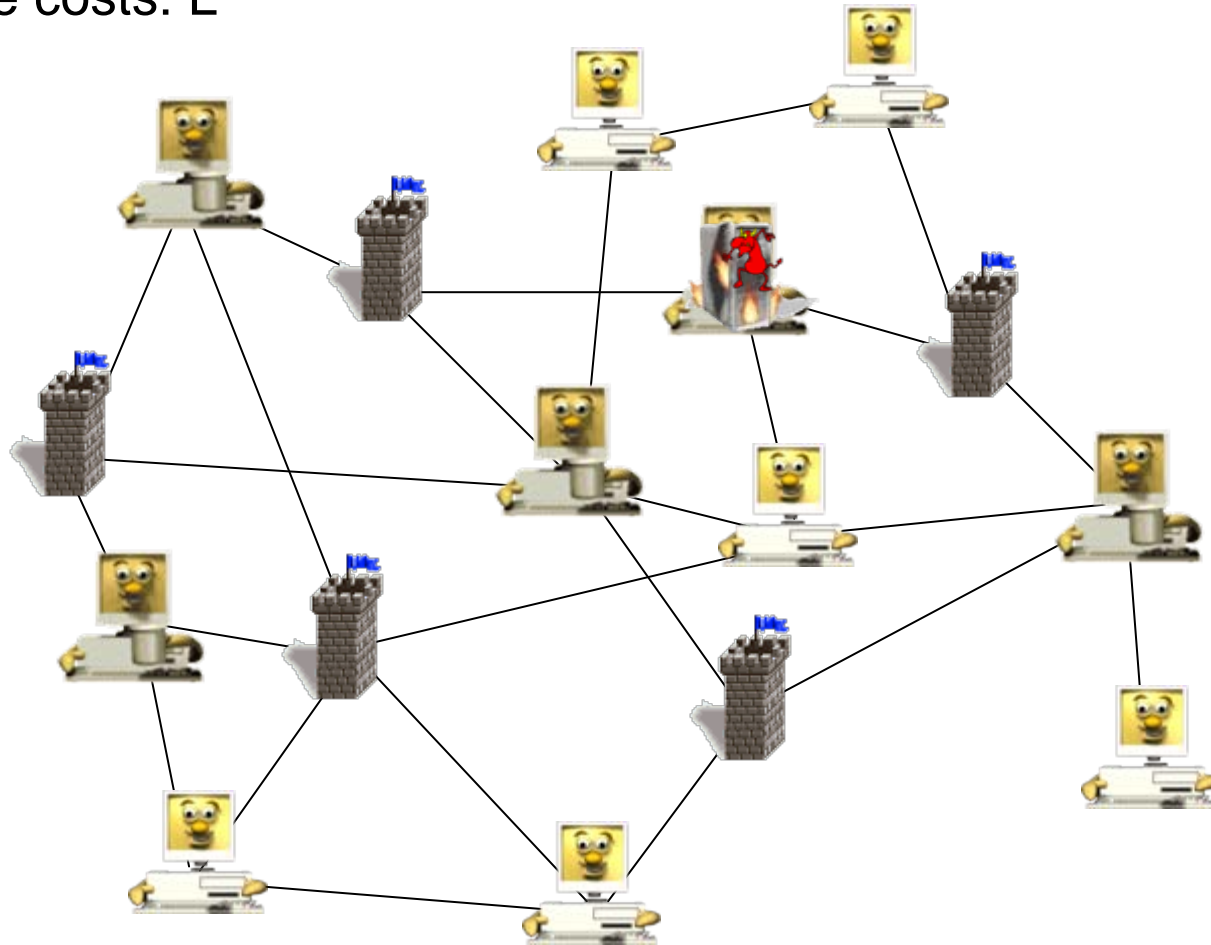
Virus Game: Setting



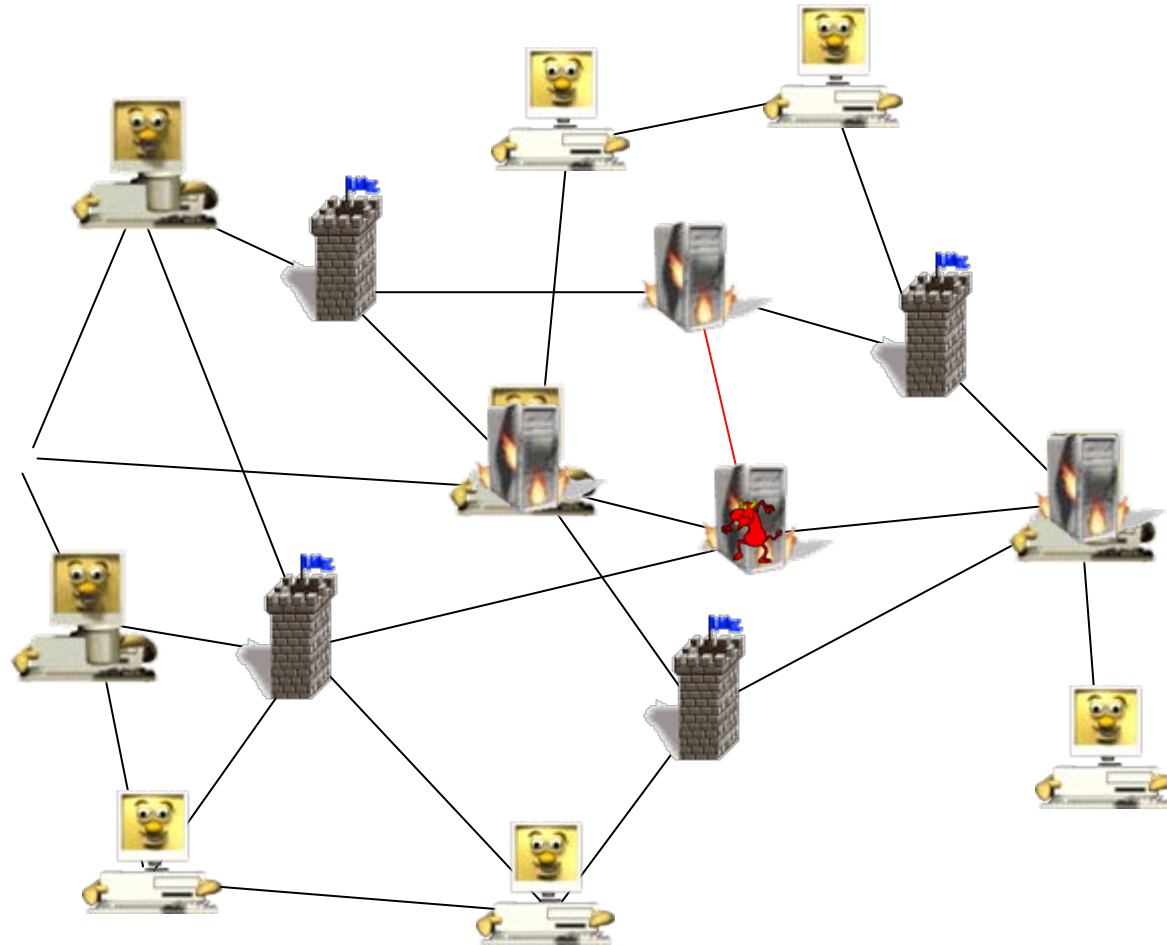
Virus Game: Players May Inoculate

Inoculation costs: C

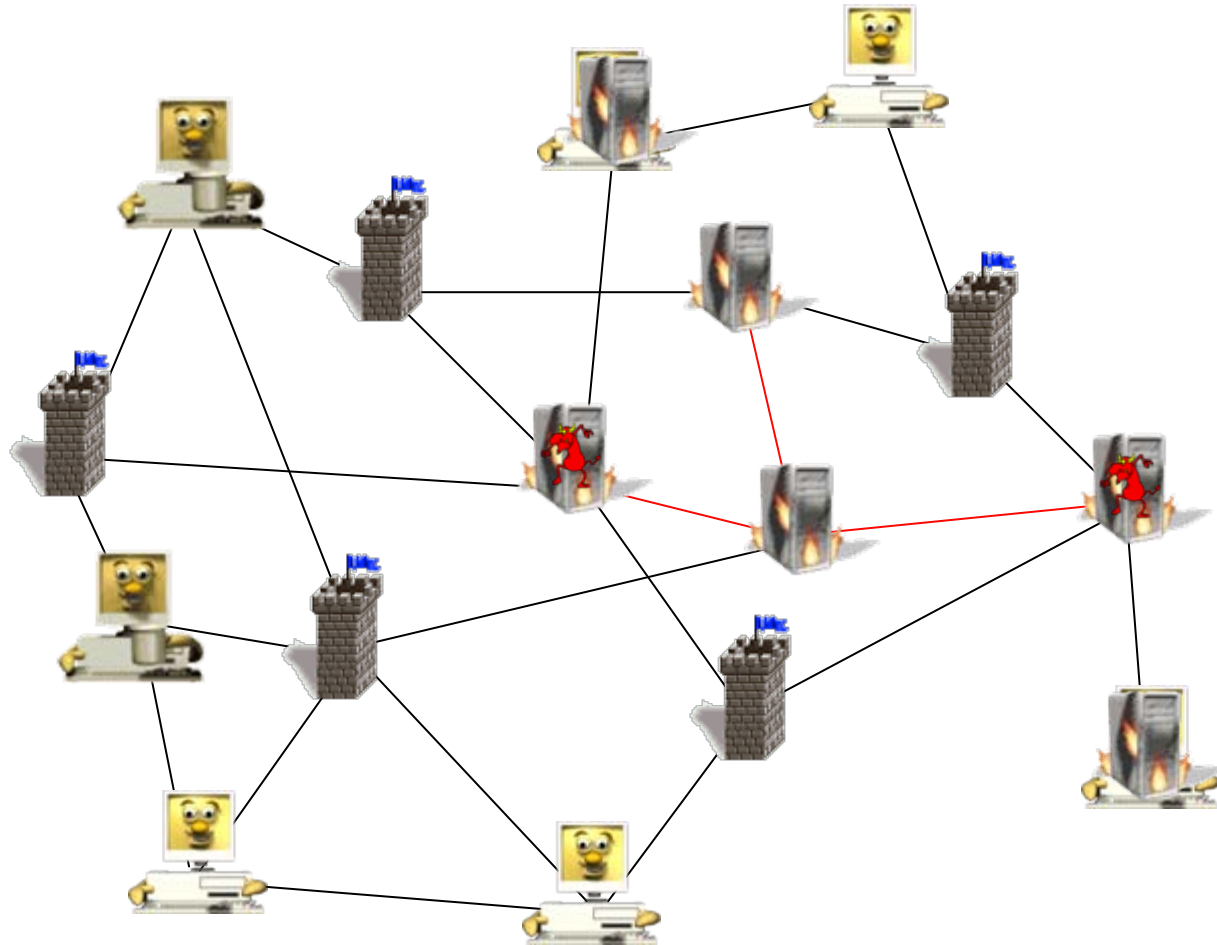
Virus damage costs: L



