

# DELIS

Dynamically Evolving, Large-scale Information Systems



## SP 5: Biologically Inspired Techniques for “Organic IT”

Report for months 25 - 36

Participants

UniBO, UPF, Telenor, RAL

Lead partner: Bologna (UniBO)



Information Society  
Technologies

### Goals of SP5 “Biologically Inspired Techniques for Organic IT”

#### *General*

Identify, understand and reverse engineer techniques inspired by biological and social systems that display “self-\*” properties. Deploy these in networked information systems

#### *Specific*

Consolidate and import BISON findings. Identify “nice” properties of biological and social systems. Relate found natural network “forms” to engineering “functions”

**Identify desirable life-like properties - “Self-\*”**

Algorithms

Simulations / Tools

Implementations

Industrial Applications

### Structure of SP5 “Biologically Inspired Techniques for Organic IT”

WP	Months							
	25-27	28-30	31-33	34-36	37-39	40-42	43-45	46-48
5.2	Evolved tinkering and degeneracy as engineering concepts							
5.3	Bio-inspired design for dynamic solution spaces							
5.4	Multi-scale topology evolution in natural and artificial networks							
5.5	Identifying and promoting industrial applications			●				
5.6	The structure of tinkered landscapes			●				

● = deliverable

### Deliverables for 2006

- D5.2.4:** Modelling open source development networks (month 36)
- D5.3.1:** From biological and social algorithms to engineering solutions (month 36)
- D5.4.2:** Understanding and engineering ``multi-scale" selection in evol.nets (month 36)
- D5.5.1:** Promising industrial applications in dynamically evolving networks (month 37)
- D5.6.2:** Integrated package for evolutionary dynamics of information networks including evolved design and landscape structure (month 36)

### Deliverables planned for 2007

- D5.2.5:** Degeneracy and redundancy in self-organised systems (month 48)
- D5.3.2:** Applications of bio- and socio-inspired algorithms in info. Systems (month 48)
- D5.4.3:** Form and function in evolving information systems (month 48)

### Goals (start month 0)

#### *General*

Explore ways of applying evolutionary computational strategies to the optimisation of pre-existing information systems. Facilitate the interaction between engineers and automatic systems in the construction of efficient information processing networks

#### *Specific*

Investigate the topological evolution of open source developer networks. Identify structures and processes.

### Partners

**UPF**, UniBO, Telenor

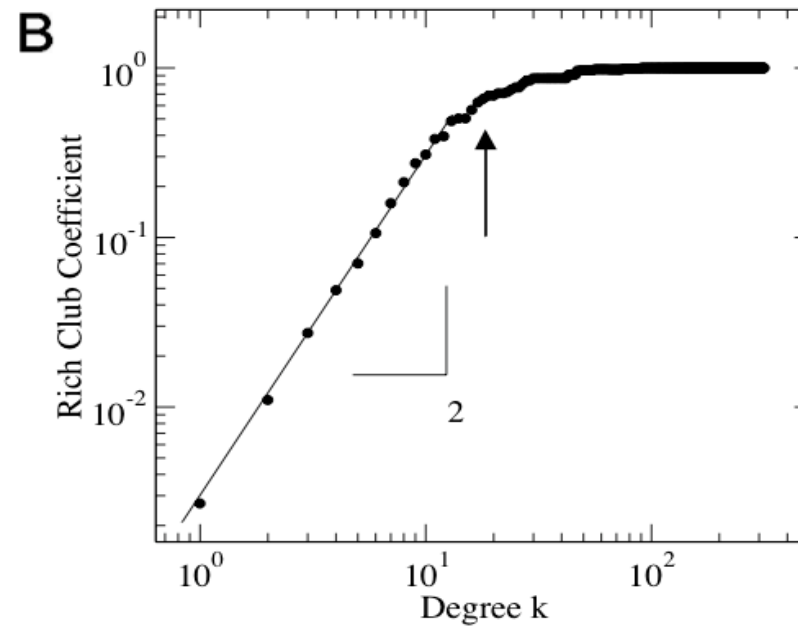
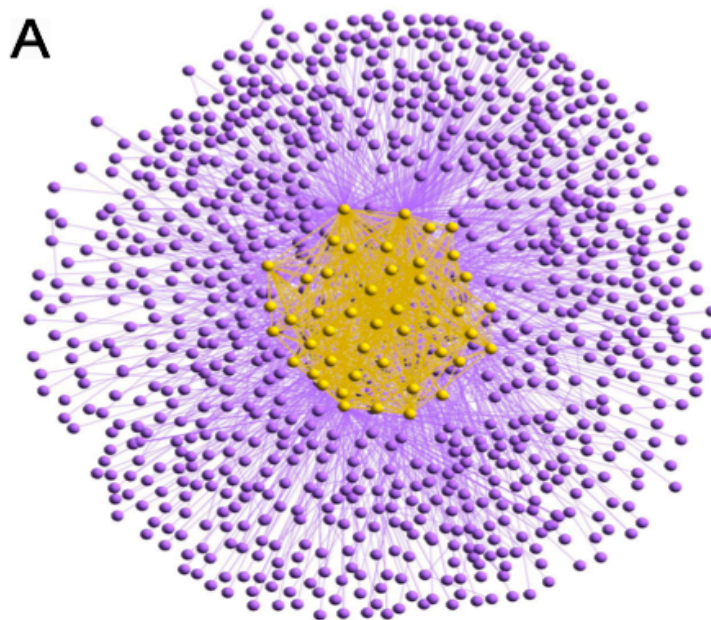


### Results (from D5.2.4)

- Analysis of open source (OS) development community e-mail logs
- Shows strong hierarchy (rather than highly distributed)
- A “rich club” can be identified in a quantitative way
- Simple mode of preferential attachment with non-local evolution can reproduce this pattern
- More generally, first quantitative empirical evidence for the emergence of hierarchy in distributed networks of interacting agents

### Rich Clubs in OS Communities

- Analysis of e-mail logs between open source developers for 120 different OS projects
- Filtered such that only e-mail related to bugs / development used
- Produces a weighted social network with weight indicating the amount of e-mails sent between pairs of developers
- Found power law distributions
- Hence there are a few pairs of members exchanging more e-mails than with the rest of the community.
- Analysis suggests these key members play the role of hubs since they also have the largest number of connections
- Further, they form a “rich club”, connecting almost exclusively to each other rather than less active members



Correlations and rich-club phenomenon in the *Python* OS community. (A) Visualization of the rich-club where yellow balls depict hubs having  $k > k_c$ . (B) The rich-club coefficient scales with degree  $k$  and saturates once  $k > k_c$ . The pointing arrow indicates the crossover  $k_c \approx 10$ .





- Open source communities comprise a small set of hubs mediating the majority of e-mail traffic
- These hubs follow a “rich club” structure and can be automatically identified
- Counter to common view that OS is completely distributed, it is highly centralised
- Publications:
  - Sergi Valverde et al, (2006) “Self-Organization Patterns in Wasp and Open-Source Communities”, IEEE Intelligent Systems, 21(2), pp. 36-40
  - Sergi Valverde and Ricard V. Sole, “Self-organization and Hierarchy in Open-Source Social Networks”, *Submitted* to Physical Review E.
- Future: Metrics / tools for open source development communities, relating degeneracy in P2P systems (D5.2.5, month 48)

### Goals (start month 19)

#### *General*

Develop tools and methods to translate / modify biologically and socially inspired algorithms for application in realistic information systems environments

#### *Specific*

Select a set of candidate algorithms and application domains. Use simulation and apply necessary tuning to produce acceptable performance

### Partners

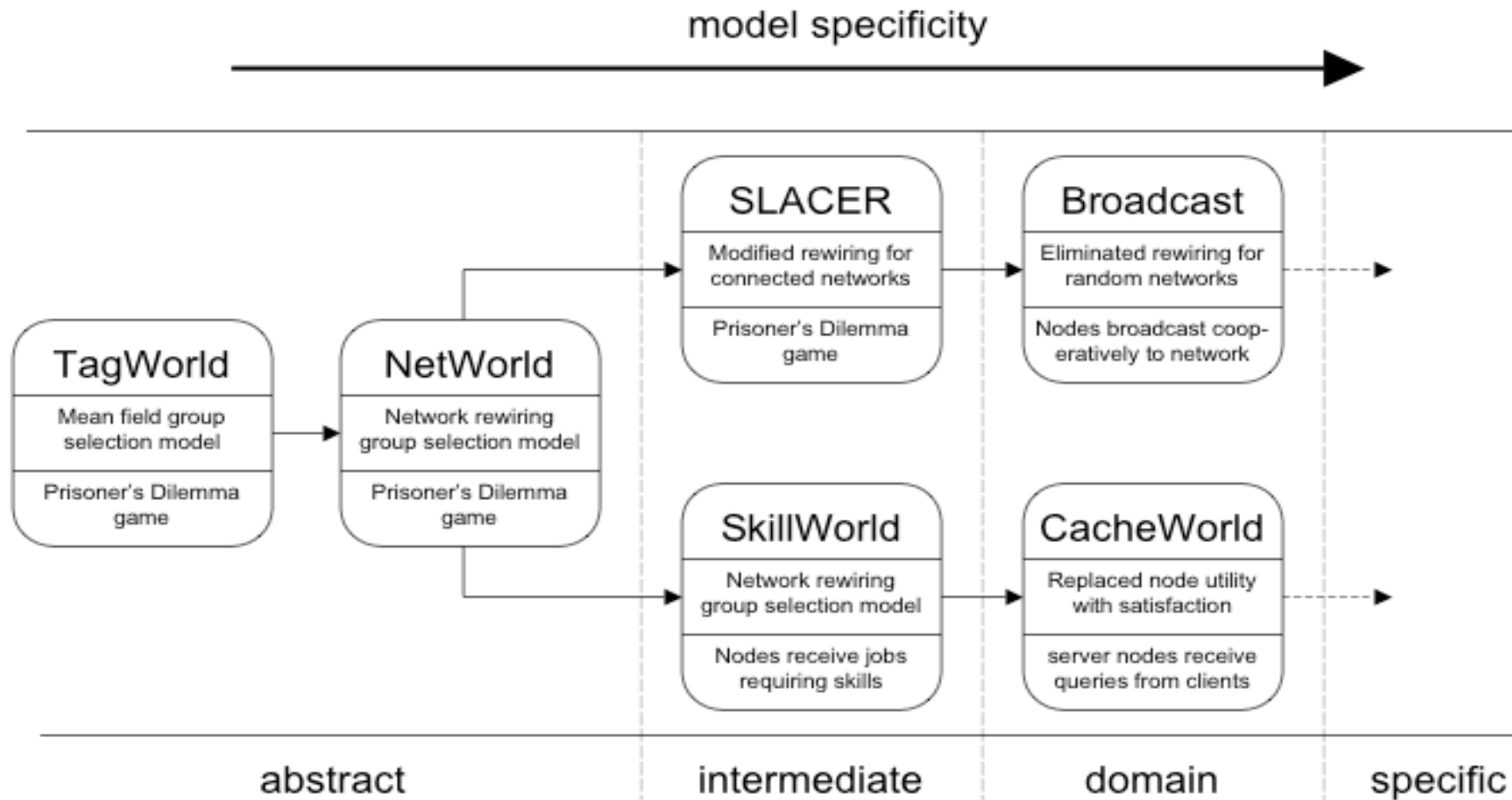
**UniBO**, RAL, UPF, Telenor



### Results from D5.3.1

- Method / approach
  - model chains - from abstract / general models to concrete applications
  - towards “design patterns” of general approaches
  - Artificial Social Bootstrapping (ASB) idea
  - grounding / representing “utility”, dealing with utility lying
- Broadcast application
  - nodes initiate, receive and possibly pass-on messages
  - evolve passing behaviour selfishly
  - appears to self-organise around a critical threshold
- Cooperative content replication
  - server nodes form a dynamic overlay
  - neighbours mutually replicate content and share queries
  - nodes behave selfishly forming mutually beneficial alliances

### Deriving specific applications via model chains





### Tags, SLAC and SLACER

- P2P networks are usually open systems
  - Possibility to free-ride
  - High levels of free-riding can seriously degrade global performance
- We present simple protocols (SLAC & SLACER) that sustain high levels of cooperation despite selfish nodes
- We show that certain types of cheating and lying behavior do not necessarily destroy cooperation (on the contrary, may even improve, certain aspects, of it!)

- Originated in Computational Sociology (John Holland 1992)
- Developed by Michigan group – Riolo, Axelrod, Cohen.
- Tags: observable social cues e.g. hairstyle, dress, accent...
- Tags evolve through copying and mutation (genes / memes)
- Limiting interactions between agents with similar tags leads to cooperative altruistic behaviour
- Agents characterized by Tag, Behavior (strategy), Utility
- Agents features in tag systems
  - Interaction restricted to agents with similar tag
  - Selfish optimization through copy of tag and behavior of better performing agents (both copied as one “package”)
  - Periodic mutation of tag and behavior



- Agents represented by nodes in an overlay network
- Tag represented by set of neighbors (view) in overlay
- Interaction between neighbors to achieve an application task
- Behavior: Application behavior (i.e. share files or leech files)
- Utility: Evaluated at application level (i.e. number of files downloaded)



Node  $p$  periodically executes the following:

$q = \text{SelectPeer}()$

**if**  $\text{utility}_q > \text{utility}_p$

    drop all current links

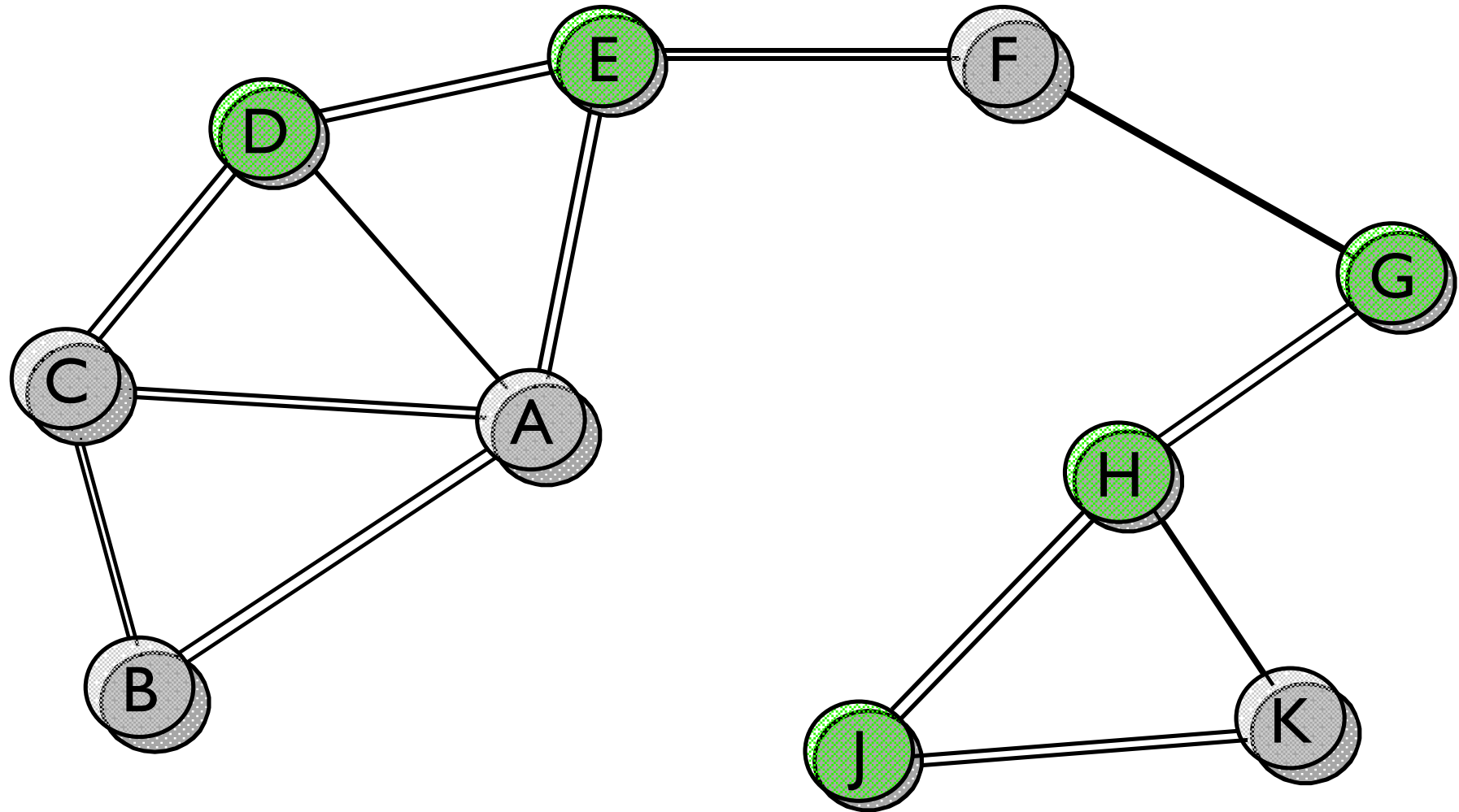
    link to node  $q$  and copy its strategy and links

