

Economics of Peer-to-Peer Systems

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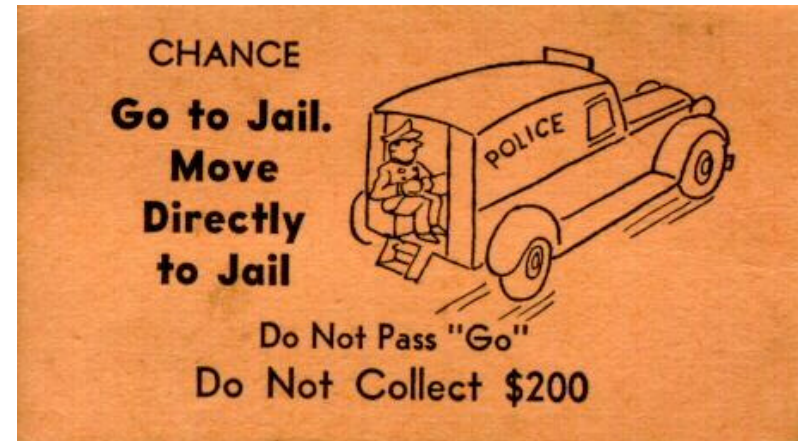
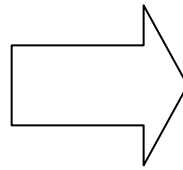
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Economics of P2P?



- This talk is NOT about the economic impact or legitimacy of P2P file sharing
- See:
 - Oberholzer & Strumpf, P2P's Impact on Recorded Music Sales.
 - Gopal, Bhattacharjee, Lertwachara, Marsden, Impact of Online P2P Sharing Networks on the Life Cycle of Albums on the Billboard Chart.

Economics of P2P

- This talk is about economics-informed design of P2P systems
 - Understanding system characteristics
 - Quantifying disincentives
 - Free-riding: individual rationality vs. collective welfare
 - Whitewashing: cheap pseudonyms
 - Information asymmetries: hidden info, hidden action
 - Designing incentive mechanisms
 - Tokens, reputation, taxation, contracts, etc.

Outline

- P2P system characteristics
 - Disincentives in sharing → free-riding
- Incentive mechanisms
 - Tokens, reputation, taxation, contracts, ...
 - Challenges: whitewashing, collusion, etc.
- Case study:
 - On-demand P2P streaming
 - Live event P2P streaming
- Information Asymmetry
 - Hidden action in multi-hop routing
- Conclusions

Diversity of P2P Systems

- Distributed storage, search, and retrieval
 - File-sharing: Napster, gnutella, kaZaA, Overnet, bitTorrent, ...
 - Anonymity/Persistence: Eternity, Freehaven, FreeNet, Publius, ...
 - DHTs: Chord, CAN, Pastry, Tapestry, OpenHash, ...
- Distributed computation
 - Globus (grid), Entropia, SETI@Home, etc.
- Communications
 - Connectivity: mobile wireless ad-hoc networks, “rooftop” networks
 - Redundancy: resilient overlay networks
 - Anonymity: onion-routing, MIX-net, Crowds
 - Distributed multimedia: skype (VoIP), ESM/Narada, Splitstream (live streaming), PROMISE (on-demand streaming)
- More at: http://www.openp2p.com/pub/q/p2p_category

P2P System Characteristics

- What do P2P systems have in common?
 - No infrastructure or service provider: rely on contributions by individual peers
 - Hidden action: difficult to monitor or enforce cooperation
 - Ad-hoc communities: highly dynamic memberships; interactions with strangers

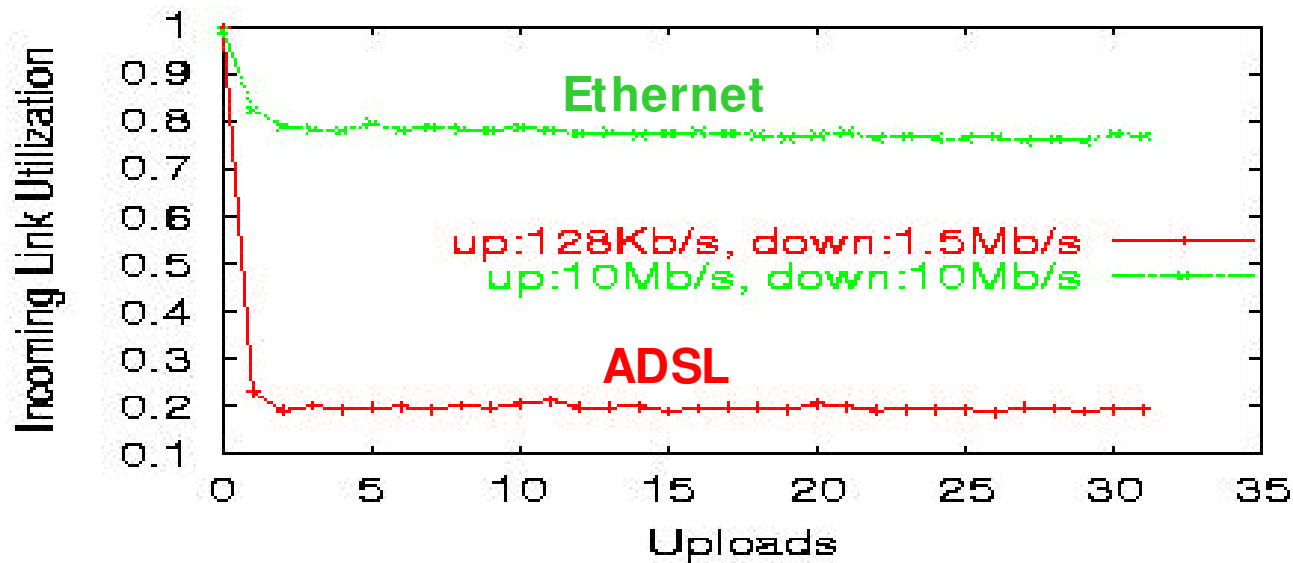
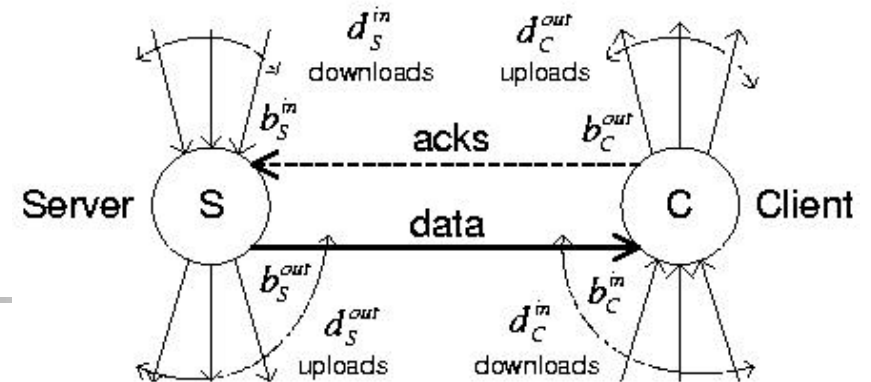
Free-riding