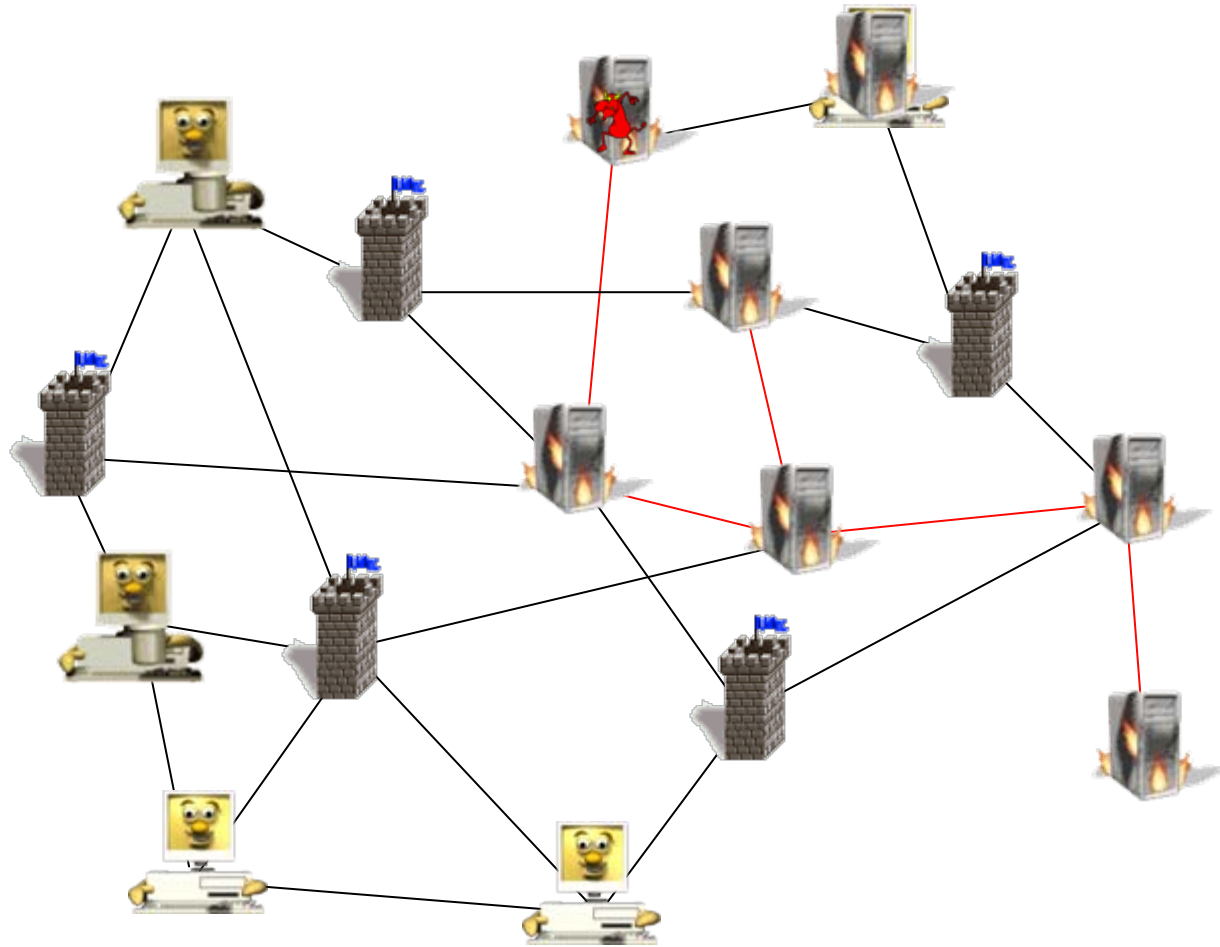
Virus Game: Virus Propagates...



Virus Game: ... in Attack Component



Virus Game



A Social Network Model

- Peers are **selfish**, maximize utility



- However, utility takes into account **friends' utility**
 - „local game theory“



- Utility / cost function** of a player

- **Actual individual cost:** $k_i = \text{attack component size}$

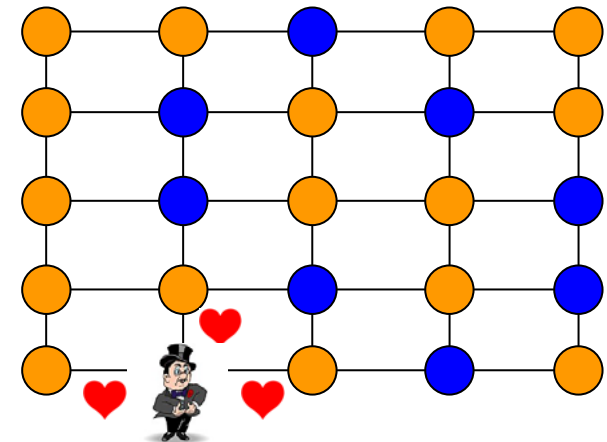
$$c_a(i, \vec{a}) = a_i \cdot C + (1 - a_i)L \cdot \frac{k_i}{n}$$