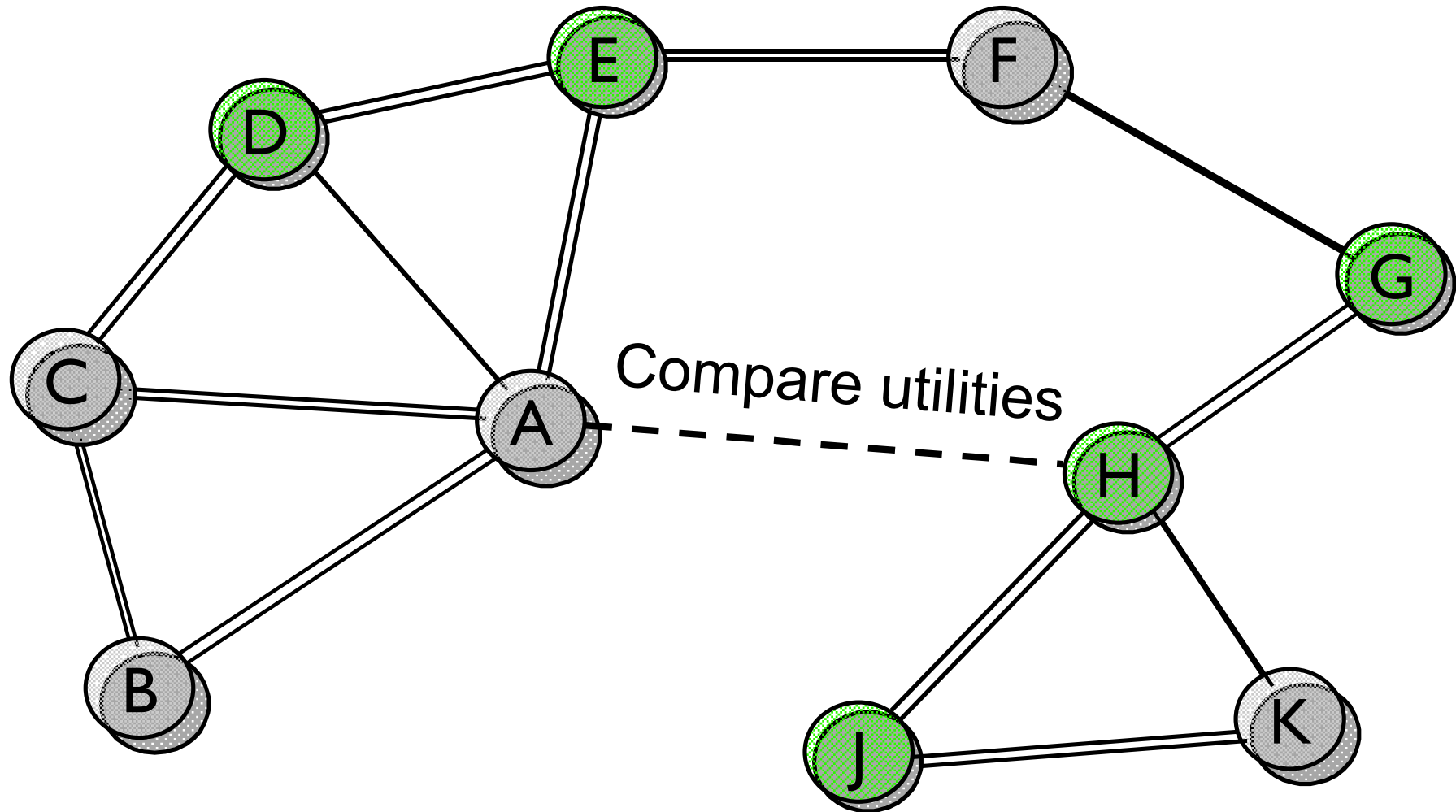
    mutate (with low probability) strategy and links

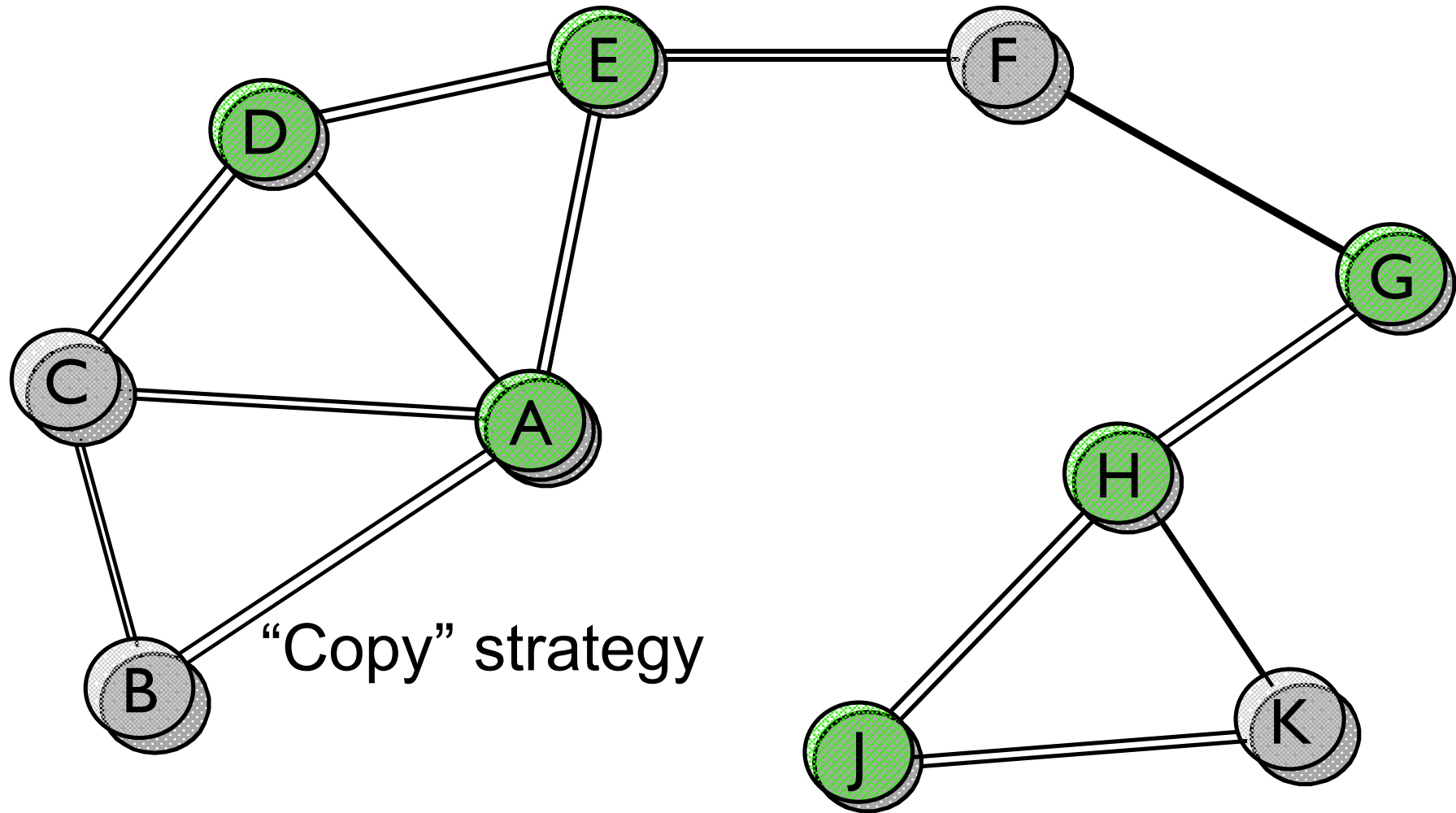
**fi**

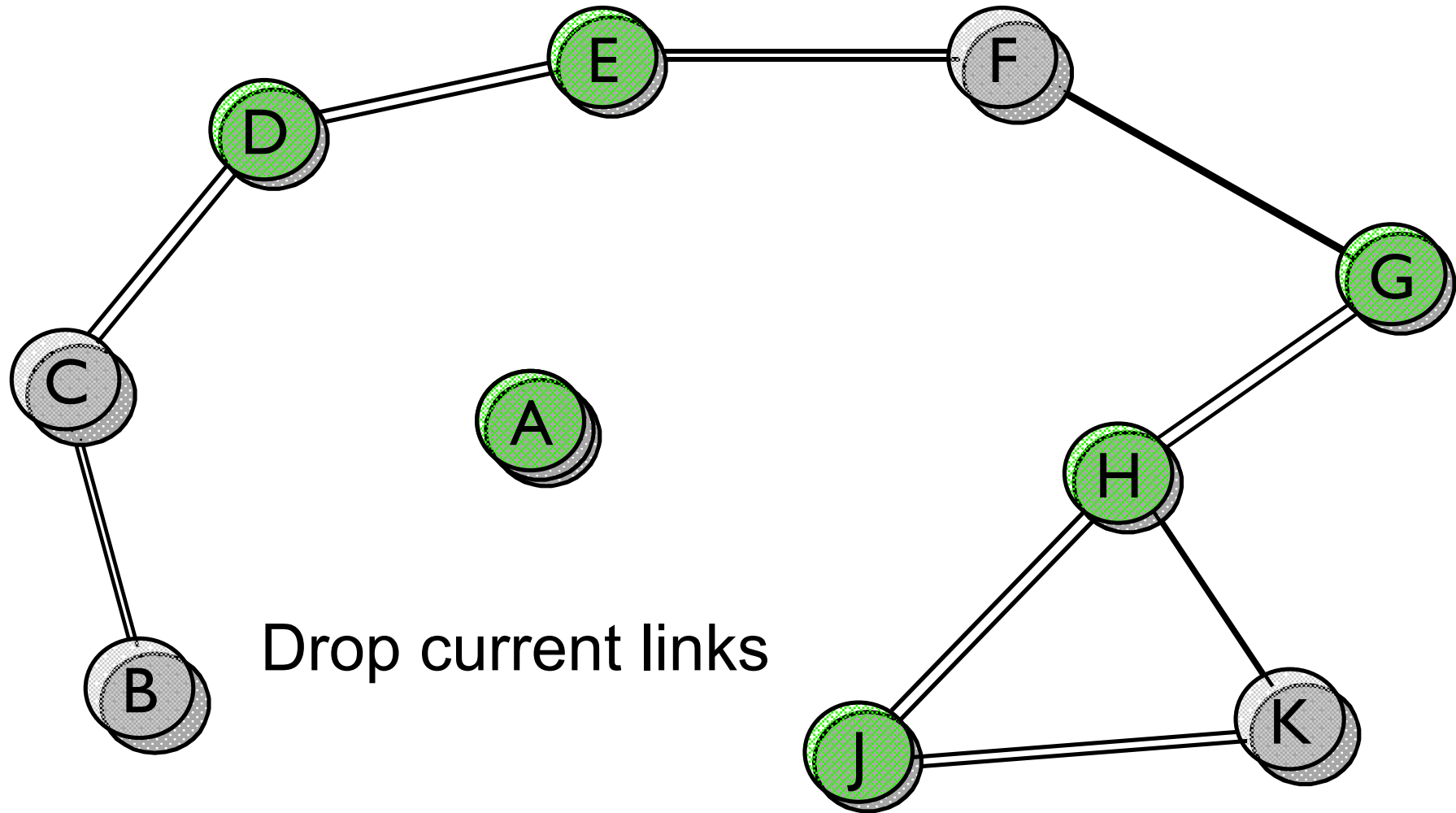
*Peer selection* based on a random overlay network (Newscast), whereas *copying*, *rewiring* and *mutating* are with respect to an application (strategy) over an “interaction network”