- Fundamental tension between *individual rationality* and *collective welfare*
 - System utility derived solely from peer contributions
 - Contributions not costless → disincentives to share
- Rational peers choose to free-ride, i.e., consume but not contribute
- Free-riding prevalent in file-sharing networks [Adar00; Sariou02]
 - 66% of gnutella peers share no files
 - 10% of peers share 87% of files
 - 20% of peers share 98% of files
- [Adar00]: “Tragedy of digital commons”?

Questions

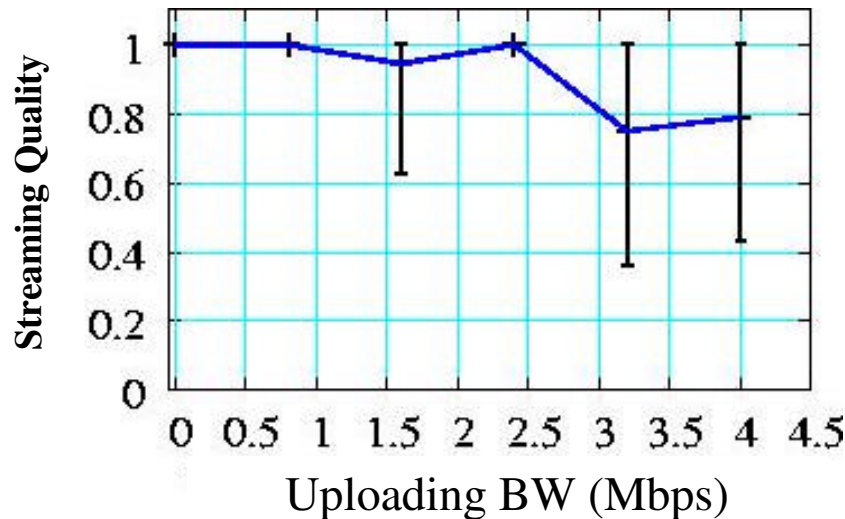
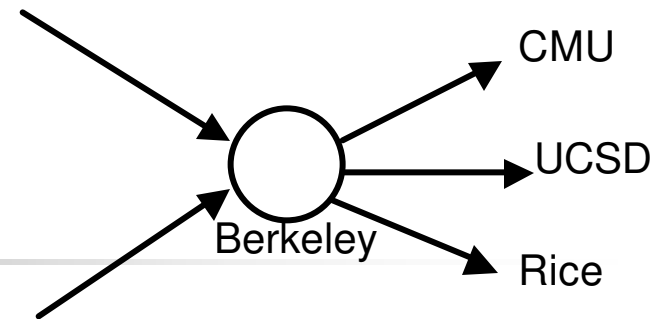
- What are the costs of participating in a P2P network? How significant are the disincentives for sharing (potential legal liability notwithstanding)?
- What are the effects of free-riding on P2P system performance? Are P2P systems doomed to failure due to non-cooperation?
- How do we design incentive mechanisms to encourage cooperation in P2P systems?

Disincentive for Sharing



- Case 1: P2P file-sharing [Feldman03]
 - Incoming link utilization degrades by 20-80% when simultaneously uploading (ns-2 simulation)
 - Contention between TCP data and ACK

Disincentive for Sharing



- Case 2: P2P media streaming [Habib04]
 - Streaming quality becomes highly variable as uploading bandwidth increases (planetlab experiment using PROMISE prototype)

General Cost Model [Christin04]

- A given node u requests an item, serves a request, or route requests between other nodes:

- Latency cost (benefit)

$$L_u = \sum_{v \in V} \sum_{k \in K_v} l_{u,k} t_{u,v} \Pr[Y = k]$$

- Service cost

$$S_u = \sum_{k \in K_u} s_{u,k} \Pr[Y = k]$$

- Routing cost

$$R_u = \sum_{v \in V} \sum_{w \in V} \sum_{k \in K_w} r_{u,k} \Pr[X = v] \Pr[Y = k] \chi_{v,w}(u)$$