$a_i = \text{inoculated?}$

- **Perceived individual cost:**

$$c_p(i, \vec{a}) = c_a(i, \vec{a}) + F \cdot \sum_{p_j \in \Gamma(p_i)} c_a(j, \vec{a})$$

$F = \text{friendship factor,}$
 extent to which players care about friends

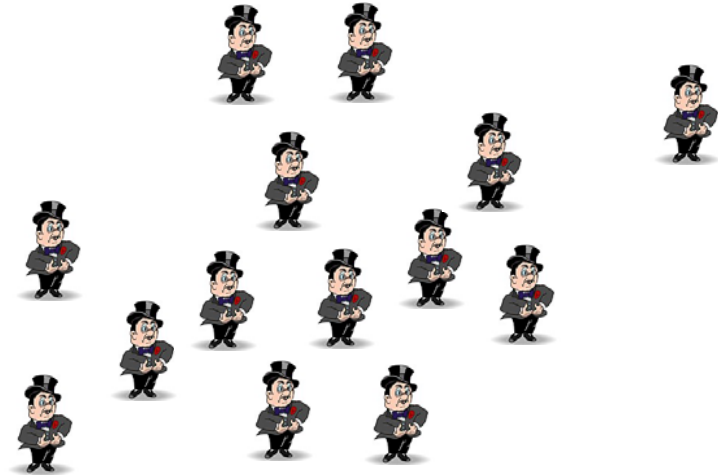


Some Definitions

- **Quantify** effects of social behavior vs purely selfish behavior?

- **Social costs**

- Sum over all players' **actual costs**



- Typical Assumption: Selfish player end up in an **equilibrium** (if it exists)
- **Nash equilibrium**
 - Strategy profile where each player **cannot improve** her welfare...
 - ... given the strategies of the other players
 - **Nash equilibrium (NE)**: scenario where all players are selfish
 - **Friendship Nash equilibrium (FNE)**: social scenario
 - FNE defined with respect to **perceived costs**!

Windfall of Friendship

- What is the impact of social behavior?
- Windfall of friendship
 - Compare (social cost of) **worst NE** where every player is selfish (perceived costs = actual costs)...
 - ... to **worst FNE** where players take friends' actual costs into account with a factor F (players are „social“)



Results based on

„On the Windfall of Friendship“
Meier, Oswald, Schmid, Wattenhofer (EC 2008)

Windfall of Friendship

- Formally, the **windfall of friendship (WoF)** is defined as

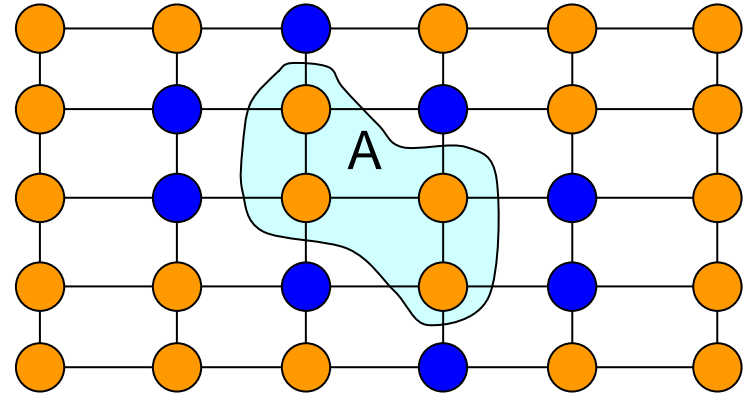
$$\Upsilon(F, I) = \frac{\max_{NE} C_{NE}(I)}{\max_{FNE} C_{FNE}(F, I)}$$

instance I describes graph, C and L

- WoF $\gg 1$ \Rightarrow system benefits from social aspect
 - Social **welfare increased**
- WoF < 1 \Rightarrow social aspect **harmful**
 - Social welfare reduced

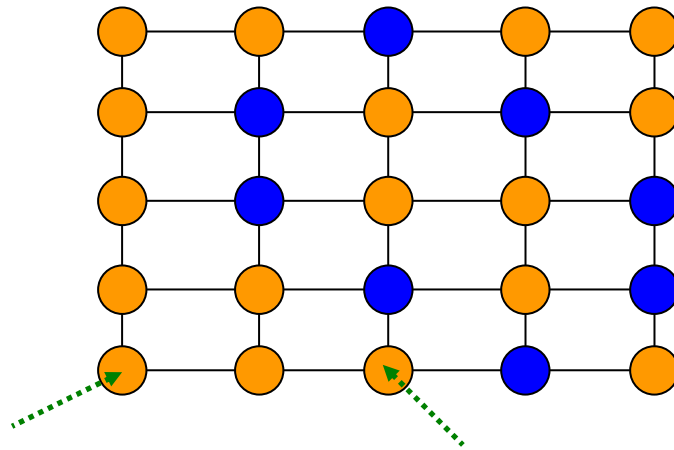
Characterization of NE

- In regular (and pure) **NE**, it holds that...
- **Insecure player** is in attack component **A** of size **at most Cn/L**
 - otherwise, infection cost?
 $> (Cn/L)/n * L = C$
- **Secure player**: if she became insecure, she would be in attack component of size **at least Cn/L**
 - same argument: otherwise it's worthwhile to change strategies