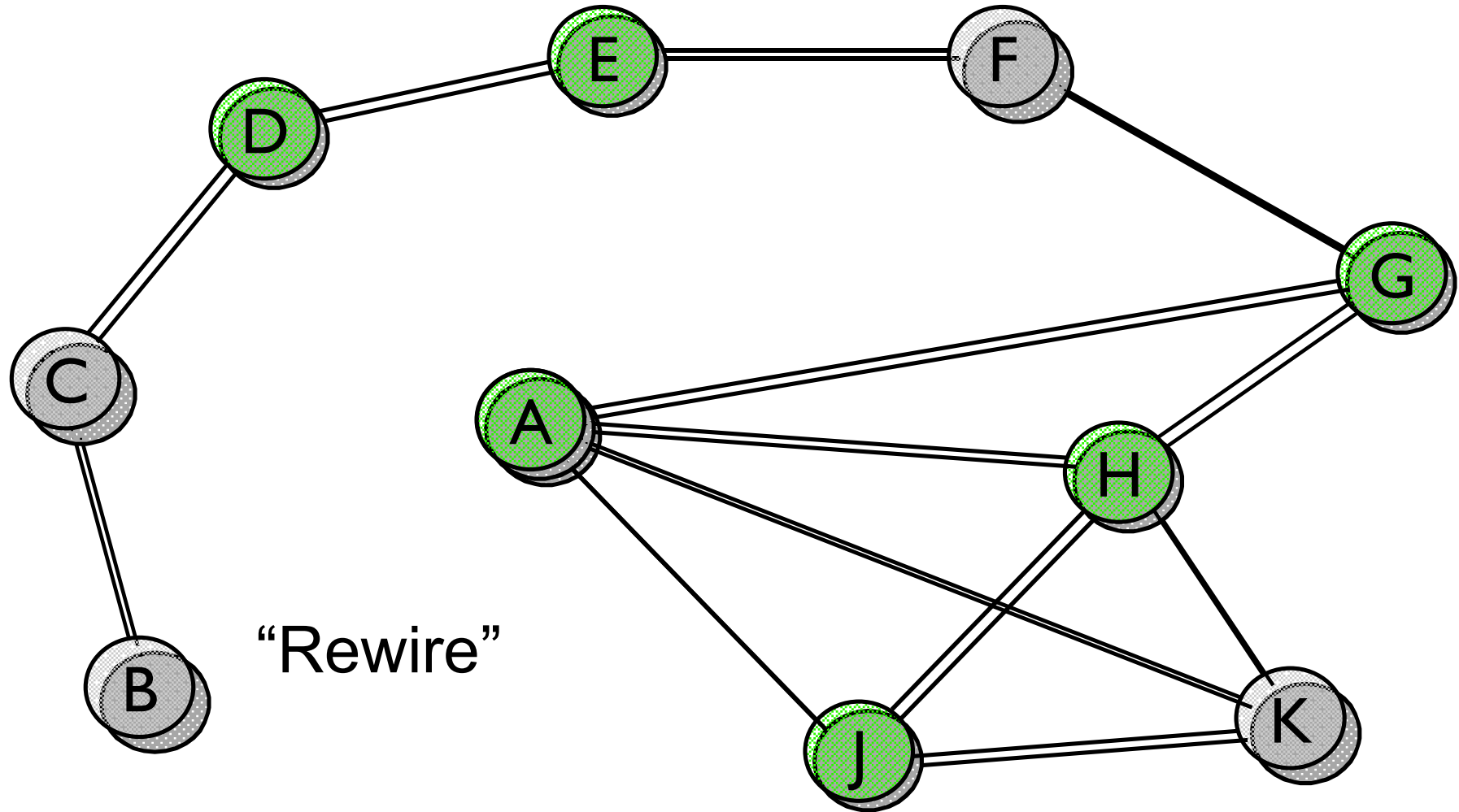


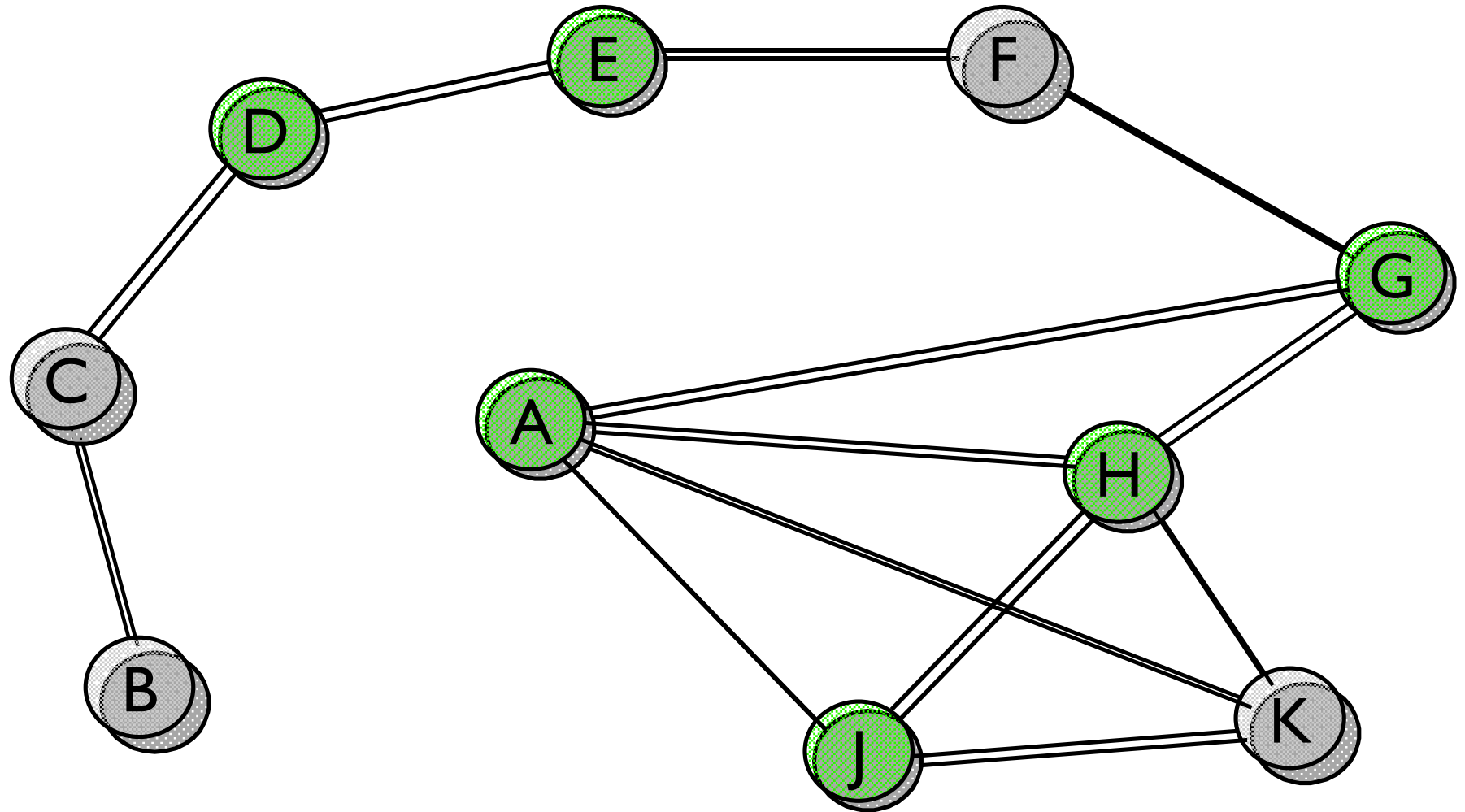


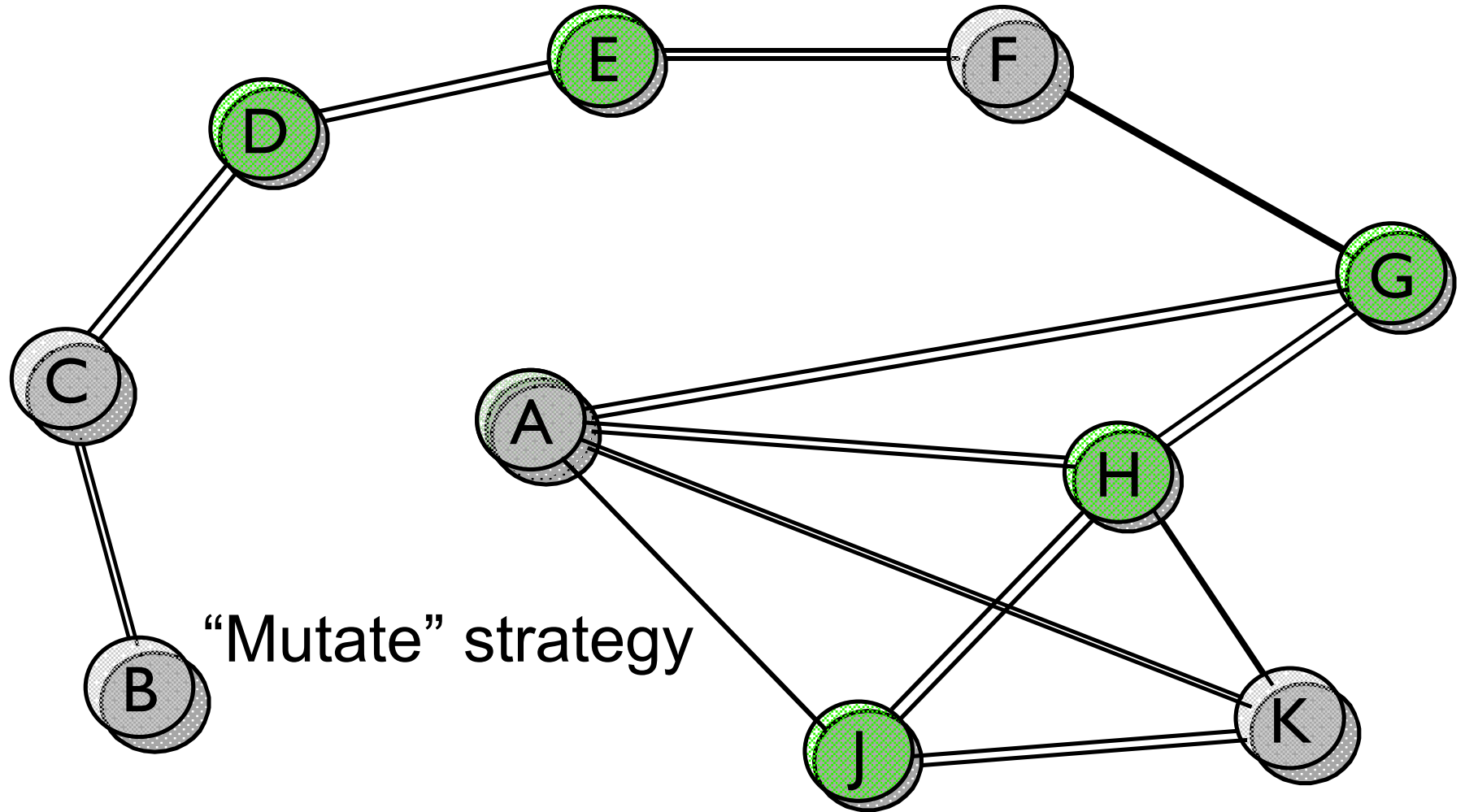


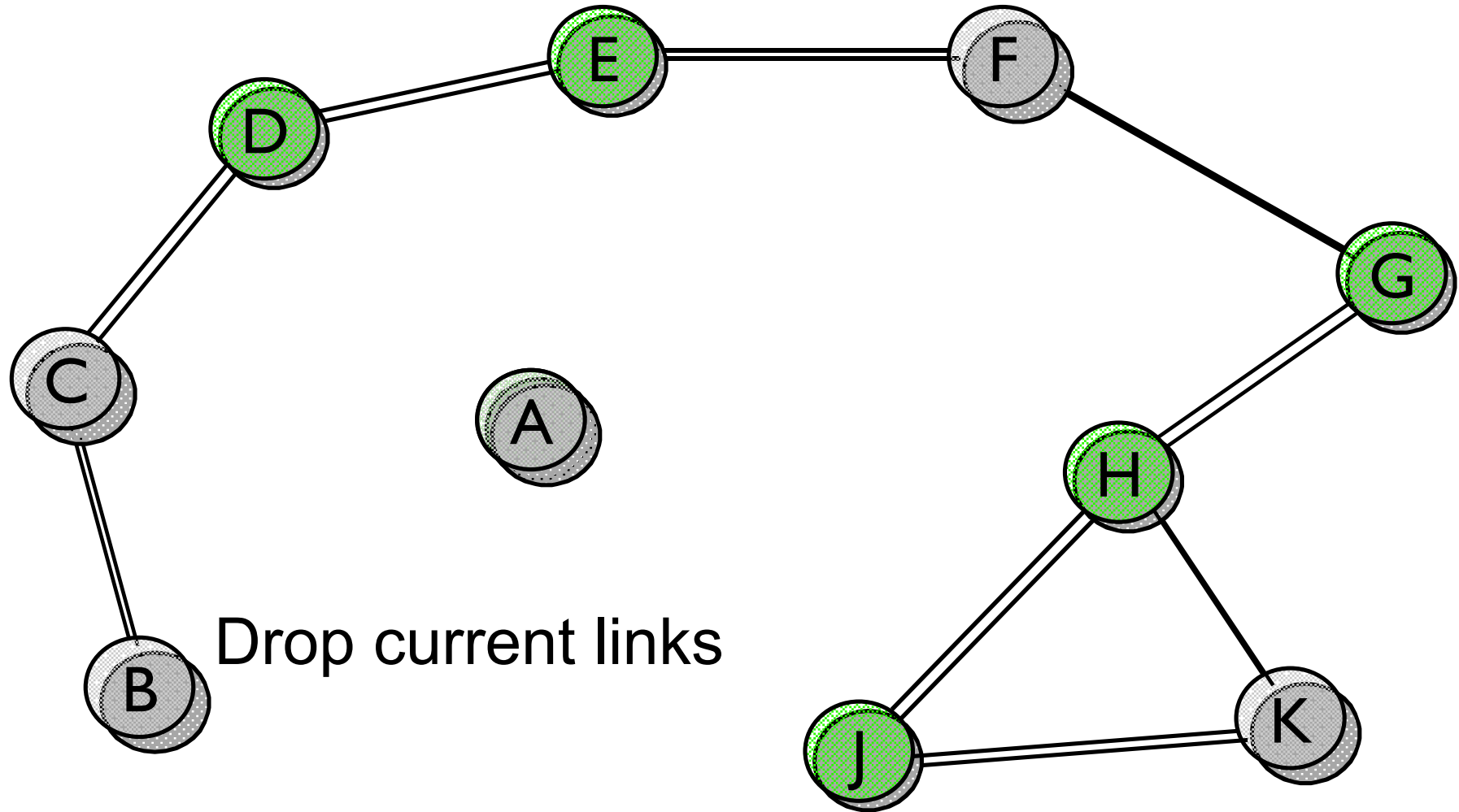




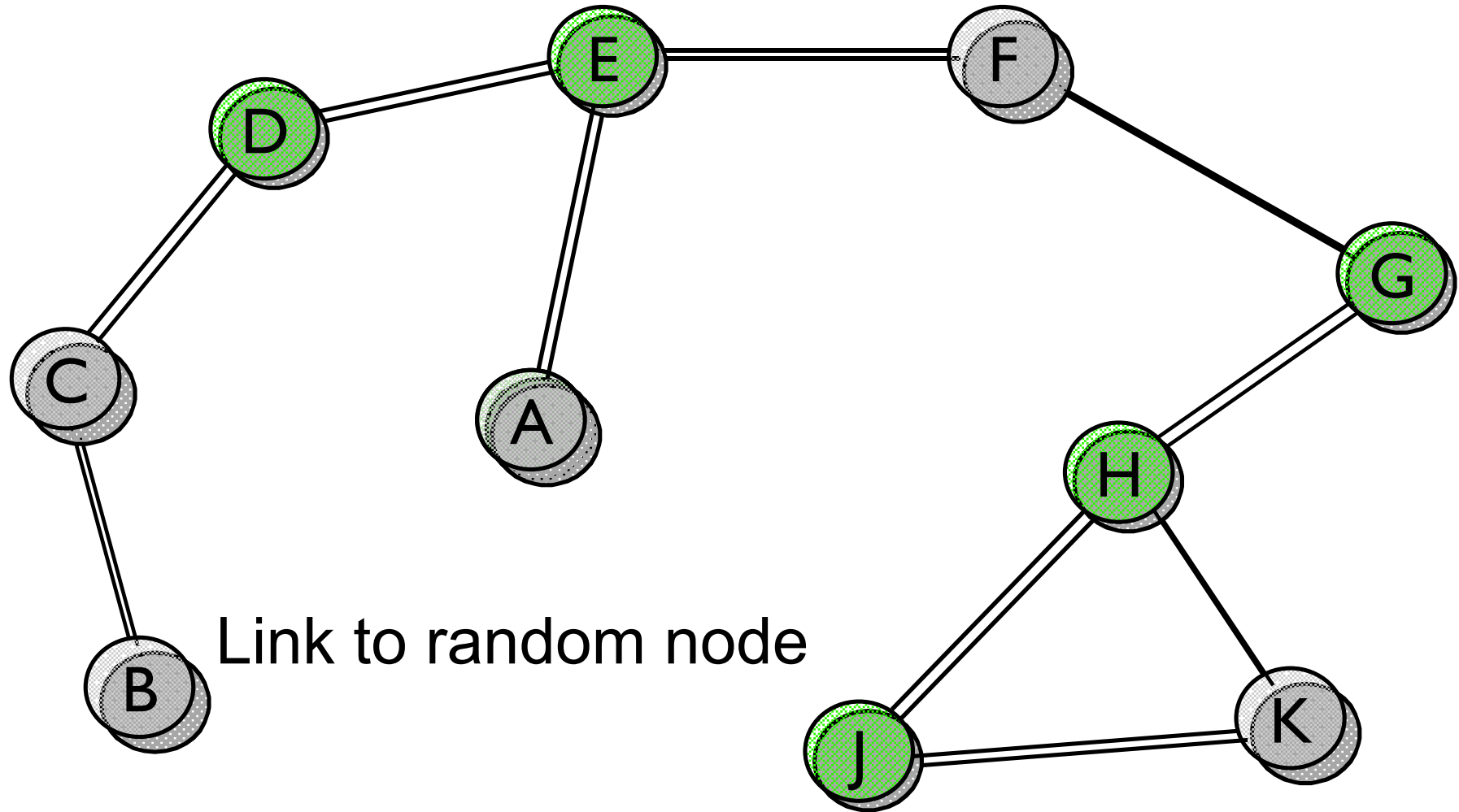








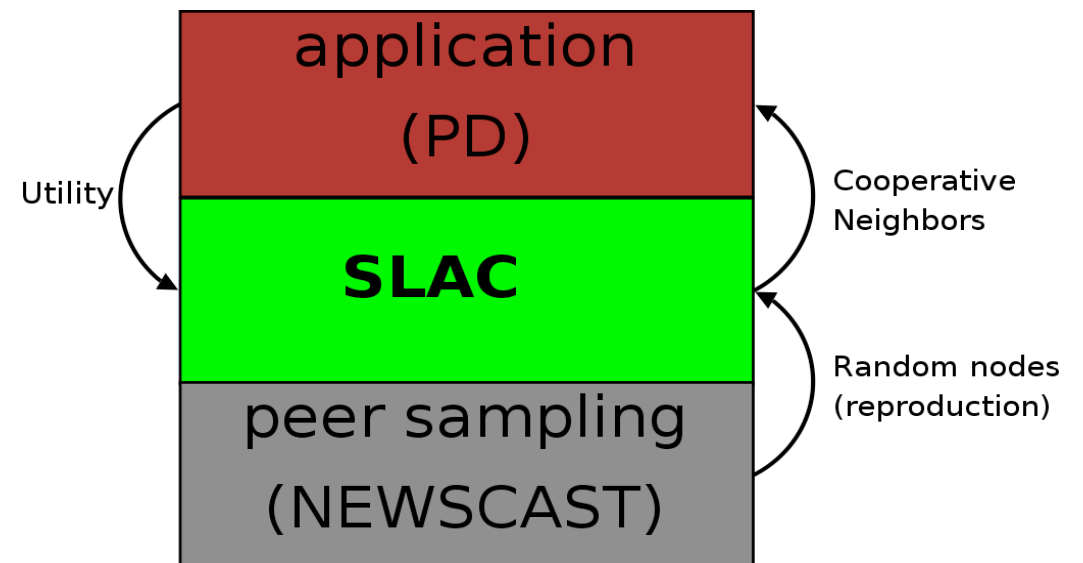


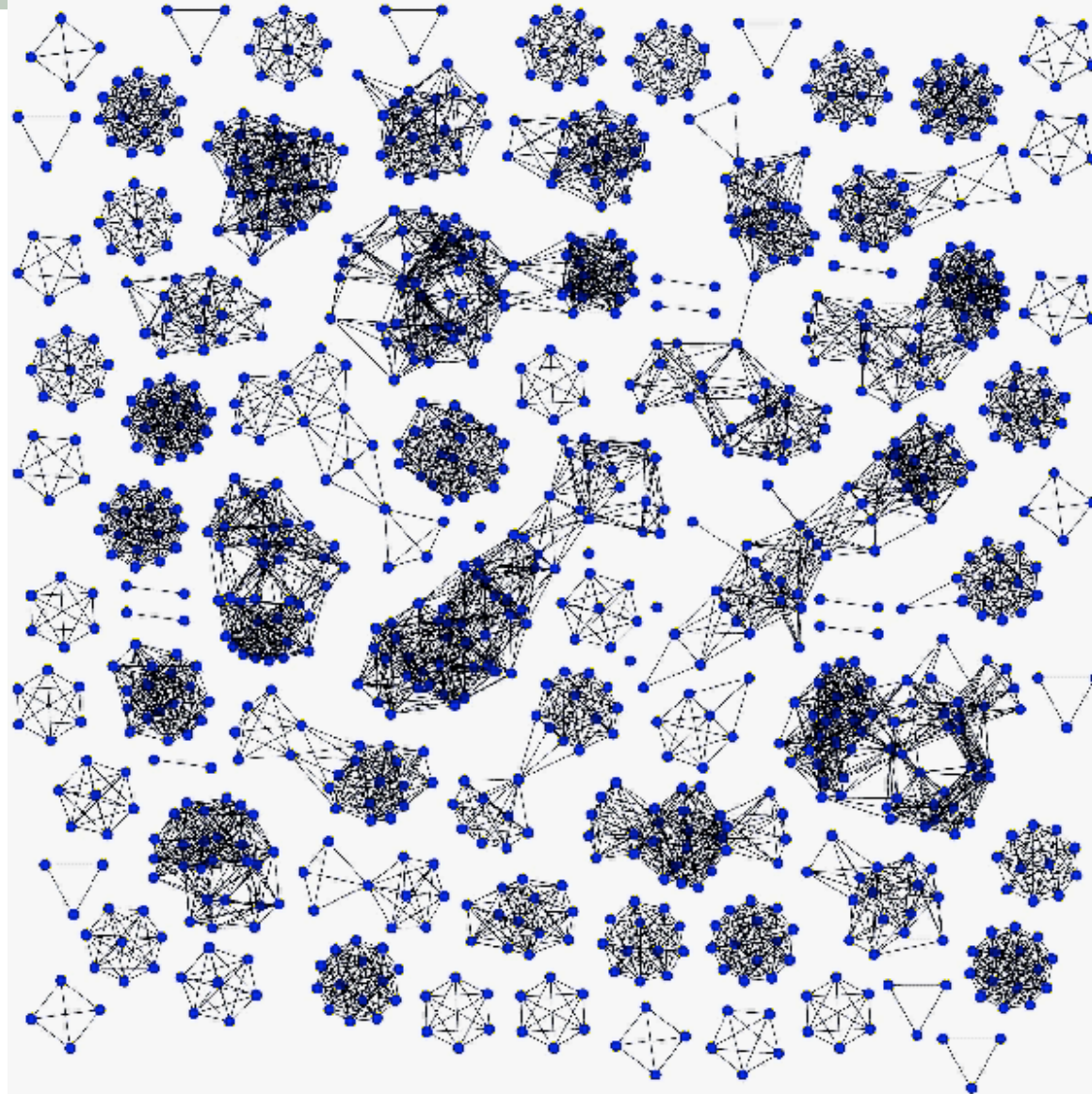


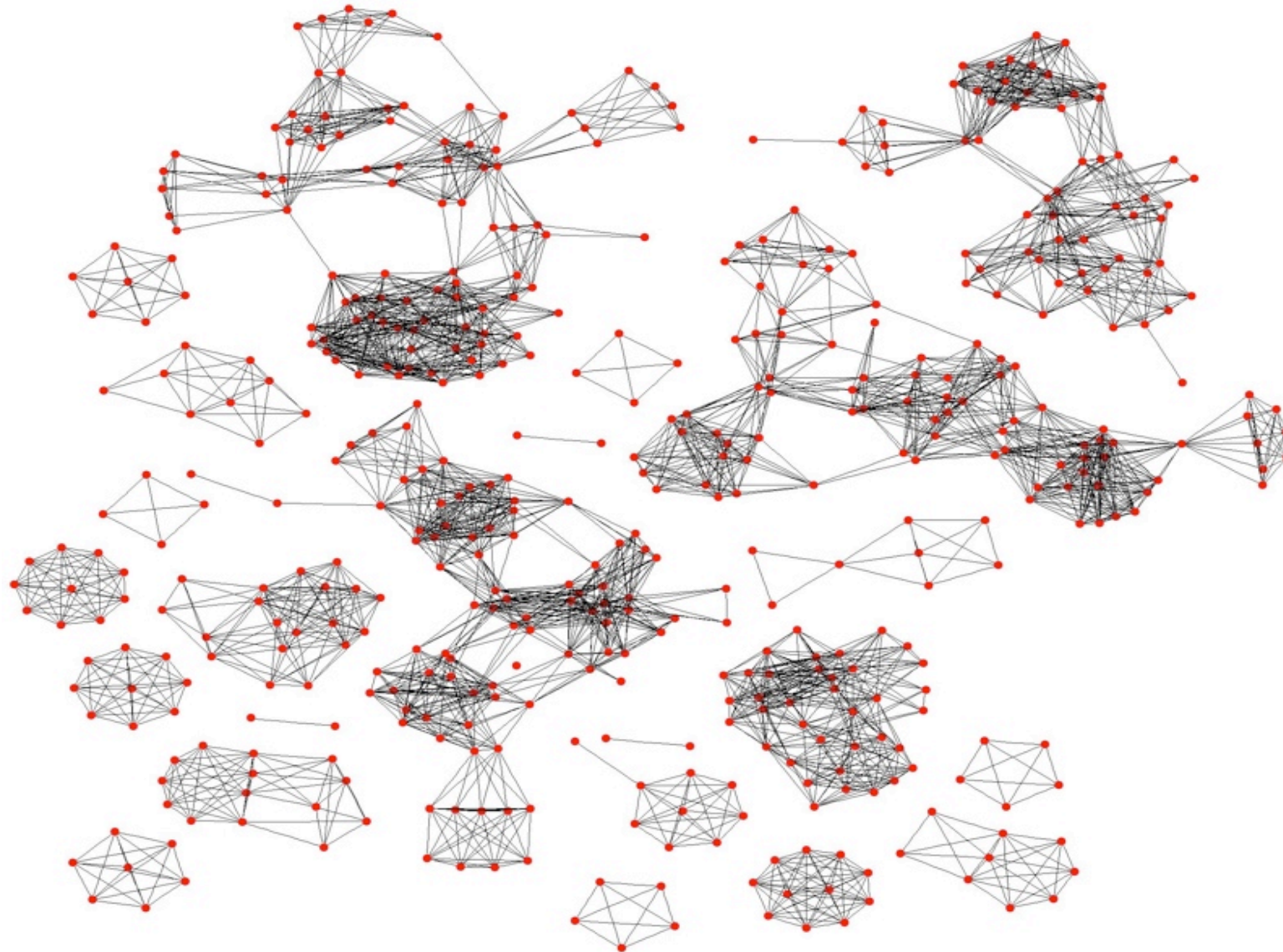


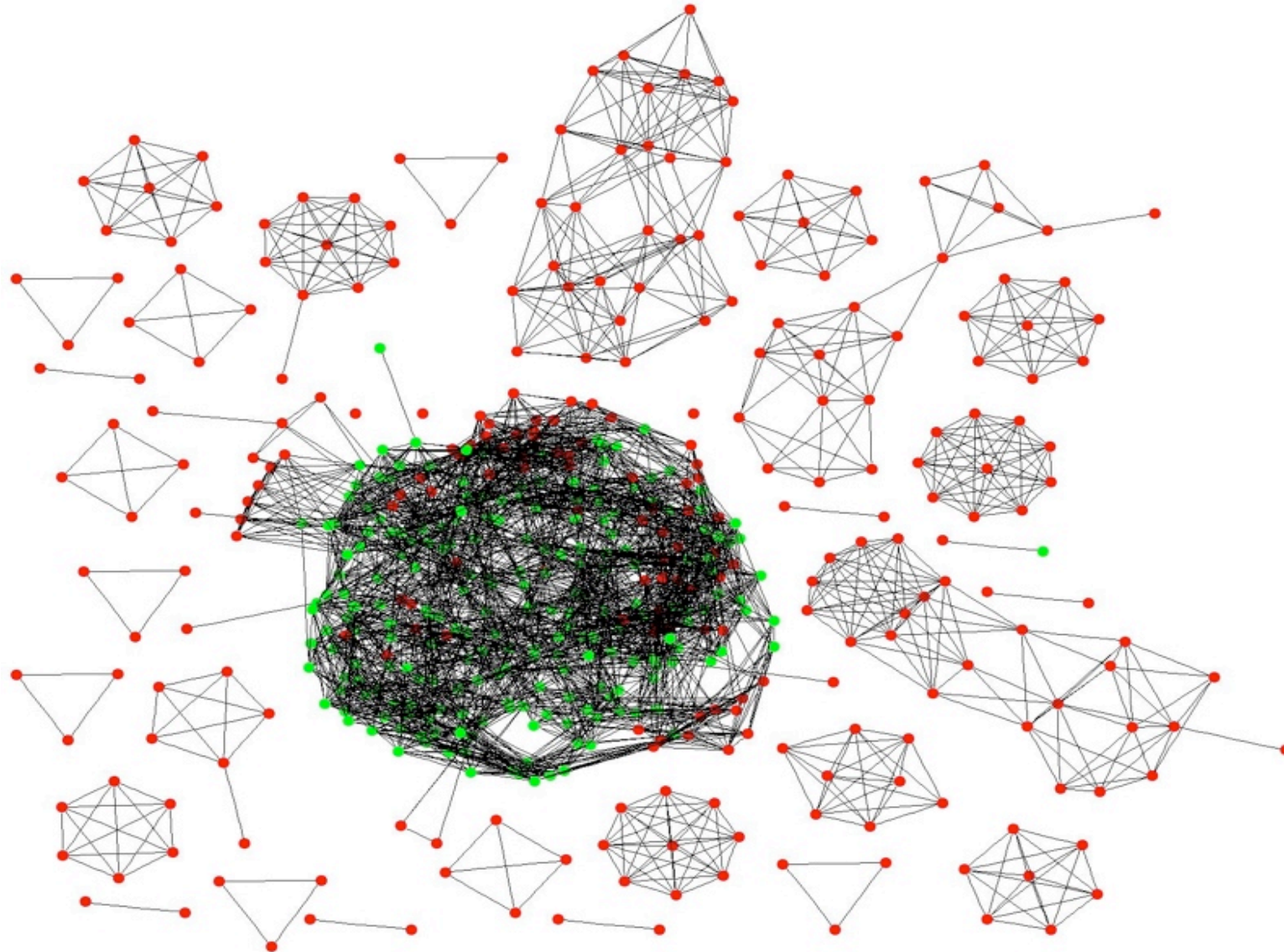
- We tested SLAC with Prisoner's Dilemma (PD)
  - Captures the conflict between “individual rationality” and “common good”