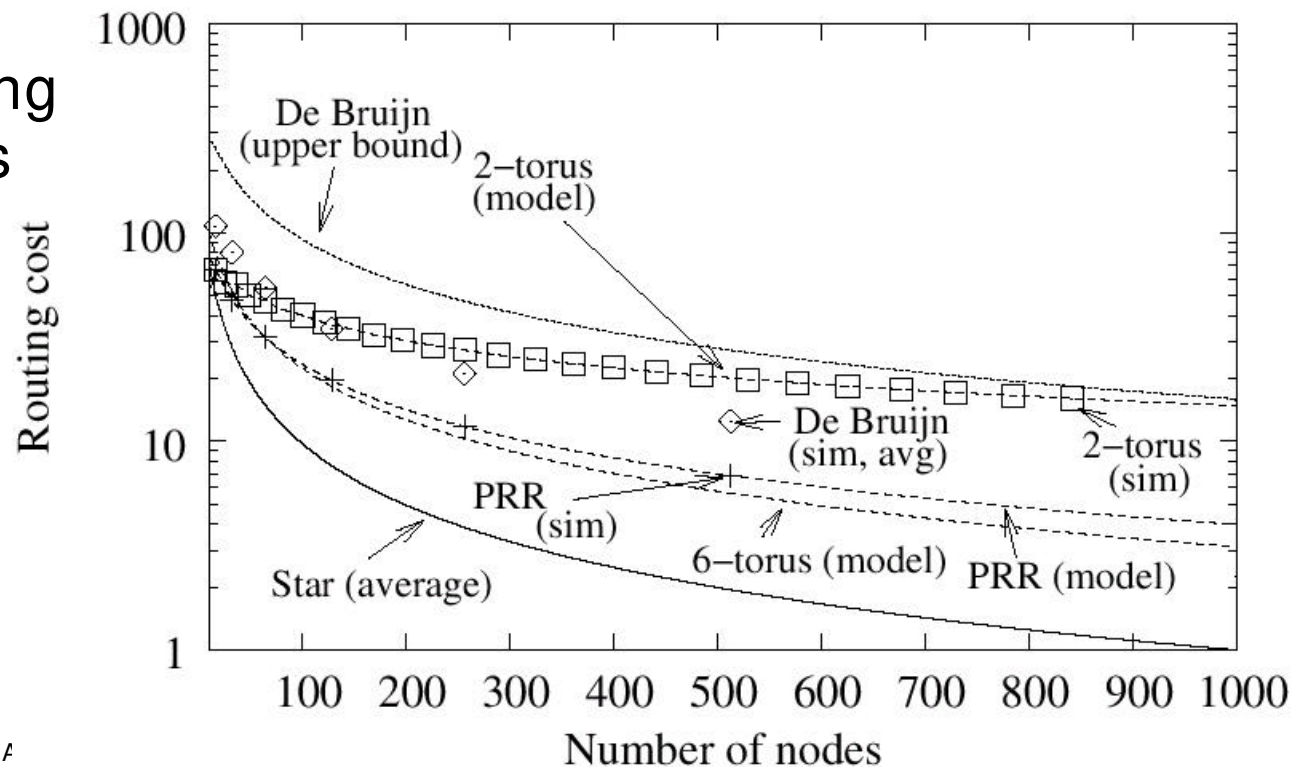
- Topology maintenance cost

$$M_u = m_u \deg(u)$$

Participation Cost

- Cost can be highly variable, dependent on many factors, e.g., item popularity, network topology, routing algorithm, even node ID!

- Example: routing cost for various DHT overlay topologies [Christin04]



What can we do?

- Rely on altruism
 - No intervention necessary if *societal generosity* sufficiently high [Feldman04b]
 - Warm-glow theory: altruistic action may be part of rational behavior [Andreoni90]
- Enforcement
 - Obedient vs. malicious peers
 - Often circumvented by determined hackers
- Incentives
 - Rational users respond to reward and/or punishment
 - Security requirements still remain

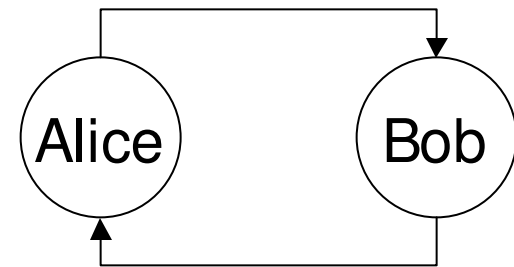
Outline

- P2P system characteristics
 - Disincentives in sharing → free-riding
- Incentive mechanisms
 - Tokens, reputation, taxation, contracts, ...
 - Challenges: whitewashing, collusion, etc.
- Case study:
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Incentive Mechanisms

- Tokens/currency
 - Appropriate for trading of multiple resource types
 - Examples: Mojonation [Wilcox-O'Hearn02], KARMA [Vishnumurthy03], tycoon [Lai04], ...
- Barter/taxation
 - Sometimes called “tit-fot-tat” or “bit-for-bit”
 - Appropriate for single commodity type
 - Examples: Bittorrent [Cohen03], ESM [Chu04]
- Reciprocity
 - Direct reciprocity (repetition)
 - Indirect reciprocity (reputation)

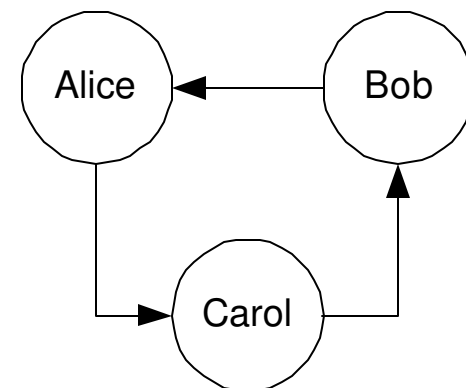
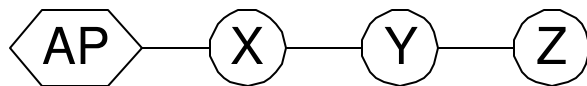
Direct Reciprocity



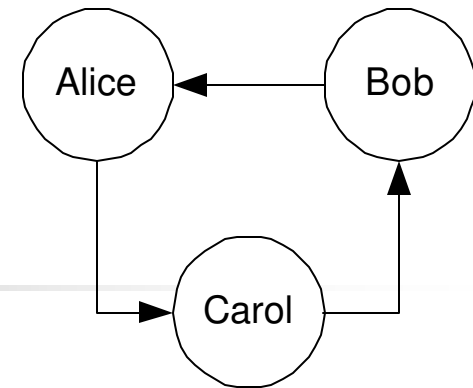
- Repetition encourages cooperation
 - e.g., Prisoners' Dilemma game:
 - one-shot game: mutual defection is dominant strategy
 - infinitely repeated game: mutual cooperation is dominant
- Simple tit-for-tat (TFT) strategy works very well in iterated prisoners' dilemma (IPD) tournaments [Axelrod84]
- Clustering (e.g., clubs [Asvanund03]) and server selection (e.g., CoopNet [Padmanabhan02]) may facilitate direct reciprocity