Characterization of Friendship Nash Equilibria

- In **friendship Nash equilibria**, the situation is **more complex**
- E.g., problem is **asymmetric**
 - One insecure player in attack component may be happy...
 - ... while other player in same component is not
 - Reason: second player may have **more insecure neighbors**



not happy, two insecure neighbors
(with same actual costs)

happy, only one insecure neighbor
(with same actual costs)

Bounds for the Windfall

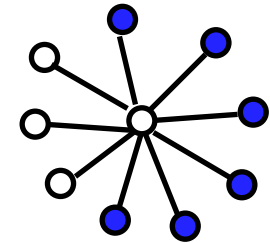
THEOREM 4.2. *For all instances of the virus inoculation game and $0 \leq F \leq 1$, it holds that*

$$1 \leq \Upsilon(F, I) \leq \text{PoA}(I).$$

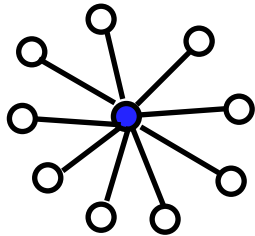
- It is **always beneficial** when players are social!
- The windfall can never be larger than the **price of anarchy**
 - Price of anarchy = ratio of worst Nash equilibrium cost divided by **social optimum** cost
- Actually, there are problem instances (with large F) which indeed have a windfall of this magnitude („**tight** bounds“, e.g., star network)

Example for Star Graph

- In **regular NE**, there is always a (worst) equilibrium where center is insecure, i.e., we have n/L insecure nodes and $n-n/L$ secure nodes (for $C=1$):



$$\text{Social cost} = (n/L)/n * n/L * L + (n-n/L) \sim n$$



- In **friendship Nash equilibrium**, there are situations where center *must* inoculate, yielding optimal social costs of (for $C=1$):

$$\begin{aligned} \text{Social cost} &= \text{„social optimum“} \\ &= 1 + (n-1)/n * L \sim L \end{aligned}$$



WoF as large as maximal price of anarchy in arbitrary graphs (i.e., n for constant L).

A Proof Idea for Lower Bound

- $WoF \geq 1$ because....:
- Consider **arbitrary FNE** (for any F):

From this FNE, we can construct (by a **best response strategy**) a regular NE with at least as large social costs

- Component size can only **increase**: players become insecure, but not secure
- Due to **symmetry**, a player who joins the attack component (i.e., becomes insecure) will not trigger others to become secure
- It is easy to see that this yields larger social costs

- In a sense, this result matches our **intuitive** expectations...