  - Defection (*D*) leads to higher *individual* utility
  - Cooperation (*C*) leads to higher *global* utility
  - $DC > CC > DD > CD$
- Prisoner's Dilemma in SLAC
  - Nodes play PD with neighbors chosen randomly in the interaction network
  - Only pure strategies (always *C* or always *D*)
  - Strategy mutation: flip current strategy
  - Utility: average payoff achieved

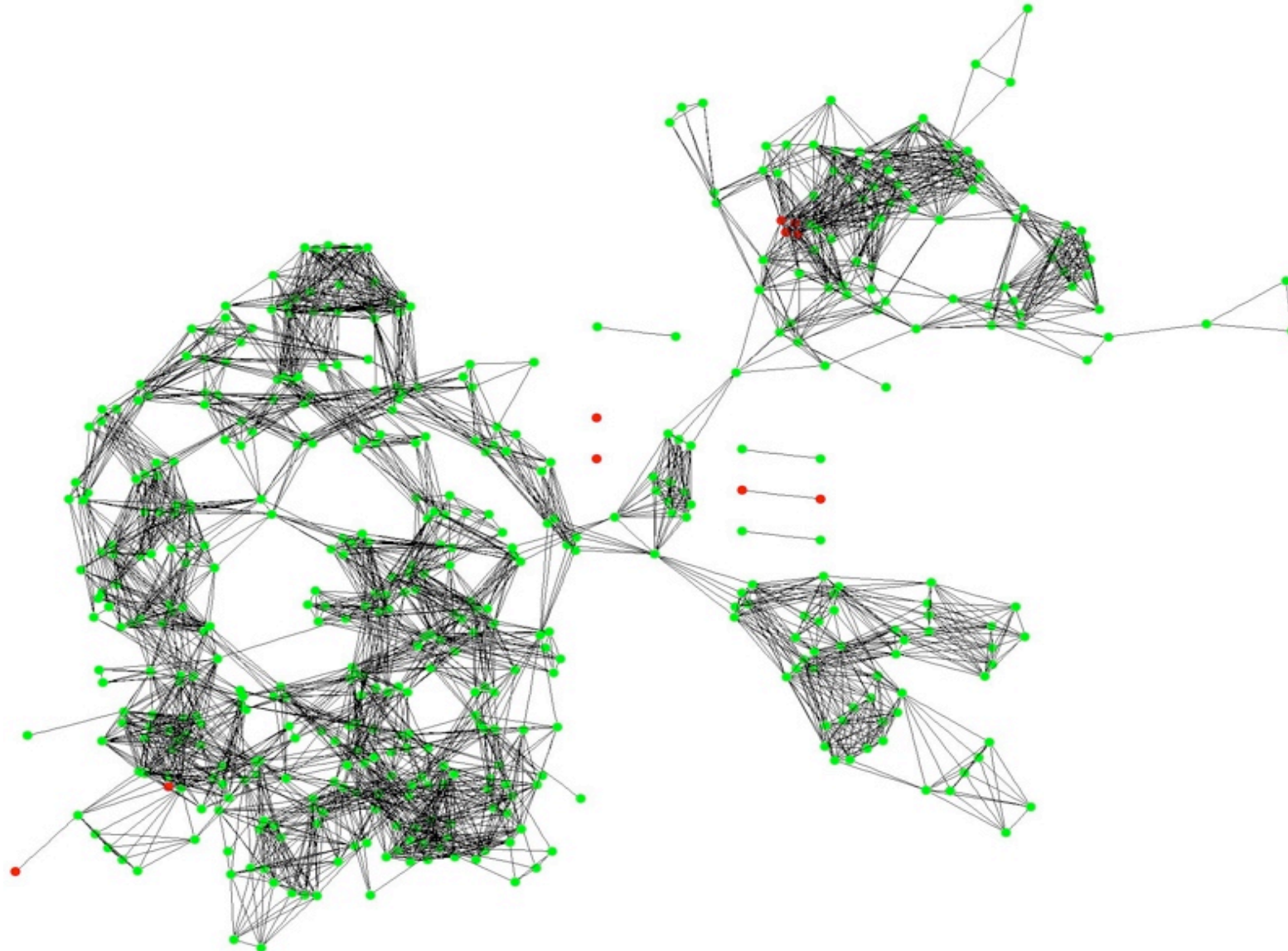
- 3 layers architecture
- Random sampling
  - Newscast
- Cooperation and topology
  - Slac
- Application task
  - PD