Direct Reciprocity

- But direct reciprocity can be difficult to achieve in P2P networks
 - Large populations and dynamic memberships
→ few repeat transactions
 - Asymmetries in interests
 - Asymmetries in capabilities



Indirect Reciprocity



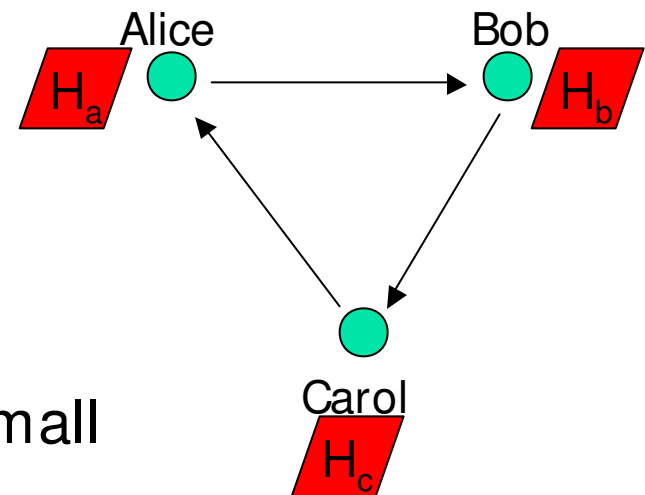
- Peers earn reputation via cooperation
- Reputable peers receive preferential treatment
- Implementation overhead for maintaining reputation information
- Various proposals
 - Image scoring [Nowak98],
Free Haven [Dingledine90],
Eigentrust [Kamvar03],
Differentiated admission [Kung03],
CONFIDANT [Buechegger02],
...

Tradeoffs and Challenges

- Design space for reciprocity-based schemes
 - Direct vs. indirect reciprocity?
 - Private vs. shared history
 - Server selection
 - Shared history: collusion resistance
 - Dealing with invisible defections
 - Dealing with strangers and whitewashers
 - Dealing with traitors
- Simulation-based study of robust incentive techniques in [Feldman04a]

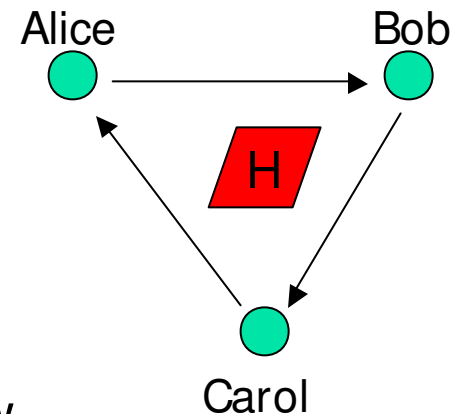
Private History

- Corresponds to direct reciprocity
- Advantages
 - Implementation is simple and decentralized
 - Immune to collusion
- Disadvantages
 - Requires repeat transactions
 - e.g., low rate of turnover, small populations
 - Deals poorly with asymmetry of interest