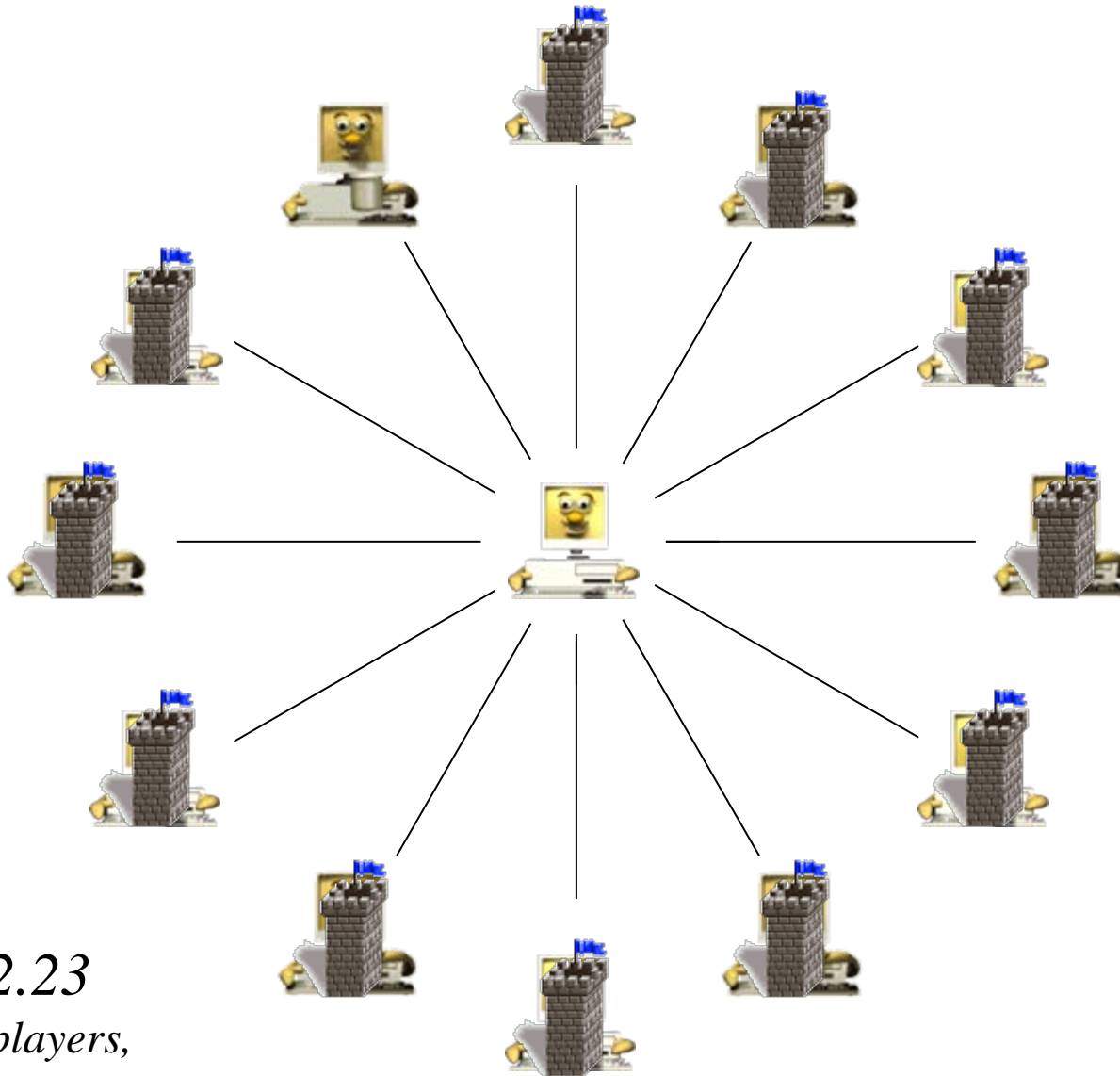


**But the windfall does not increase monotonously:
WoF can decline when players care more about their friends!**

- Example again in **simple star graph...**

Monotonicity: Counterexample

$n = 13$
 $C = 1$
 $L = 4$
 $F = 0.9$



total cost = 12.23
(many inoculated players,
attack component size two)

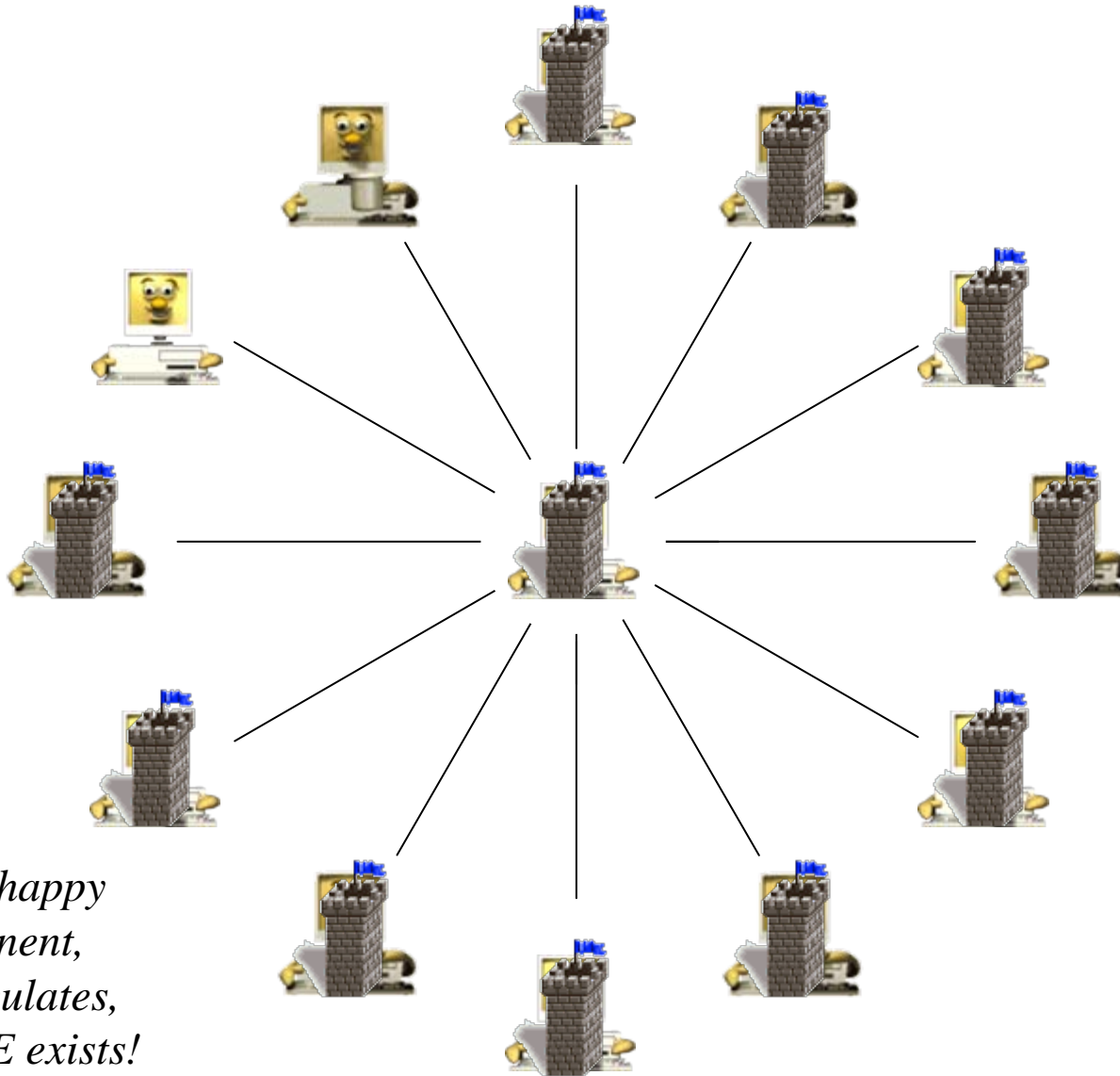
Monotonicity: Counterexample

$$n = 13$$

$$C = 1$$

$$L = 4$$

$$F = 0.1$$






















*Boundary players happy
with larger component,
center always inoculates,
thus: only this FNE exists!
total cost = 4.69*

Towards Socially Heterogeneous Networks



The Social Range Matrix

f_{ij} = How much does player i care about player j ?