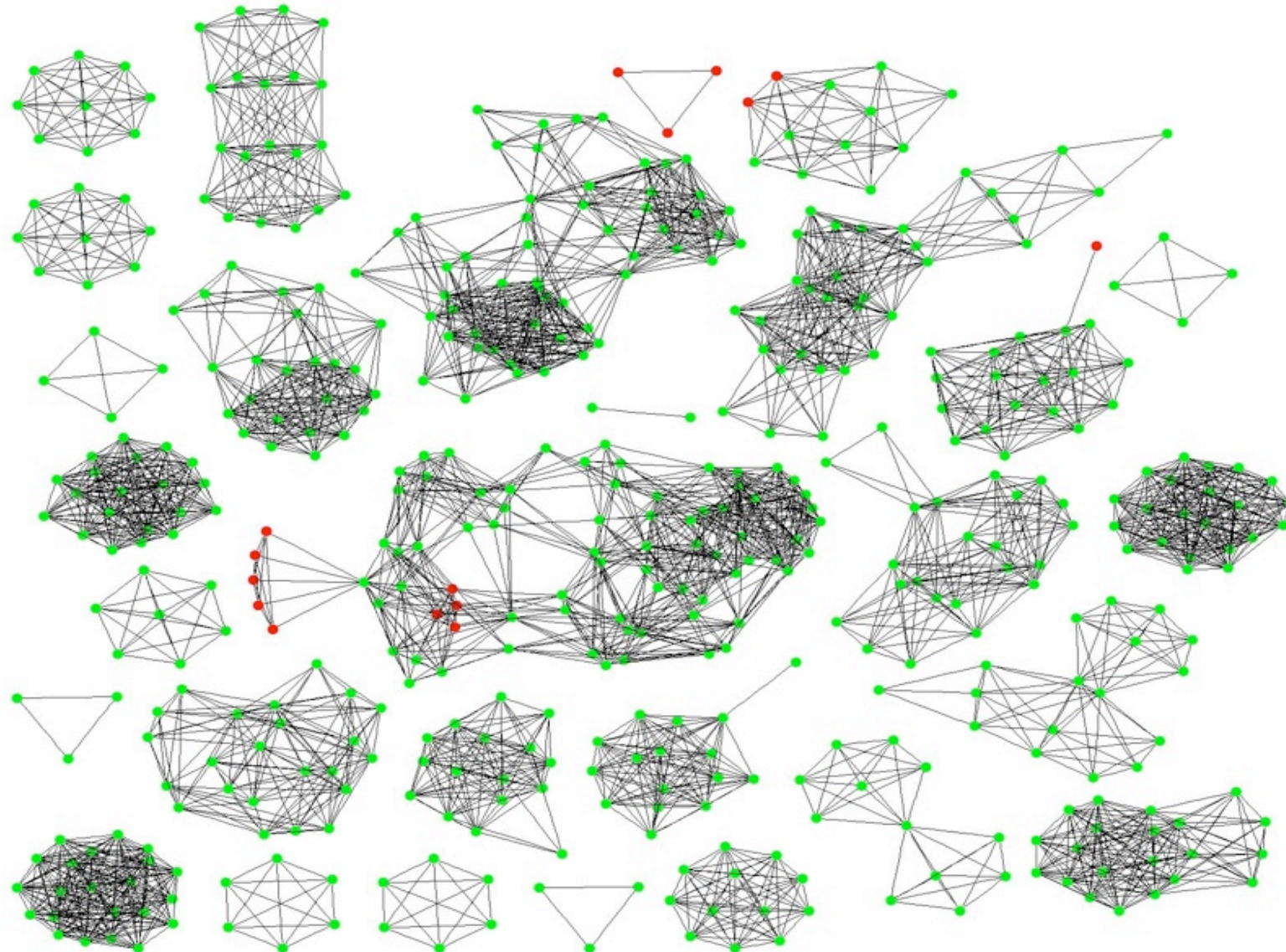




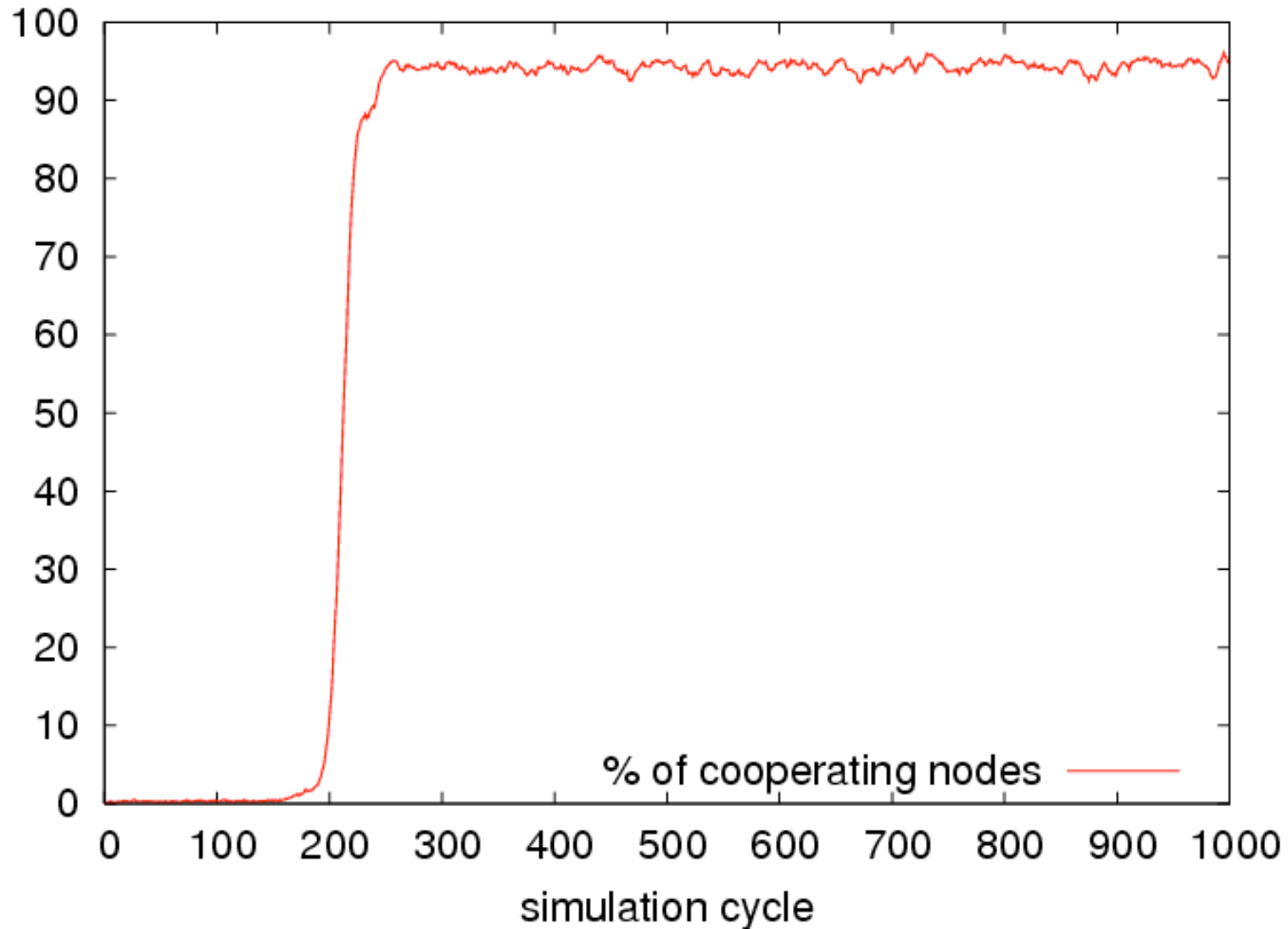










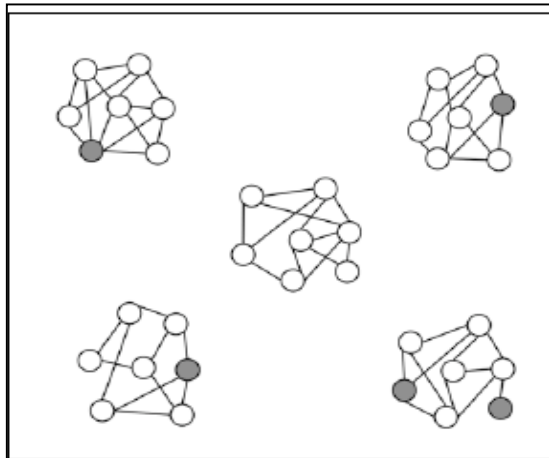




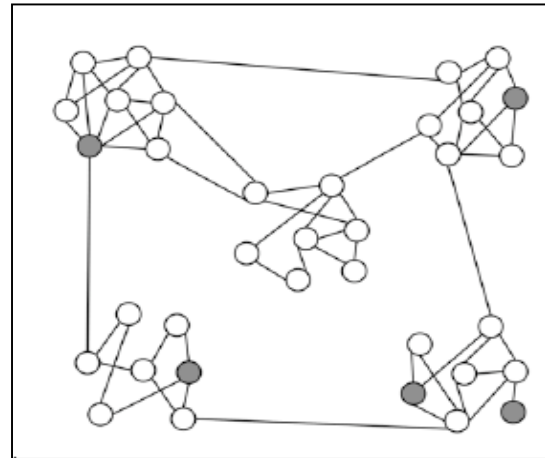
- SLAC produces very high levels of cooperation
- Nodes “move” throughout the network to find better neighborhoods
- This results in an evolution of the (interaction) network
- Group-like selection between clusters
  - Clusters of cooperating nodes grow and persist
  - Defecting nodes tend to become isolated

- SLAC rewiring mechanism lead to high level of network partitioning
- SLACER: When isolating nodes not all the links are drop. Each link is dropped with given probability  $W$
- Parameter  $W$  represents a tradeoff between network randomness and cooperation level
  - $W=1$ : high cooperation, high partitioning
  - $W=0.9$ : high cooperation, small world like topology
  - Low  $W$ : low cooperation, random like topology