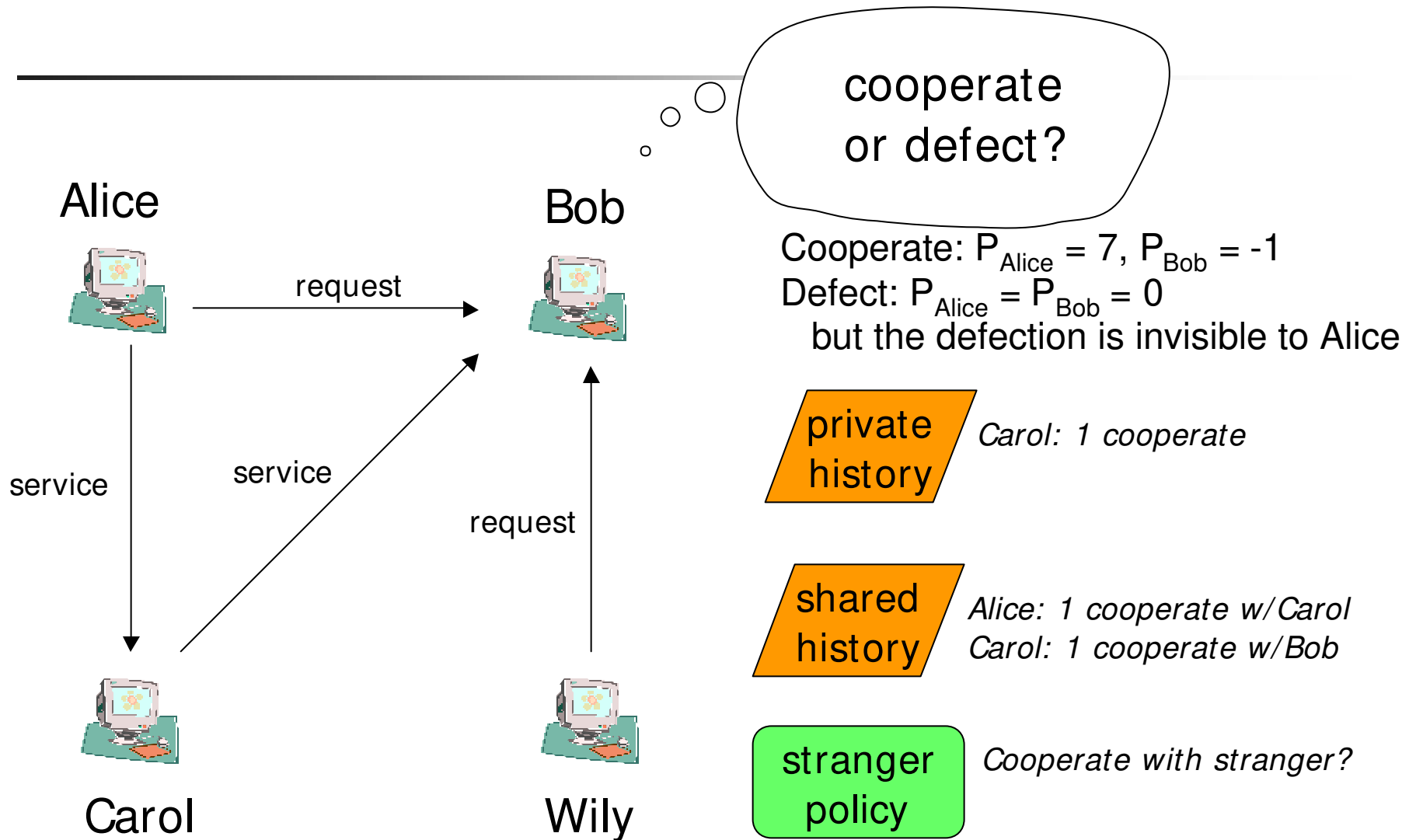


Shared History

- Corresponds to indirect reciprocity
- Advantages
 - Tolerates few repeat transactions (large populations, high turnover)
 - Tolerates asymmetry of interest
- Disadvantages
 - Susceptible to collusion
 - Subjective shared history via max-flow algorithm [Feldman04a]
 - Implementation overhead



To cooperate or not to cooperate?



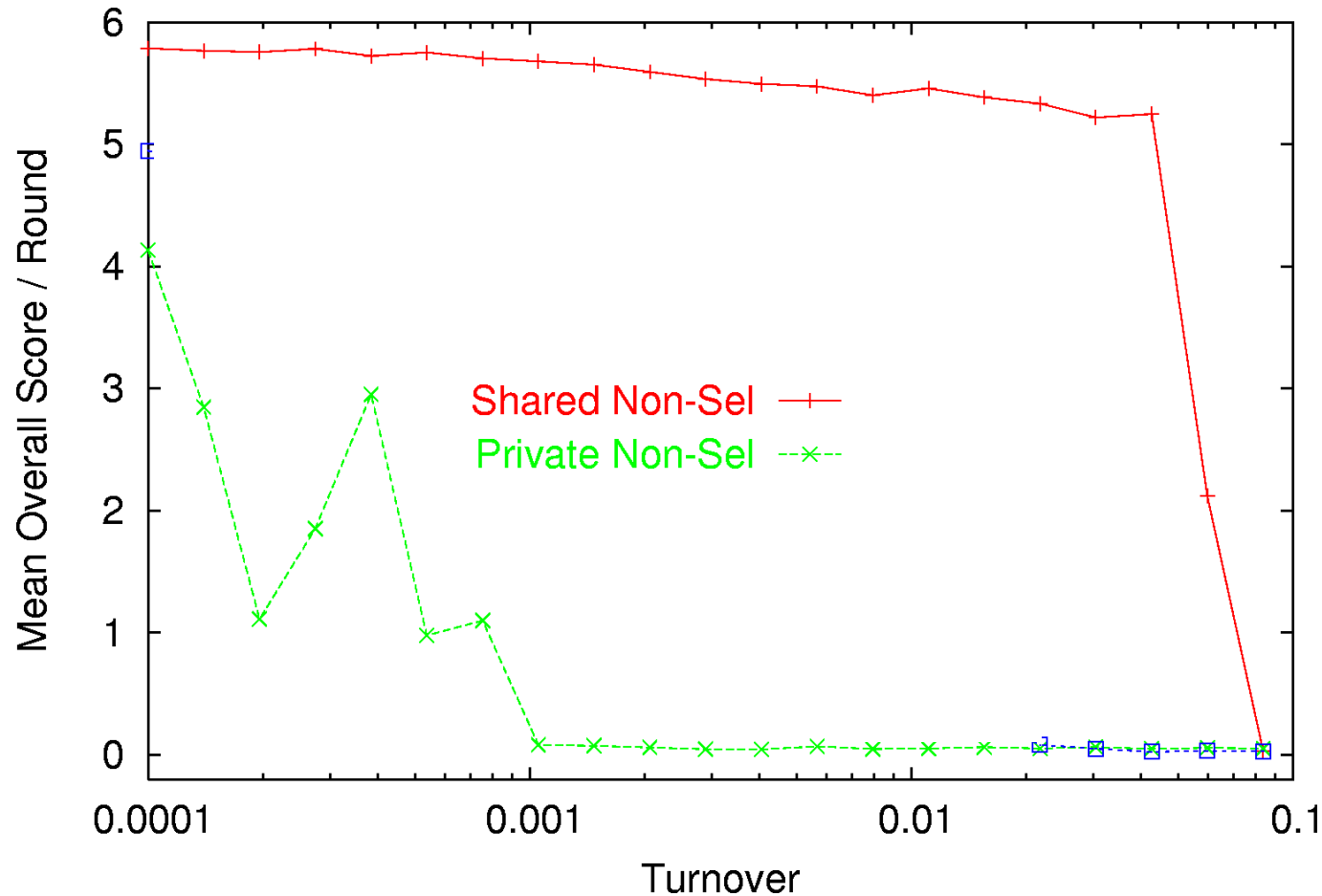
Simulation Framework

- Initial population mixture
 - 1/3 cooperators
 - 1/3 defectors
 - 1/3 reciprocators
- Game composed of rounds in which players are randomly matched, one as client, the other as server
- Learning: players probabilistically switch to strategies with higher payoffs
- Defectors can engage in collusion or whitewashing attacks
- Reciprocators can choose shared vs. private history, and different stranger policies
- Additional simulation parameters
 - Population size
 - Turnover rate
 - Hit rate
 - ...