				
		-		
	-			-
		-		
	-			

Costs and Equilibria

$c_a(i,s)$: actual cost of player i in profile s

$c_p(i,s)$: perceived costs of player i in profile s

$$c_p(i,s) = \sum_j f_{i,j} c_a(j,s)$$

Social equilibrium: No player has can reduce **perceived costs** by changing the strategy, given the other players' strategies.

The Social Range Matrix: Examples

Classic game theory: **Anarchy**

				
	1	0	0	0
	0	1	0	0
	0	0	1	0
	0	0	0	1

The Social Range Matrix: Examples

Altruistic setting:

				
	1	1	1	1
	1	1	1	1
	1	1	1	1
	1	1	1	1

Note: Social optimum is an equilibrium!

The Social Range Matrix: Examples









Monarchy setting:

				
	ε	1	0	0
	0	1	0	0
	0	1	ε	0
	0	1	0	ε

Arbitrarily small $\varepsilon > 0$

The Social Range Matrix: Examples

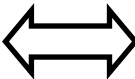
Selfish and a bad guy (seeks to minimize system performance):

				
	1	0	0	0
	0	1	0	0
	0	0	1	0
	-1	-1	-1	-1

The Social Range Matrix: Properties

Matrix can be „scaled“:

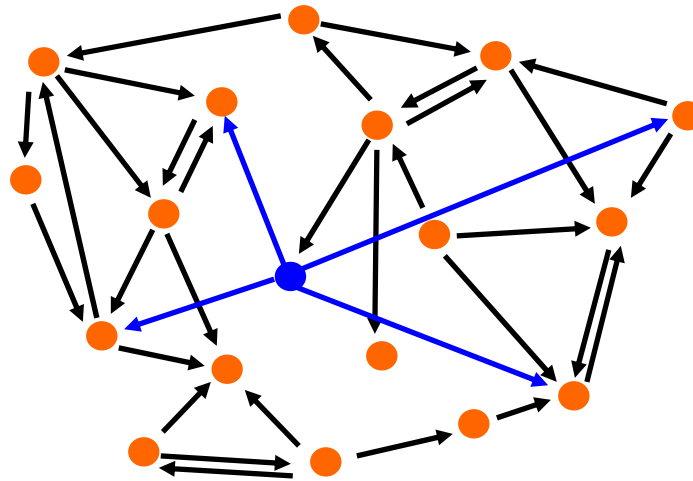
1	1	2	0	:2	1/2	1/2	1	0
3	3	3	3	:3	1	1	1	1
1	0	1	0	:1	1	0	1	0
4	1	2	4	:4	1	1/4	1/2	1



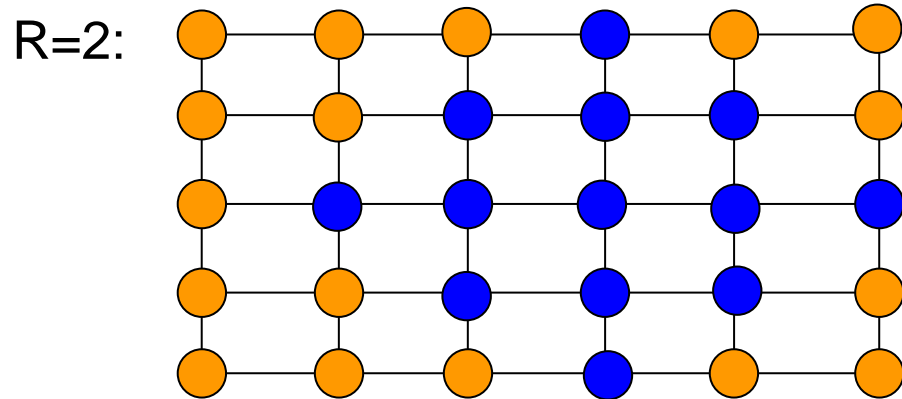
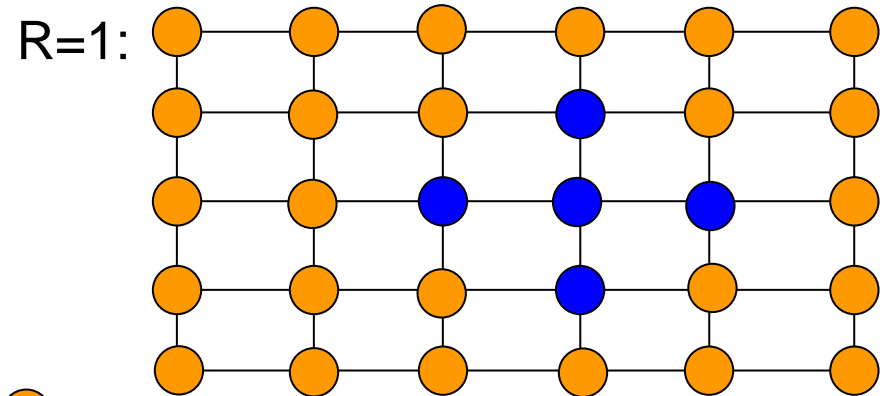
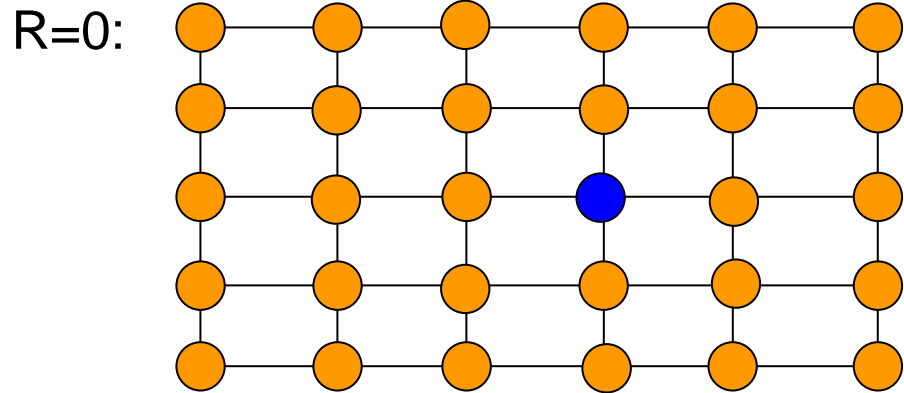
Multiplying a row by the same factor does not change equilibria or convergence!