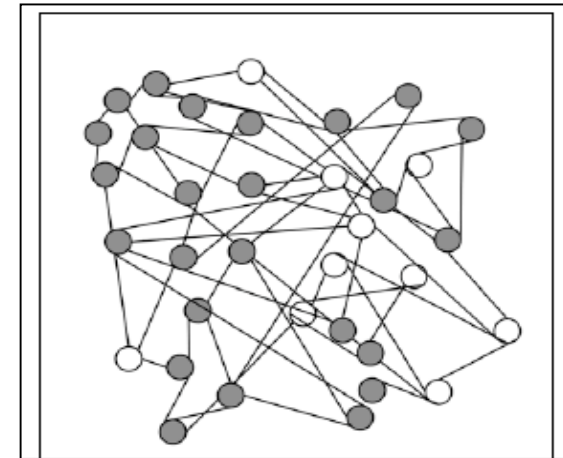
$W=1$



$W=0.9$



$W=0.3$

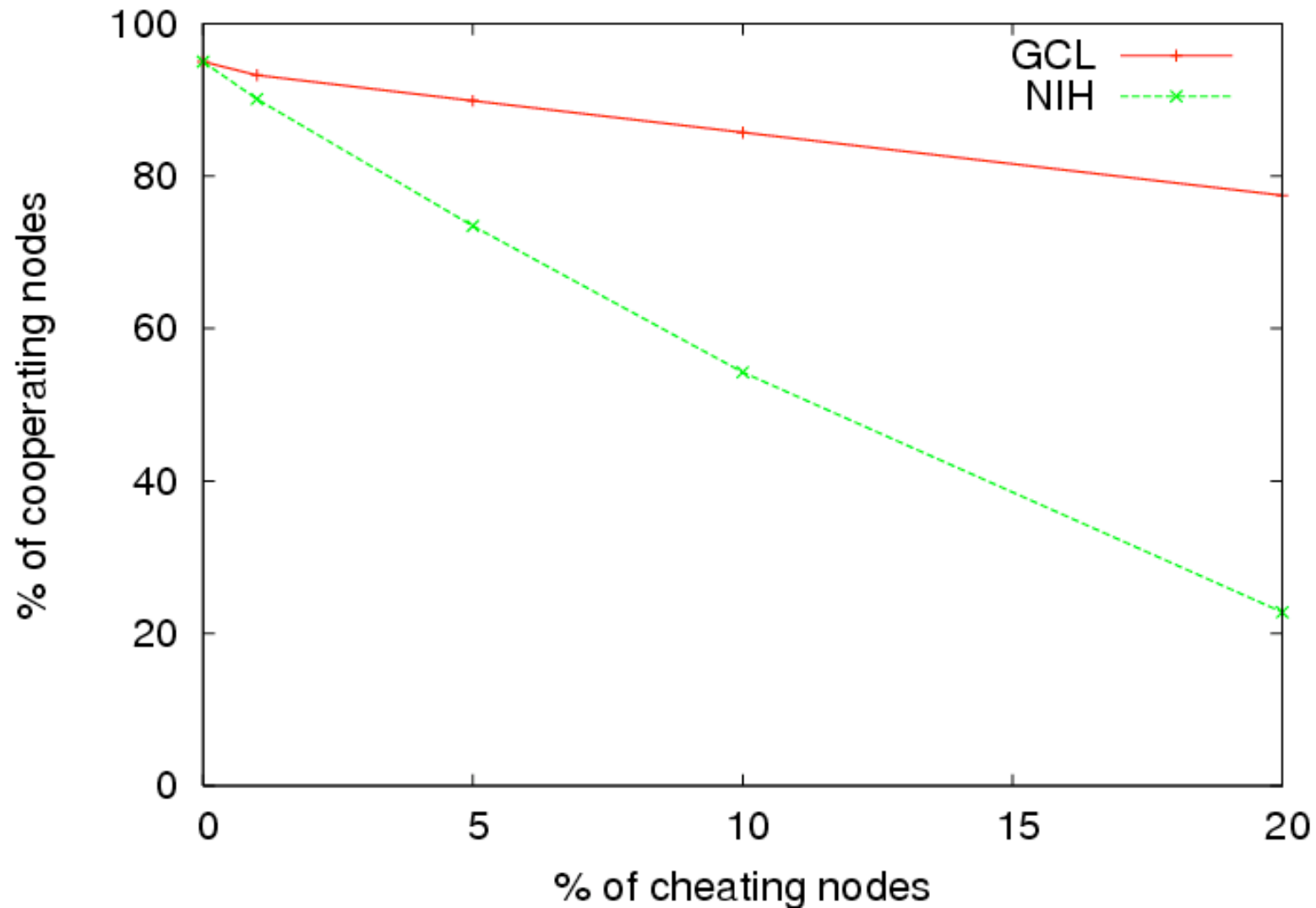


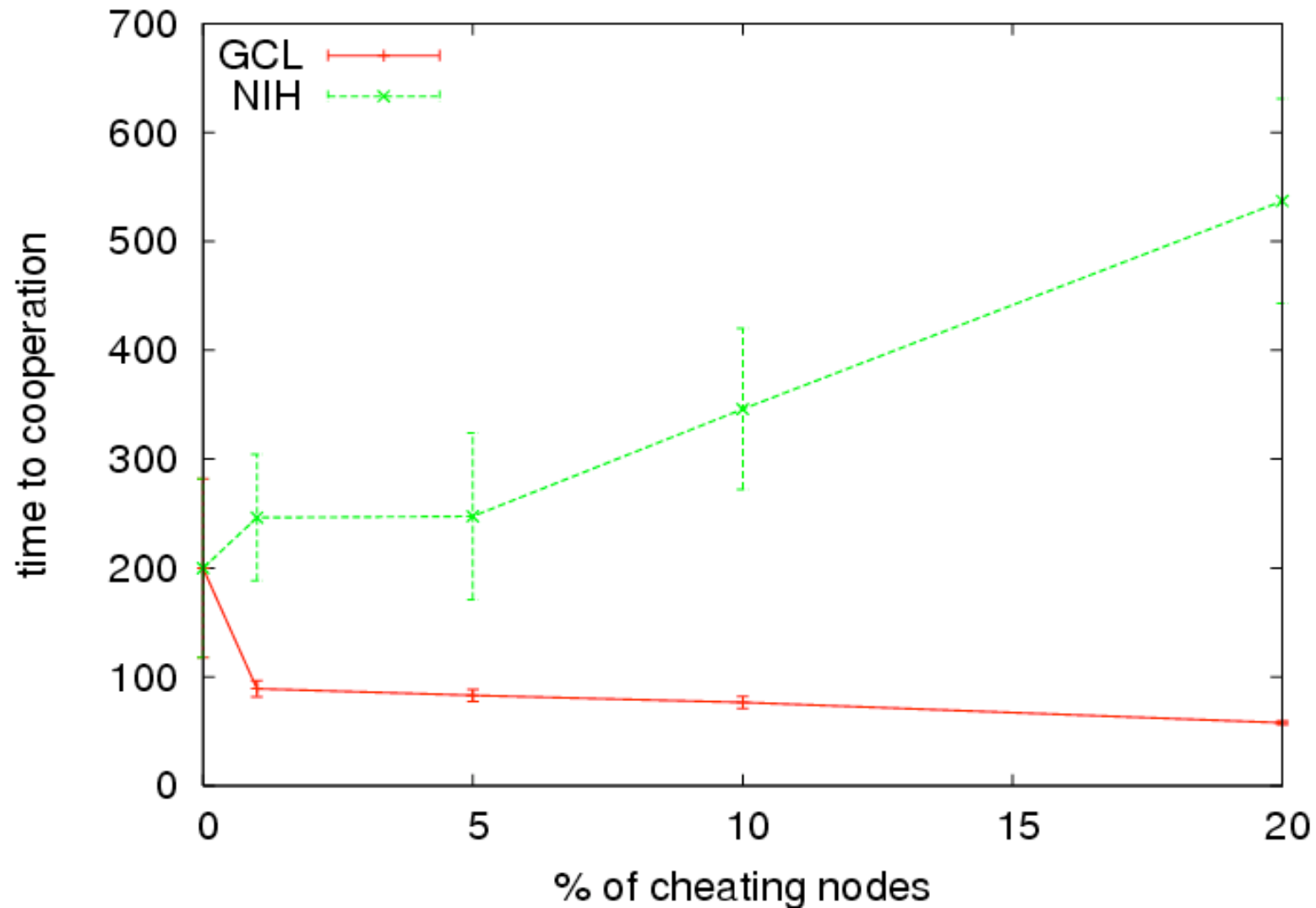


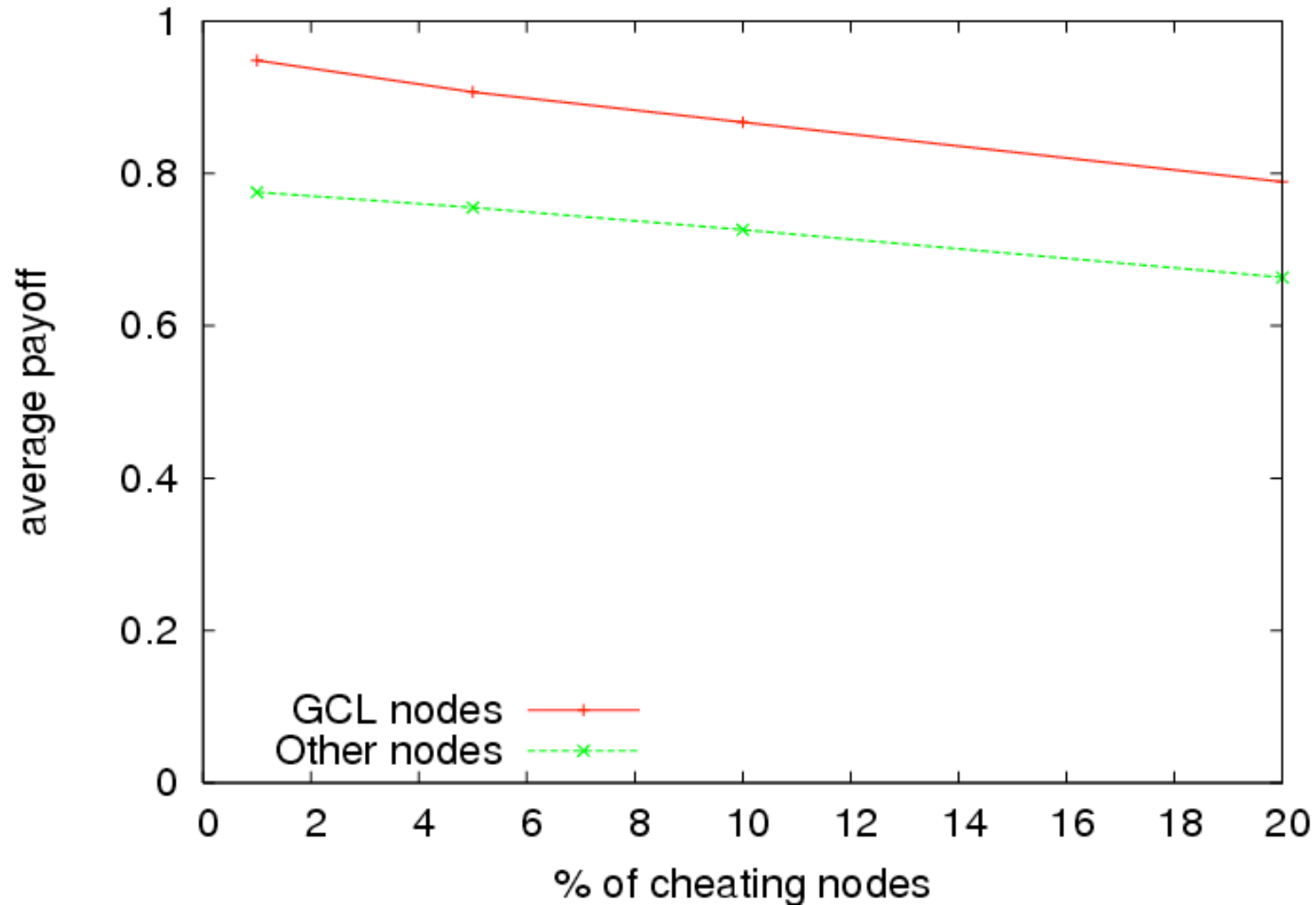
- SLACER requires nodes to *honestly* report their states (strategy, utility, links)
- What happens if some of the nodes lie in an effort to cheat the system? Will this destroy cooperation?
- We consider two types of cheating:
  - Greedy Cheating Liars (GCL) that want to exploit the system in order to increase their utilities
  - Nihilists (NIH) that want to destroy cooperation in the system and don't care about their own utilities



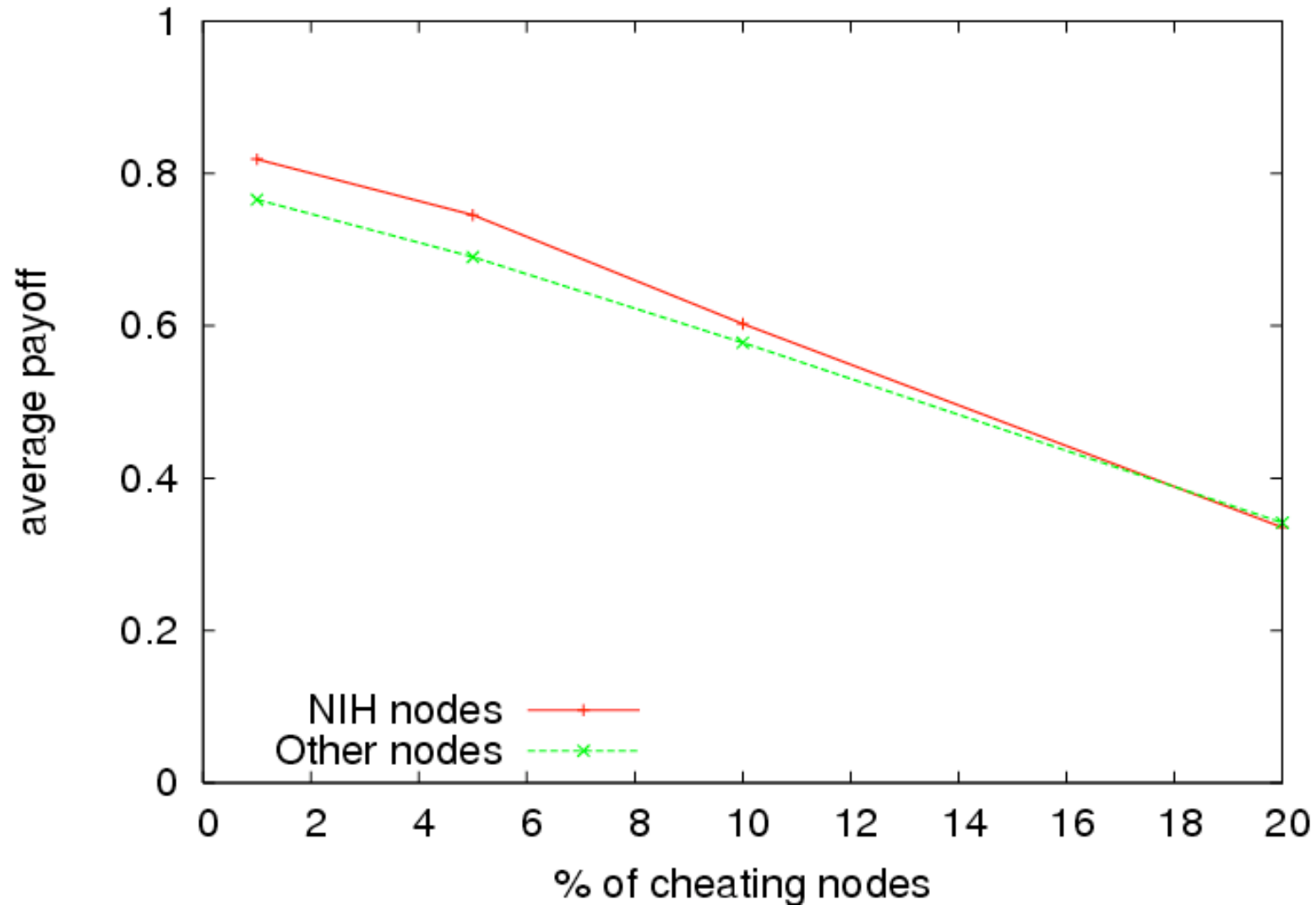
- GCL nodes:
  - Always report high utility (lying)
  - Always report strategy *C* (lying)
  - Always play strategy *D*
  - Move away when they are not completely surrounded by cooperators (i.e. utility < *T*)
  - In this manner, GCL nodes try to surround themselves with cooperating nodes ("suckers") to exploit
- NIH nodes:
  - Always report high utility (lying)
  - Always report strategy *D*
  - Always play strategy *D*
  - Move away when they are surrounded by only defectors (i.e. utility = *P*)
  - In this manner, NIH nodes try to turn cooperating nodes to defectors then move away











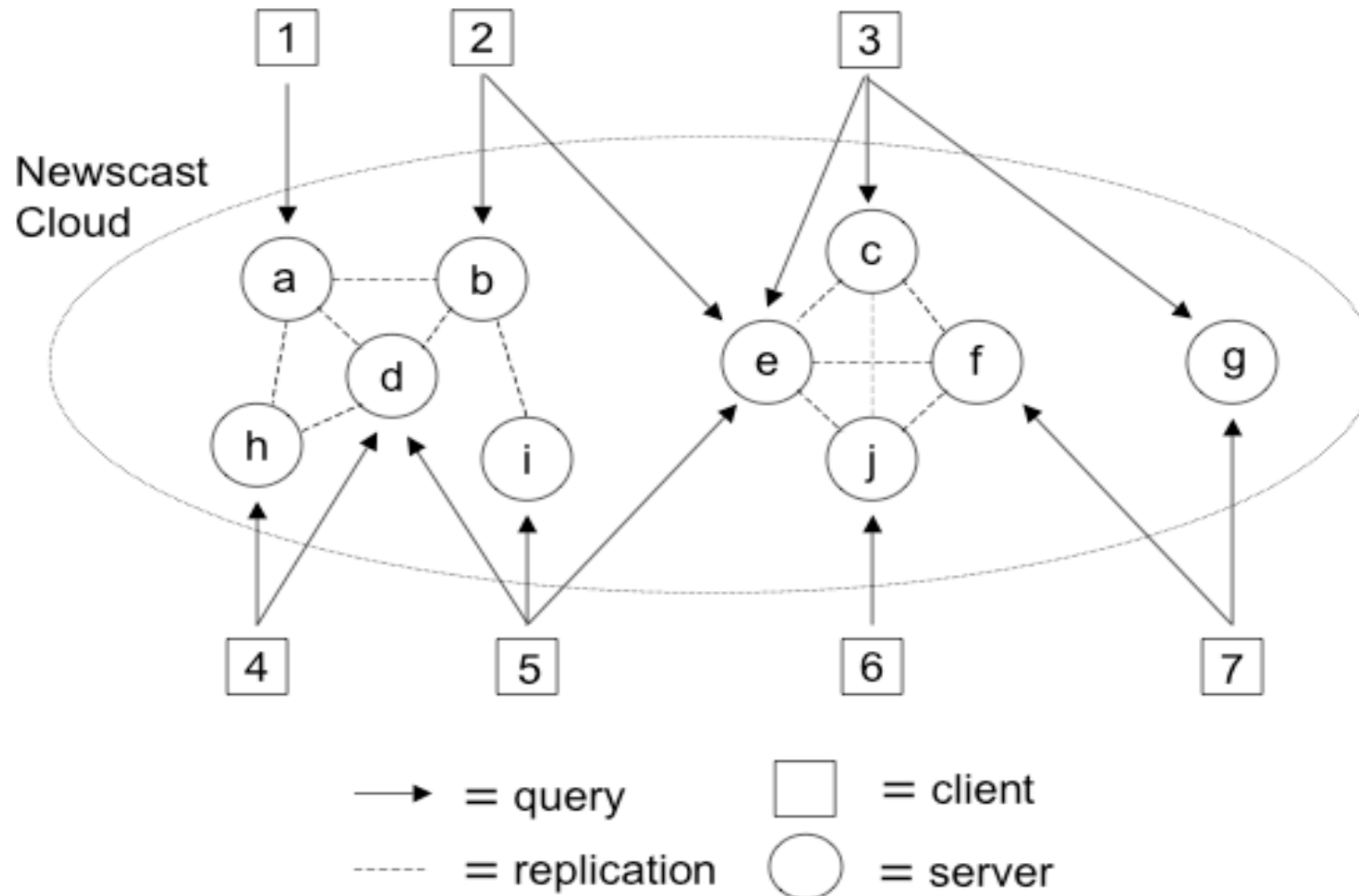


- SLACER can tolerate a high percentage of GCL nodes
- GCL nodes degrade global performance gracefully
- Yet, NIH nodes degrade performance significantly
- Interestingly, increasing percentage of GCL nodes *decreases* the time to cooperation
- GCLs might be seen as “taxing” the general population in return for more rapid cooperation
- Perhaps protocols can be designed to function despite cheating nodes rather than strive to detect and block them

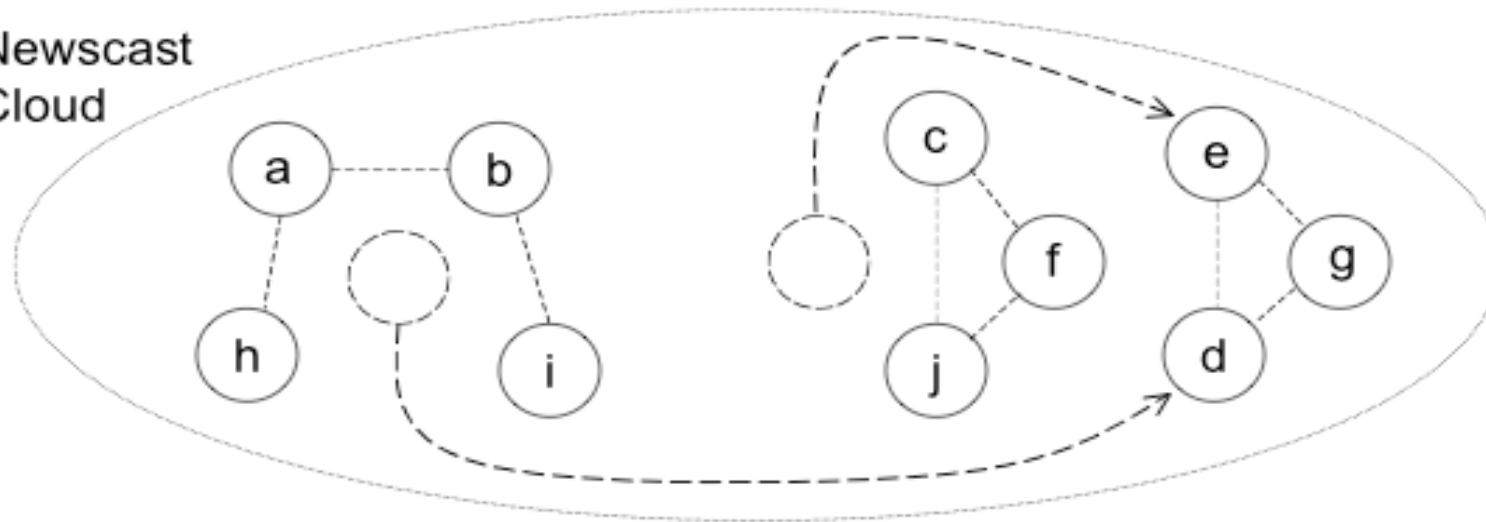
- Copying (and mutation) applied to normal behavior
- Cheating behavior limited to a (fixed) percentage of nodes and does not spread
- “Normal behavior” (including possible free-riding) akin to running good clients in a P2P system (like BitTorrent)
- “Cheating behavior” akin to running hacked versions of the P2P client
- Typically, these hacked versions remain limited to a small group “in the know” and are not made widely available to others

### CacheWorld – Cooperative Content Replication

- Cooperative Content Replication
- Assuming protocols for
  - Replicating content between nodes
  - Redirecting queries (requests for content) between nodes
  - Peer sampling over a population of nodes
- Simple protocol for cooperatively coordinating these services to maximise system capacity
- With incentives for nodes to cooperate
- Dynamically adjusting to varying load and node entry and exit