Dealing with Invisible Defections

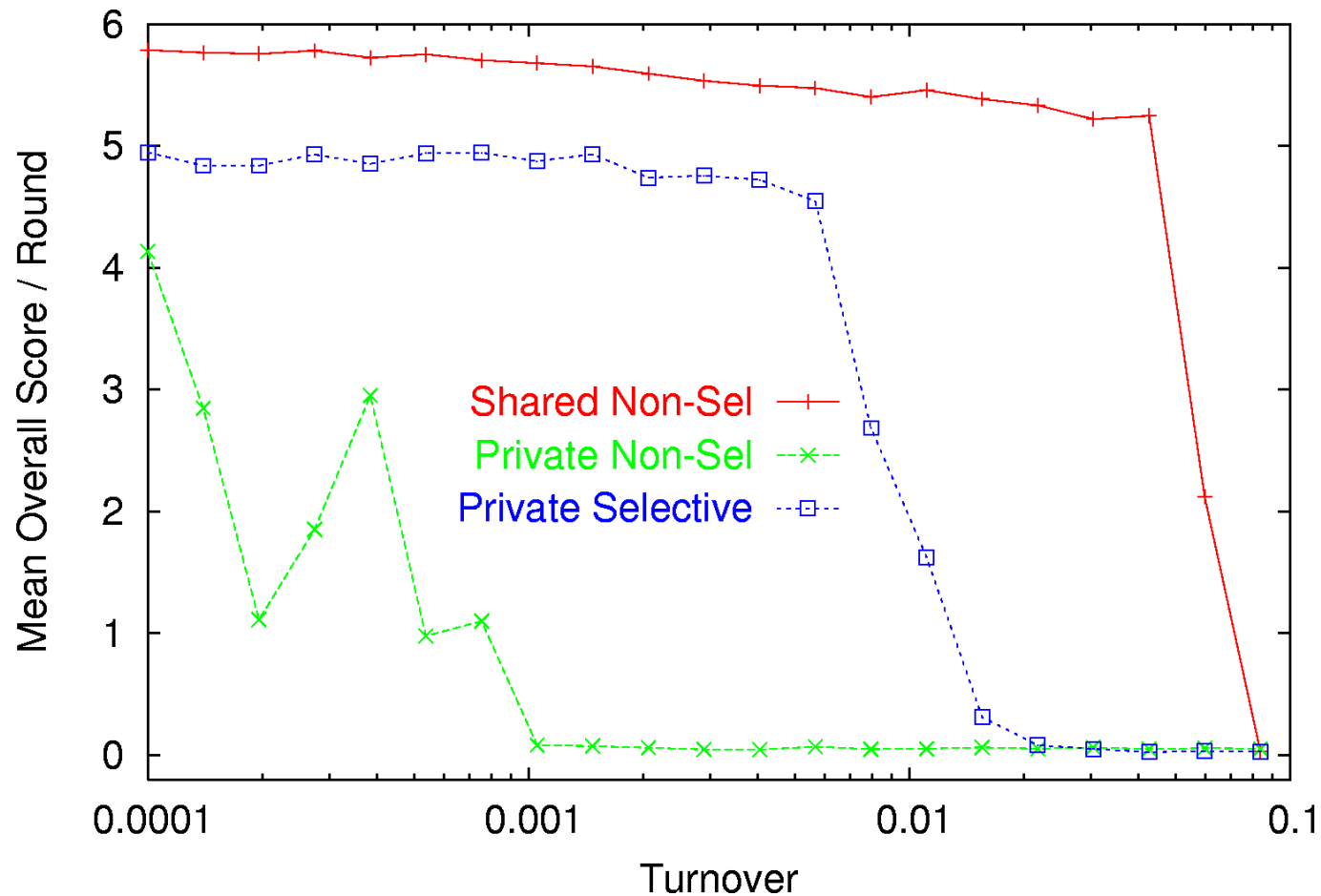
- Decision function based only on cooperation, not defection
- Reciprocative decision function: cooperate with probability $g_j(i)$
 - Generosity: $g_i = p_i / c_i$
 - p_i : service i has provided
 - c_i : service i has consumed
 - Normalized generosity: $g_j(i) = g(i) / g(j)$
 - Entity i 's generosity relative to entity j 's generosity