Example:

Network Creation Game



Lookup in Unstructured P2P Network



Gnutella, e.g., R=5.

The Game

Undirected graph where one end pays for the connection:

$$c_a(i, s) = \alpha \cdot s_i - g\left(\sum_{j=1}^R |\Gamma^j(i, s)|\right)$$

utility increase as a function of R-hop neighborhood

parameter

number of connections payed for

set of neighbors at hop distance j

Typically, g is *concave*: The marginal benefit declines (e.g., chance of new data).

Some Results

For a complete set of results, see:

„Towards Network Games with Social Preferences“
Kuznetsov, Schmid (SIROCCO 2010)

Theorem: For $R=1$, any social range matrix has a pure equilibrium, for any α .

Theorem: If $g(x+1)-g(x) > \alpha/2$, then the social optimum is either the clique (if $R=1$) or a tree of diameter at most R .

Theorem: Anarchy can have a higher social welfare than monarchy (if α large), and vice versa!

Social Relationships and Topology

Intuitively, there is a tight relationship between the social range matrix and equilibrium topologies, e.g., for $R=1$:

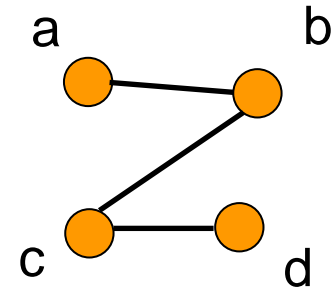
Players tend to connect to friends more than to foes.

Theorem: If $f_{ij} \in \{0, 1\}$, $f_{ii} = 1$, and $1 < \alpha < 2$:

There is a Nash equilibrium whose adjacency matrix corresponds to the social range matrix.

Social Relationships and Topology

Theorem: If $f_{ij} \in \{0, 1\}$, $f_{ii} = 1$, and $1 < \alpha < 2$:
 There is a Nash equilibrium whose adjacency matrix corresponds to the social range matrix.



F_{ij} :

	a	b	c	d
a	1	1	0	0
b	1	1	0	0
c	0	1	1	0
d	0	0	1	1

A_{ij} :

	a	b	c	d
a	0	1	0	0
b	1	0	1	0
c	0	1	0	1
d	0	0	1	0

Windfall of Friendship

Theorem: Society can only benefit from additional „1“-entries in social range matrix!
(Worst and best equilibrium are not worse.)

F_{ij} :

	a	b	c	d
a	1	1	0	0
b	1	1	0	0
c	0	1	1	0
d	0	0	1	1



F_{ij} :

	a	b	c	d
a	1	1	1	0
b	1	1	0	0
c	0	1	1	0
d	1	0	1	1



There is an equilibrium with at least as many connections
(yielding higher social welfare).

Price of Ill-Will

Theorem: The worst and best equilibrium can only be better if -1 entries are turned to 0 entries.

F_{ij} :

	a	b	c	d
a	1	-1	0	0
b	-1	1	0	0
c	0	-1	1	0
d	0	0	-1	1



F_{ij} :

	a	b	c	d
a	1	0	0	0
b	-1	1	0	0
c	0	0	1	0
d	0	0	-1	1



Conclusion

1. Models that capture **socio-economic complexity** of today's distributed systems?
2. **Social range matrix** as a further step.
3. Interesting phenomena „**Windfall of Malice**“ or „**Price of Friendship**“
 - depend on game
4. **Network topologies reflect social relationships**
5. Many open questions!

Thanks!

Thanks to my collaborators:



Petr Kuznetsov, Thomas Moscibroda, Yvonne Anne Pignolet, Roger Wattenhofer & Dominic Meier

Questions?

Papers online:

<http://www.net.t-labs.tu-berlin.de/~stefan/>