Newscast  
Cloud



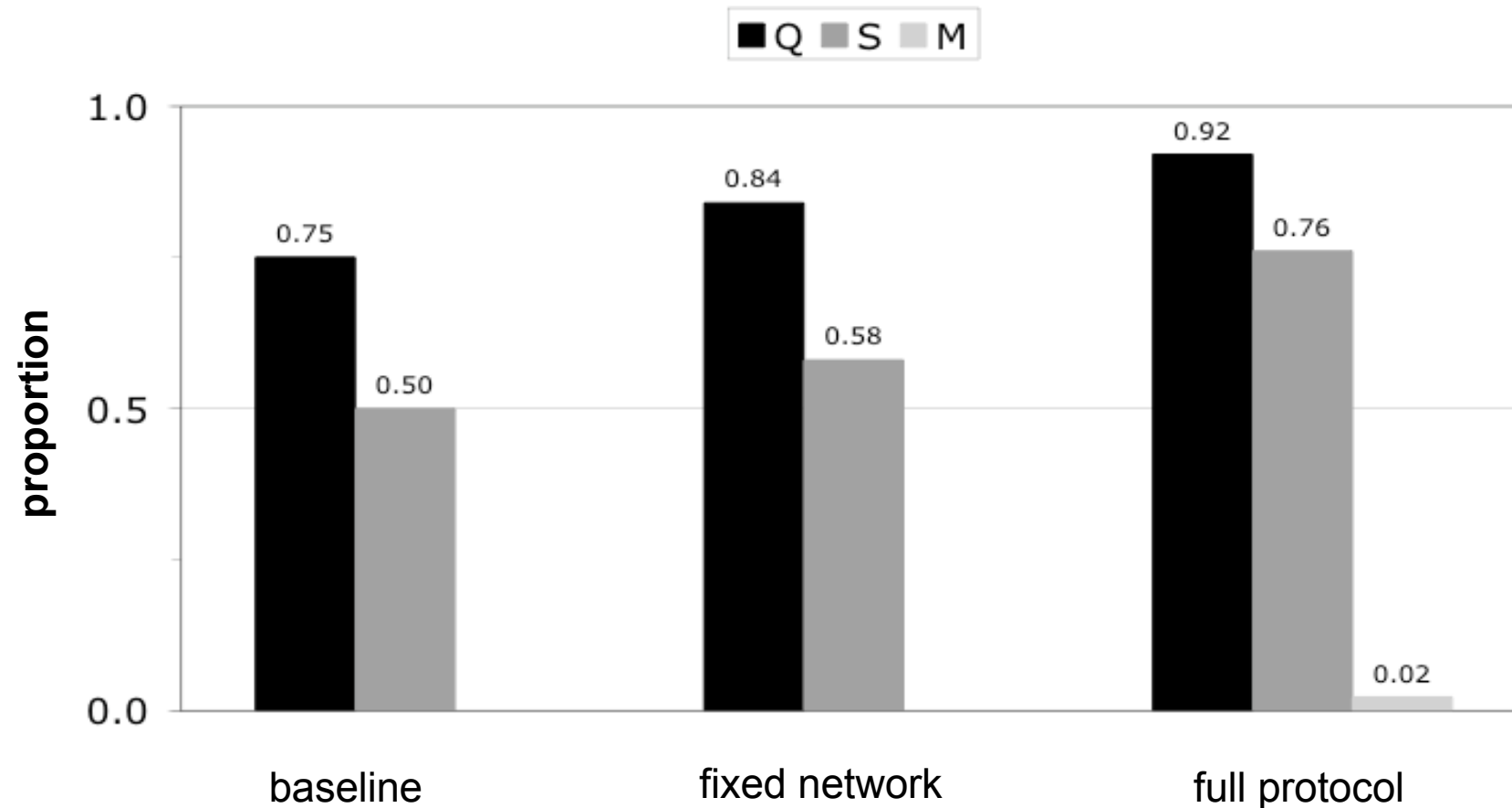
---> = movement

----- = replication    ○ = server

### CacheWorld outline protocol

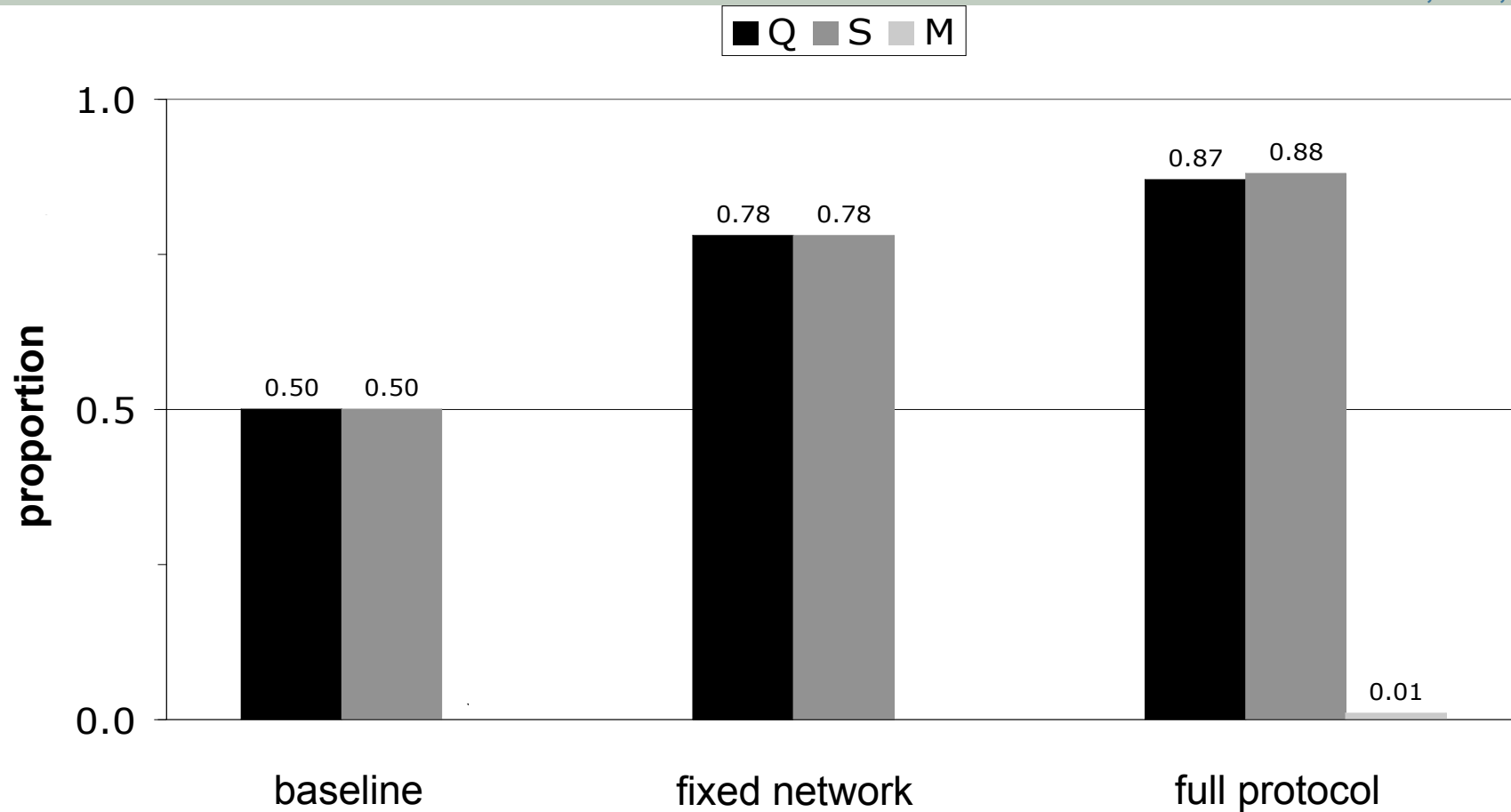
Passive thread	Active thread
<pre> on receiving a query q, node i:   if not overloaded     service q directly   else if neighbors &gt; 0 and q is not already a   redirected query     j ← selectRandomNeighbor()     redirect q to j   end if </pre>	<pre> periodically each node i:   if not satisfied     drop all neighbor links     if Ci &lt; directly received queries       j ← selectRandomPeer();       link to j's neighbors and j     end if   end if </pre>

- Capacity (C) and load for each node specify different scenarios
- maximum number of neighbours (k) currently defined exogenously (typically low,  $k < 10$ )
- nodes are satisfied if all queries submitted to them are answered (over a given period - the load cycle)
- each node associated with a single unique content item that is replicated between linked neighbours



Q = queries answered, S = satisfied nodes, M = movement  
(very simple scenario, half nodes underloaded, half overloaded,  $k = 1$ )





Q = queries answered, S = satisfied nodes, M = movement  
(less simple scenario, half nodes underloaded, half overloaded,  $k = 4$ )

### CacheWorld Summary

- Very initial results, with simple load / capacity scenarios
  - Nodes replicate and serve a single “content” item
  - Not modelling cost of replication process
  - Fixed loads and capacities
- Hence more realistic scenarios needed and comparison with existing protocols (on-going work with RAL)
- Still not tested with malicious nodes, pure freeriders and churn. But reasonably confident will degrade gracefully
- Current results not has good has hoped, however
- Experimenting with
  - conditional acceptance of new links (e.g. only if node is under or overloaded)
  - simple “loyalty” approach (where preference is given to older links) could lead to much better results but this is on-going. Interesting this could link to a lot of work from “evolutionary economics” (Kirman’s Marseille Fish Market studies / models)

### ASB Idea

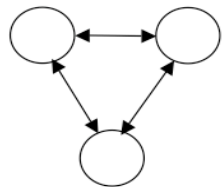
- Current problem of open P2P protocol deployment
- Requires massive user intervention (client discovery, download, evaluation)
- Out-protocol communication concerning client discovery
- Idea: Automatic Social Bootstrapping (ASB)
- A meta P2P protocol
- Dynamic (run time) deployment of P2P protocols
- Automatic selection of protocols that are socially beneficial (increase the collective utility of nodes)
- Given some application supplied utility
- For a given API

Periodically each node:

```

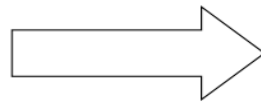
i ← this node
j ← SelectRandomNode()           // select a random node j
if Uj » Ui then                 // utility of j higher?
    PP.protocoli ← PP.protocolj // copy protocol of j to i add j
    PP.viewi ← PP.viewj ∪ j    // copy view of j to i add j
    
```

live minimal  
overlay seed



(a) create  
example

inject seed

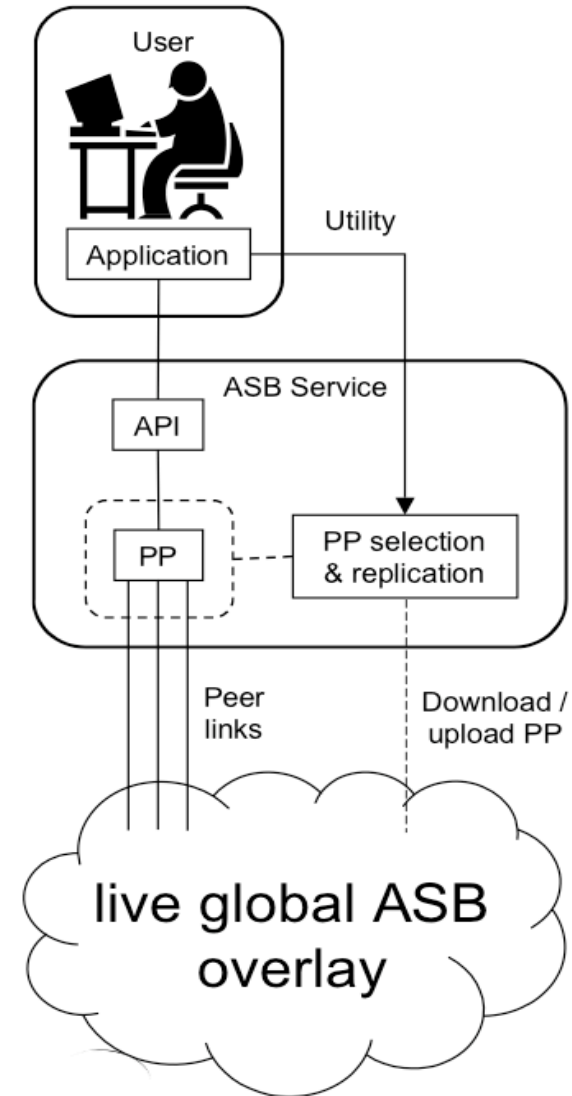


(b) introduce

socially beneficial  
examples selected



(c) Automatic select  
and deploy





- Begun to develop a method for adapting models toward implementation
- Initial work on broadcast and cooperative content replication looks promising
- Publications:
  - Hales, D. and Arteconi, S. (2006) SLACER: A Self-Organizing Protocol for Coordination in P2P Networks. IEEE Intelligent Systems 21(2):29-35
  - Hales, D. and Babaoglu, O. (2006) Towards Automatic Social Bootstrapping of Peer-to-Peer Protocols. ACM SIGOPS Operating Systems Review 40(3)
  - Arteconi, S., Hales, D., Babaoglu, O. (submitted) Greedy Cheating Liars and the Fools Who Believe Them. CMOT Journal
  - Arteconi, S, Hales, D., Babaoglu, O. (2006) Broadcasting at the Critical Threshold. DELIS-TR-0373. To be submitted to SASO 2007
- Future: More realistic scenarios, experimentation with malicious nodes, possible implementation, further apps. from D.5.5.1 (D5.3.2, month 48)

### Goals (start month 13)

#### *General*

Explore processes of general network evolution in both natural and artificial systems - determine and harness both the form and function of multi-level evolution for engineering

#### *Specific*

Develop dynamical analysis techniques for evolving networks. Identify natural and artificial networks that demonstrate selection / topology evolution at different levels. Relate network “forms” to desirable network “functions”

#### **Partners**

**UPF, UniBO, Telenor**

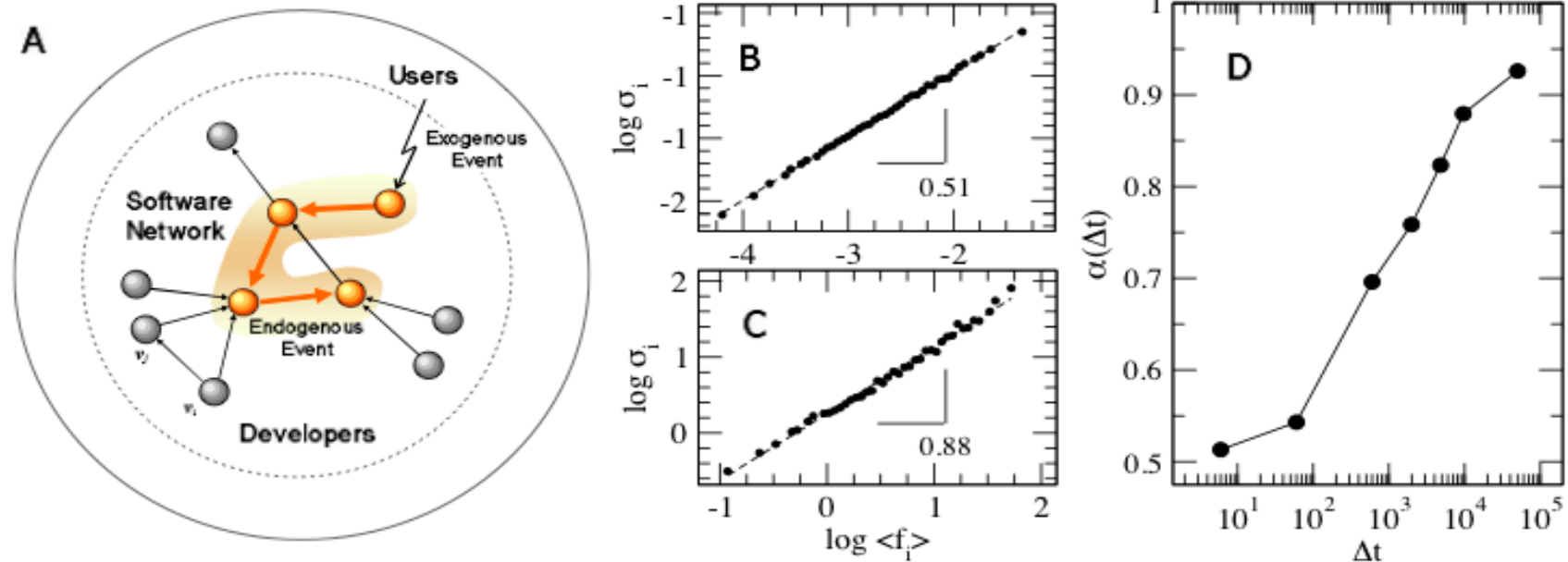
### Results (from D5.4.2)

- Understanding Multi-scale Evolution of Open Source Software
  - Analysis of CVS databases to aid understanding of software development process in OS systems
  - Evidence of endogenous and exogenous change at different time-scales
  - Method for determining files likely to change together
  - Might be useful when refactoring legacy software
- Relating models of emergent multi-level selection
  - Framework for comparison of “group selection” models
  - Previous SLACER and SkillWord models (from SP4/SP5)
  - Recent novel bio / socio group selection models
  - Possibility of generalised design pattern(s) with conditions of application

### Change in Open Source Projects

- Analysis of CVS files of Open Source projects
- Measuring patterns of file changes over different timescales
- Evidence that short-term changes (order of hours) follow an endogenous process similar to that found in circuits / physical internet
- Long-term changes (order of year) follow an exogenous (user driven) process similar to that found in human systems
- Appears to be two distinct kinds of change process that can be identified
- Same tools can be used to identify sets of files that change together - potentially the modules of the system



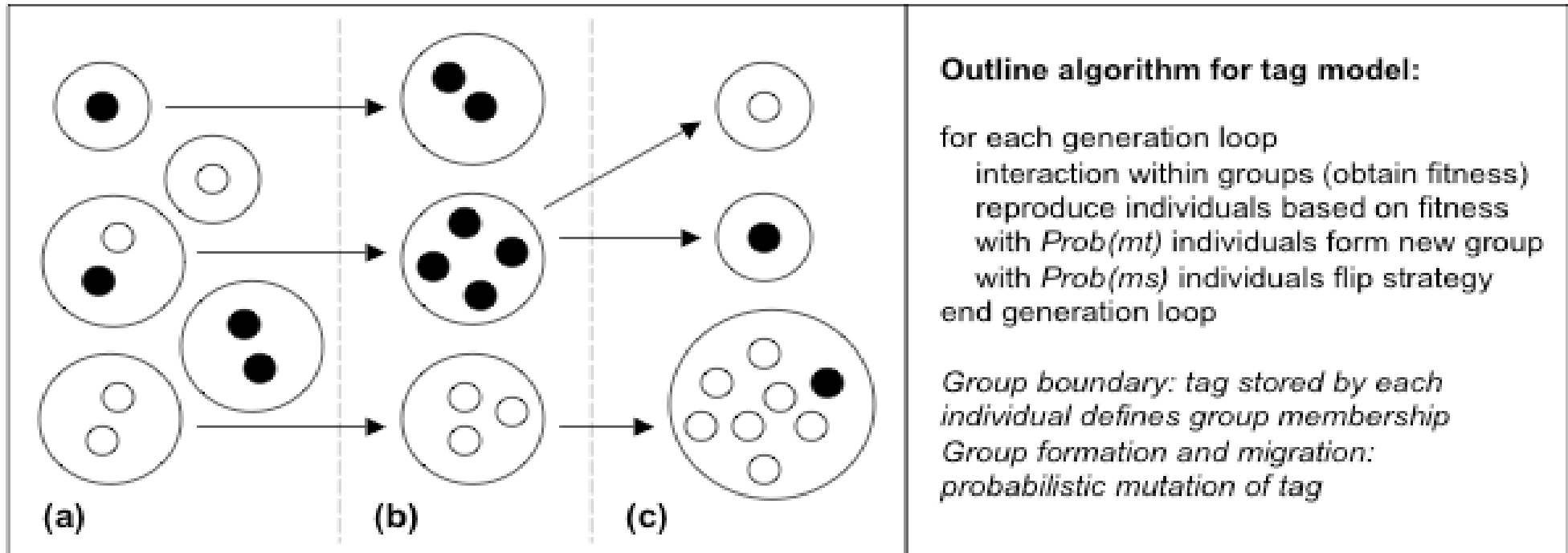


(A) Schematic representation of an OSS community. (B) Scaling of fluctuations with average change activity for the software project XFree86 at  $\Delta t = 6$  hours (top) and  $\Delta t = 9600$  hours (bottom). (D) Dependence of the observed  $\alpha$  exponent with the measurement window  $\Delta t$ .