Private vs. Shared History



- Shared history scales to larger populations and higher turnover rates

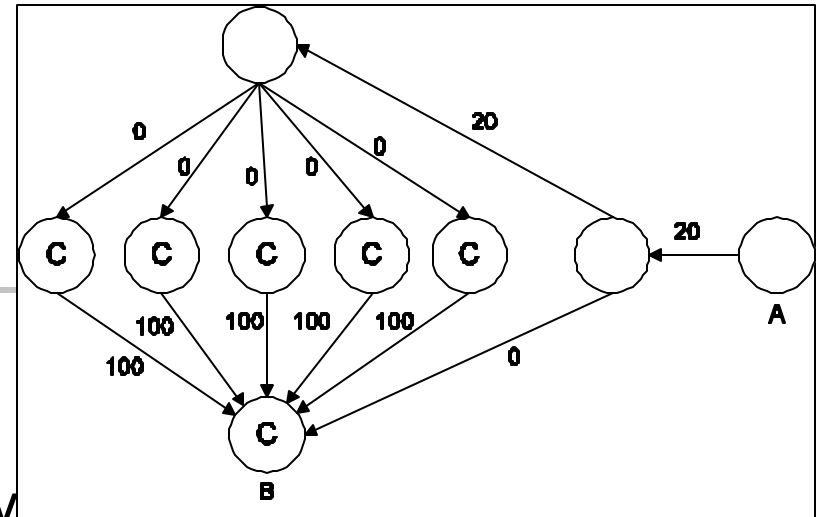
Server Selection



- Server selection improves scalability of private history approach

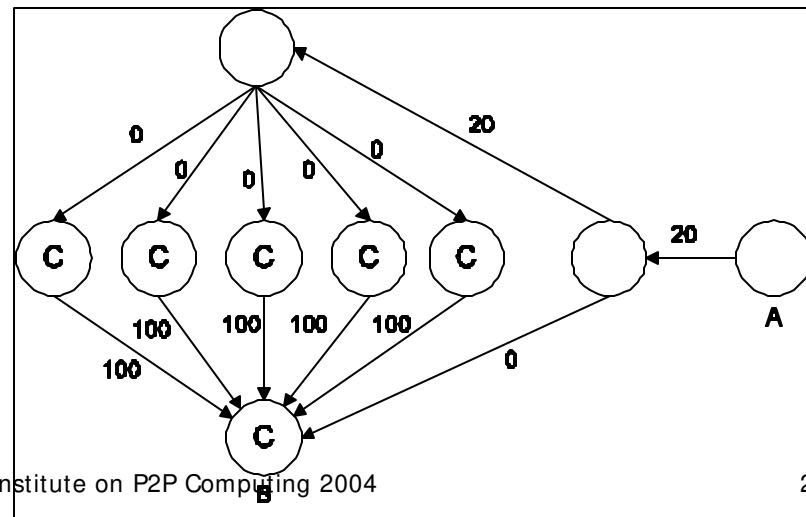
Collusion

- Shared history susceptible to collusion
- Many forms of collusion may be possible
 - False praise: falsely claiming defectors have cooperated
 - False accusation: falsely claiming cooperators have defected
- *Colluder* strategy: claiming to have received service from other colluders
- Subverts *objective* reputation systems
- Negative effect is magnified when combined with zero-cost identities
- Mitigated by *subjective* reciprocity
 - e.g., leveraging pre-trusted peers [Kamvar03], social links [Marti04], maxflow algorithm

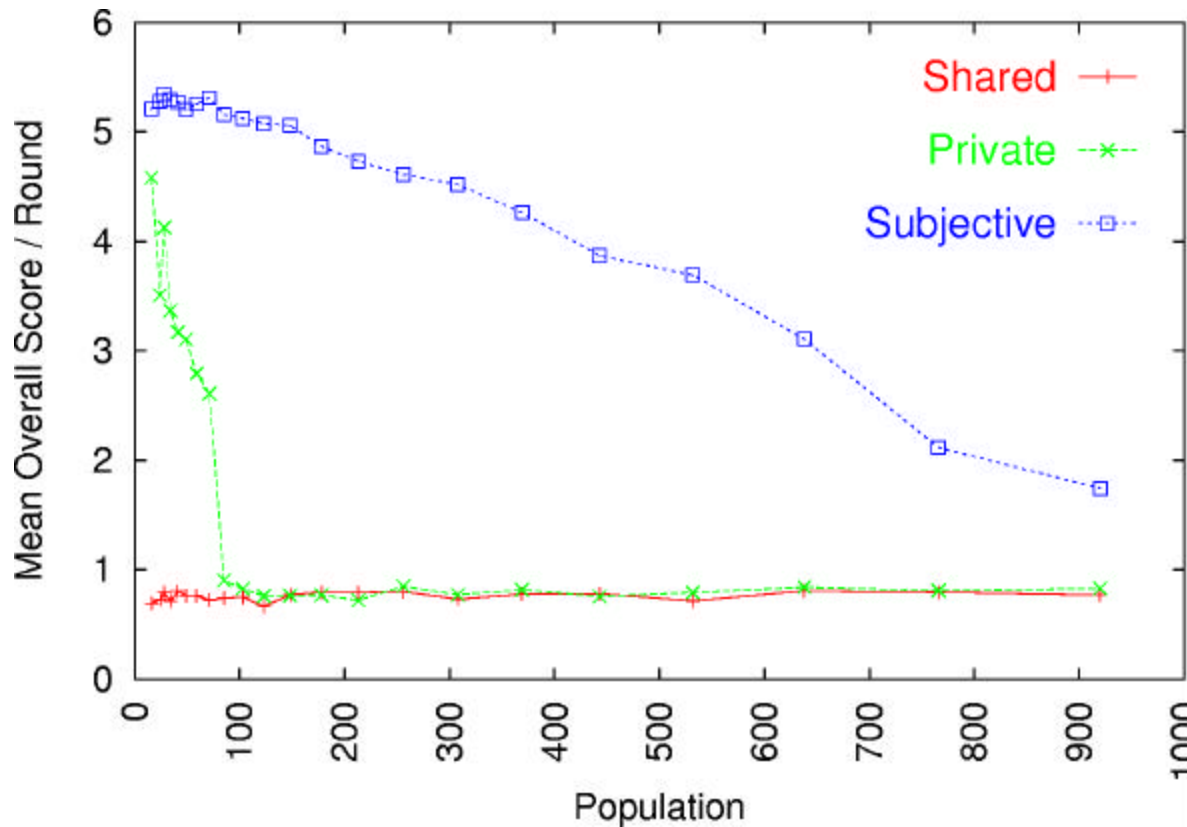


Subjective Reciprocity: Maxflow

- Compute the maximum “reputation capacity” from source to sink
- Proven to be attack resistant for authentication [Levien98][Reiter99]
- Does not require centralized trust
- Mitigate false praise, but not false accusation
- Cost: long running time $O(V^3)$
- Solution: bound mean number of nodes examined during maxflow calculation
 - Bound overhead
 - Bound efficiency



Subjective Reciprocity: Maxflow



- All defectors are colluders

$$\Pr(i_cooperate_with_j) = \min\left(\frac{MAXFLOW_j_to_i}{MAXFLOW_i_to_j}, 1\right)$$

Whitewashing Attack

- The use of history (or reputation) assumes that entities maintain persistent identities
- Problem: many online systems have zero-cost identities
 - Encourages newcomers to join
 - Circumvents history-based strategies that always cooperate with strangers
- *Whitewash* strategy: always defect, and continuously change identity
- Whitewashers indistinguishable from legitimate newcomers