### Group Selection Framework

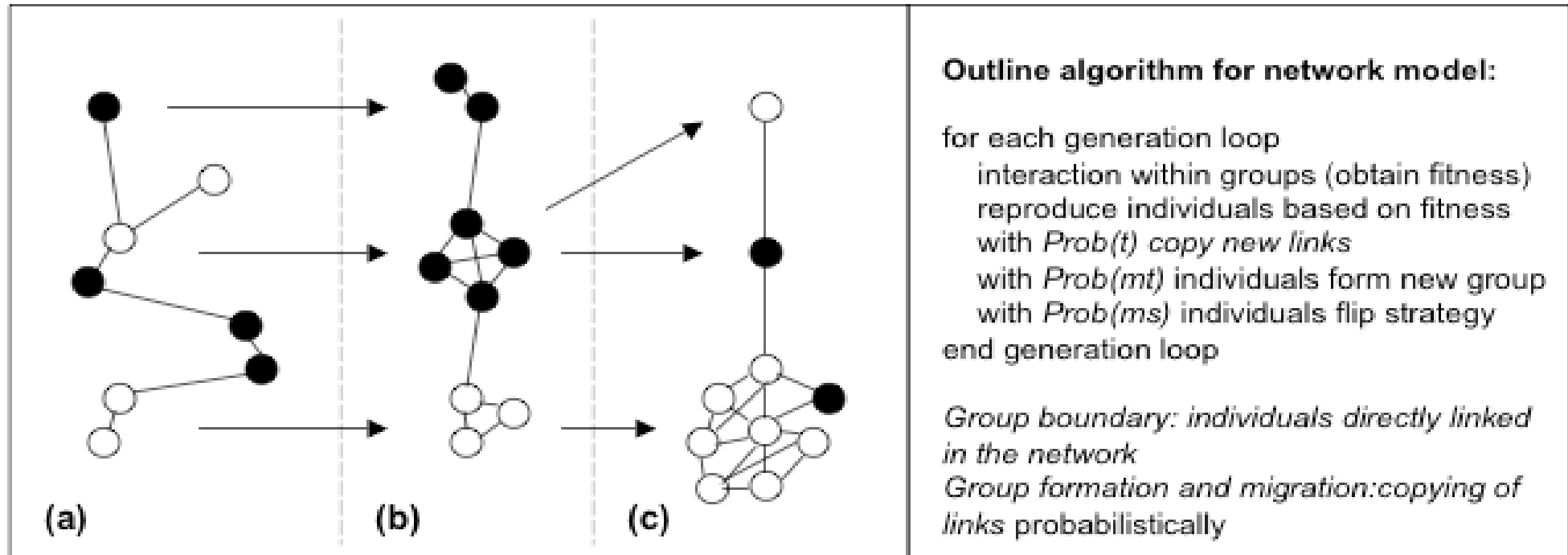
Previous models from SP5 and novel group selection models are comparable within the following framework:

- *Group boundary* - a mechanism which restricts interactions between agents such that the population is partitioned into groups
- *Group formation* - a process which forms groups dynamically in the population
- *Migration* - a process by which agents may move between different groups
- *Conditions* - cost / benefit ratio of individual interactions and other conditions which are sufficient for producing group-level selection



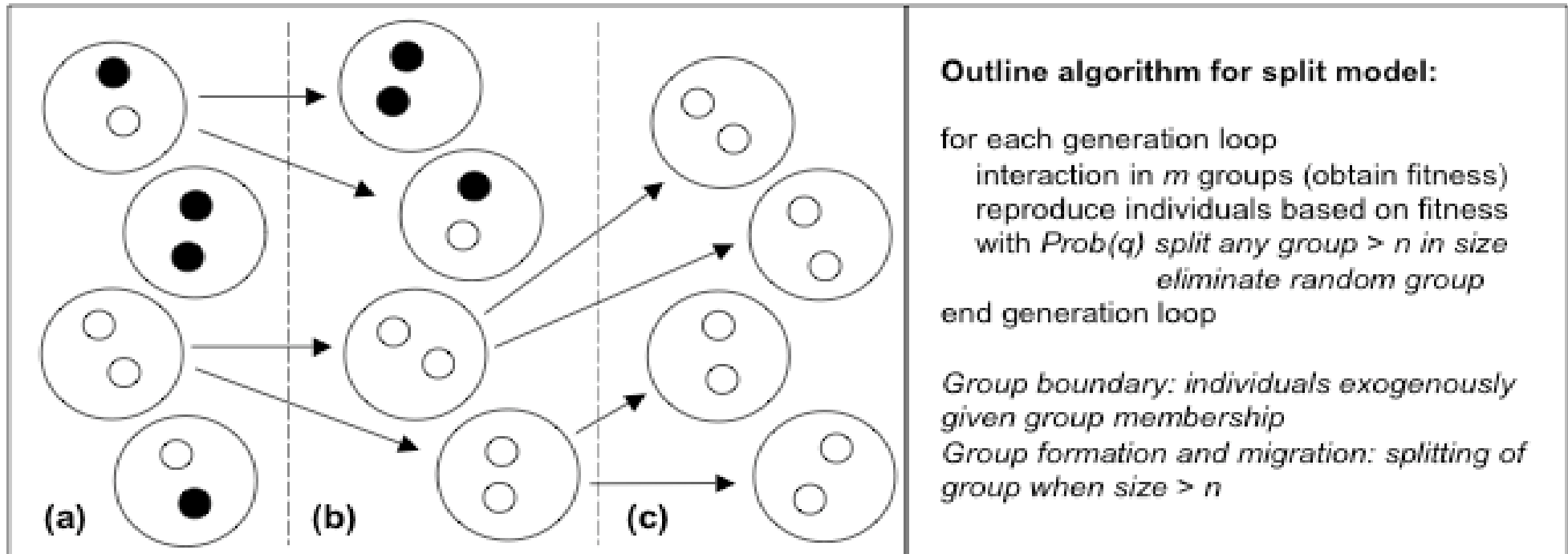
Schematic of the evolution of groups in the tag model. Three generations (a-c) are shown. White individuals are pro-social (altruistic), black are selfish. Individuals sharing the same tag are shown clustered and bounded by large circles. Arrows indicate group lineage. When  $b$  is the benefit a pro-social agent can confer on another and  $c$  is the cost to that agent then the condition for group selection of pro-social groups is:

$$b > c \text{ and } mt \gg ms$$



Schematic of the evolution of groups in the network-rewire model. Three generations (a-c) are shown. Altruism selected when:  $b > c$  and  $mt \gg ms$ . When  $t = 1$ , get disconnected components, when  $1 > t > 0.5$ , get small-world networks

Santos F. C., Pacheco J. M., Lenaerts T. (2006) Cooperation prevails when individuals adjust their social ties. *PLoS Comput Biol* 2(10)



Schematic of the evolution of in the group-splitting model. Three generations (a-c) are shown.

Altruism is selected if the population is partitioned into  $m$  groups of maximum size  $n$  and  $b/c > 1 + n/m$ .

Traulsen, A. & Nowak, M. A. (2006). *Evolution of cooperation by multilevel selection. Proceedings of the National Academy of Sciences* 130(29):10952-10955.



- Automatic analysis of software development using CVS logs
- Framework for comparing group selection models, towards design pattern(s)
- Publications:
  - Valverde, S. (2006) Crossover from Endogenous to Exogenous Activity in Open-Source Software Development, accepted for publication in Europhysics Letters
  - Hales, D. (2006) Emergent Group-Level Selection in a Peer-to-Peer Network. *Complexus* 2006;3. 108-118.
- Future: Software metrics for OS development, group selection based design pattern(s), “motif” based network analysis (D5.4.3, month 48)

### Goals (start month 13)

#### *General*

Bridge between academic research (in DELIS SP5) and realities of industry (telecom). Identify possible ideas for patents, spin-offs, industrial projects

#### *Specific*

Identify activities and mechanisms with possible commercial and industrial applications

### Partners

**Telenor, UniBO, UPF**



### Results (from D5.5.1)

- Experience of patent process, R&D within a large telecoms corporation and formation of a recent spin-off company. Telenor.
- Barriers / opportunities for commercial exploitation. Academic v. commercial culture (peer recognition v. bottom line), low status of applications (often)
- Fully distributed power method. Possible application: PageRank and similar computations in distributed search engine (SP6). UniBo and Telenor
- Epidemic spread. Possible apps: Managing virus spread in networks, disease spread in human communities. Social network analysis (for social network sites), Innovation spreading (viral marketing), information flow within organisations. Telenor



### Results (from D5.5.1)

- Analysis of structure of open-source communities. An understanding of the open source development process has the potential to contribute to improvements in the design and management of this OS process. UPF.
- Analysis of motifs in software graphs. Possible application for software development and maintenance through new software metrics (e.g. prediction of requirement for refactoring). Also intelligent software code searching. UPF
- Cooperative P2P protocols resistant to certain kinds of cheating and selfish behaviour in client nodes. Possible apps: cooperative spam & spyware countermeasures. Cooperative broadcasting, content replication. UniBo

### Goals (start month 16)

#### *General*

Comparison of biological networks and engineered designs  
Understand evolutionary mechanisms that make natural networks robust and have other differing properties. Produce simulator package.

#### *Specific*

Characterize topologies, functional constraints, fitness landscapes of existing networks. Relate knowledge to optimizing evolutionary rules / algorithms.

### Partners

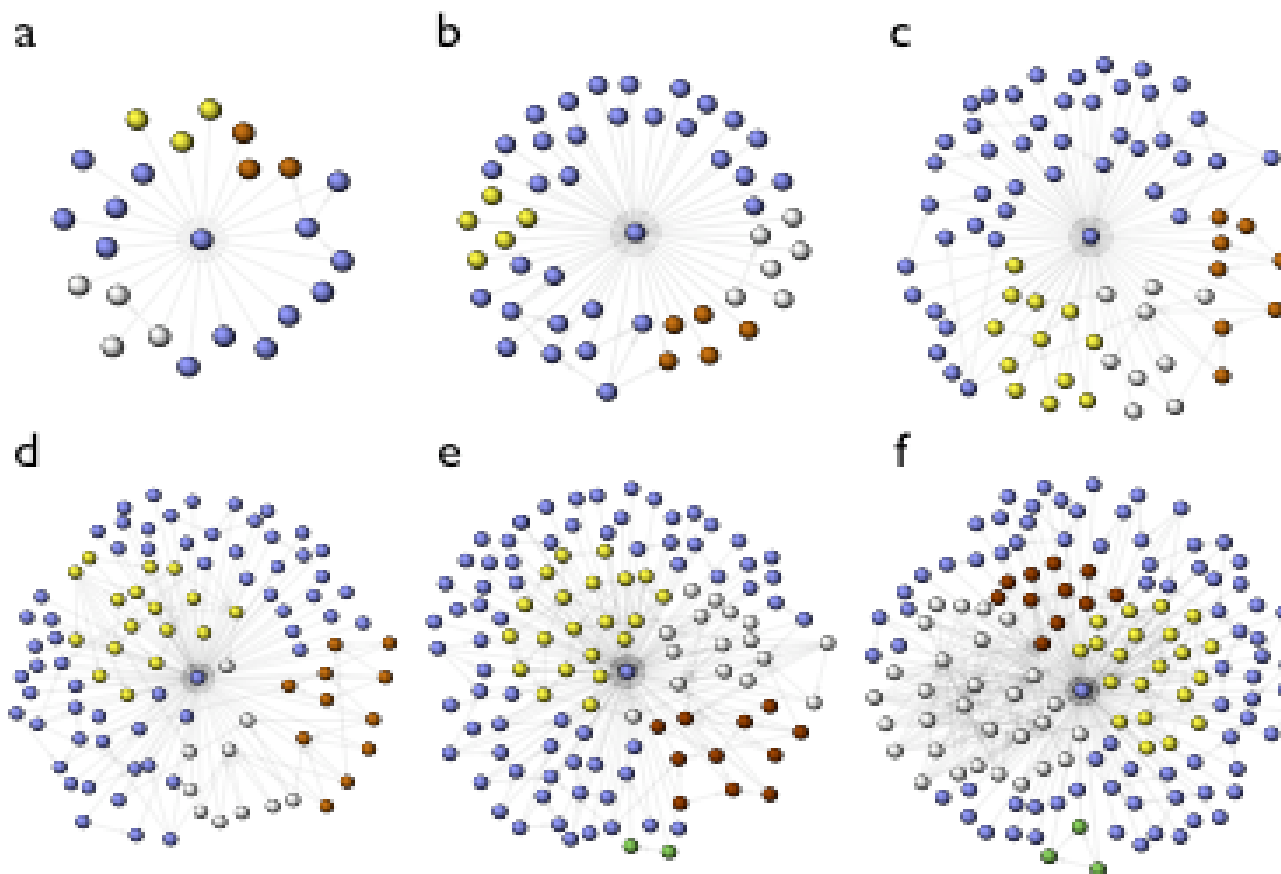
**UPF, UniBO**

### Results (from D5.6.2)

- Study of the Topology and Evolution of Patent Citation Networks
- Similar properties to scientific citation networks
- Evidence of network “modularity”
- Simple preferential attachment rule can reproduce structure
- Publications:
  - Valverde, S., Sole, R. V., Bedau, M., and Packard, N. H., “Topology and Evolution of Technology Innovation Networks”, *submitted* to Phys. Rev. E.

### Patent Citation Networks

- Study of the Topology and Evolution of Patent Citation Networks
- Captures a form of innovation and evolution of technology
- Dataset: US Patent and Trademark Office (<http://www.uspto.gov/>)
- Patents are grouped into modules - sets of nodes that exchange more links between them than with the rest of nodes
- Careful inspection of patents associated to nodes within a module reveal common functional traits
- The in-degree distribution for the patent citation network follows an extended power-law form
- Extended power-laws have been previously associated with a mixed attachment mechanism
- Mixed attachment mechanisms involve new nodes attaching to target nodes according to their degree and also at random



From (a) to (f), evolution of a patent subset related to computed tomography. The hub in the center corresponds to the precursor invention by G. Hounsfield (US patent 3778614).



### Cooperation with other SP's

- SP4-SP5 Game theory and evolutionary economics models
- SP5-SP6 Cooperative distributed information sharing
- CCT2, CSS-TW1 Meetings attended / organised

### Cooperation with other projects

- BISON As described, extensive cooperation with concluded BISON
- NANIA EPSRC (UK) 5 year project – 2 collaborative meetings made in 2006, with Manchester / Entire NANIA group
- CATNETS On-going collaboration (FET STREP)
- ONCE-CS Complexity Network, ECCS'06 (2 posters, 1 paper)

### Other

UniBo prominent in organisation of new SASO conference @ MIT, July 2007



*Thank you!*