Stranger Policies

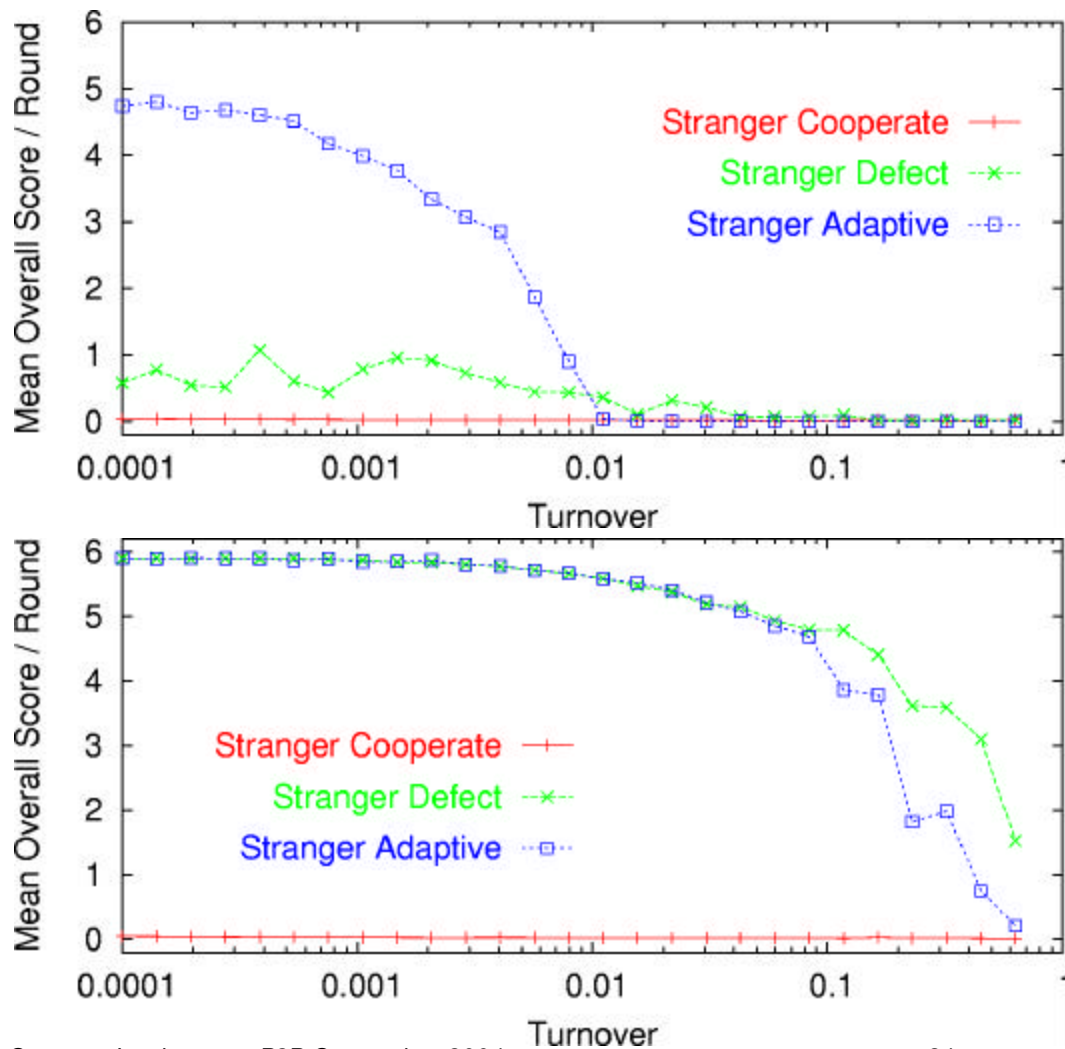
- Always cooperate (e.g., Axelrod's TFT)
 - Fully exploited by whitewashers
- Always defect
 - Provides immunity against whitewashers
 - Incurs “social cost of cheap pseudonyms” [Friedman98]
 - Raises bar to entry (discourage newcomers)
 - May initiate undesirable cycles of defections
- Randomly cooperate
 - Allows exploitation by whitewashers

Stranger Policies

- Adaptively cooperate
 - Cooperate with strangers based on “friendliness” of strangers in system: p_s / c_s
 - P_s : number of services **strangers** have provided
 - C_s : number of services **strangers** have consumed
 - Only taxes newcomers when necessary

Stranger Adaptive

- In the presence of whitewashers:
- SA scales to higher turnover rates with private history
- SA performs as well as SD with shared history



Outline

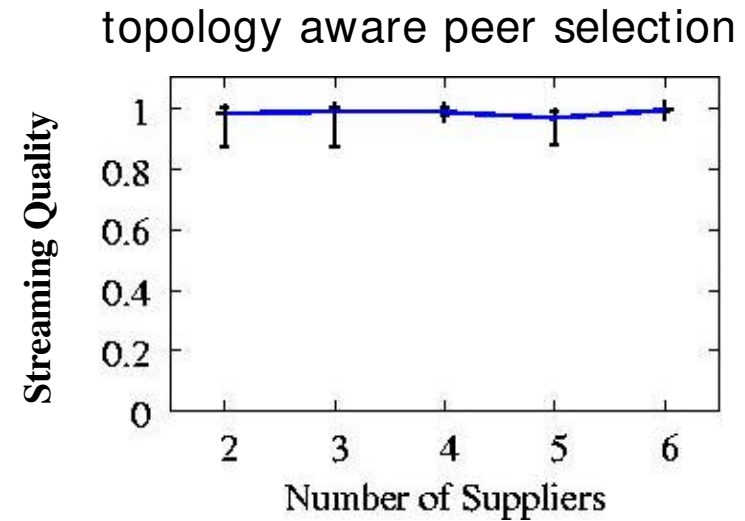
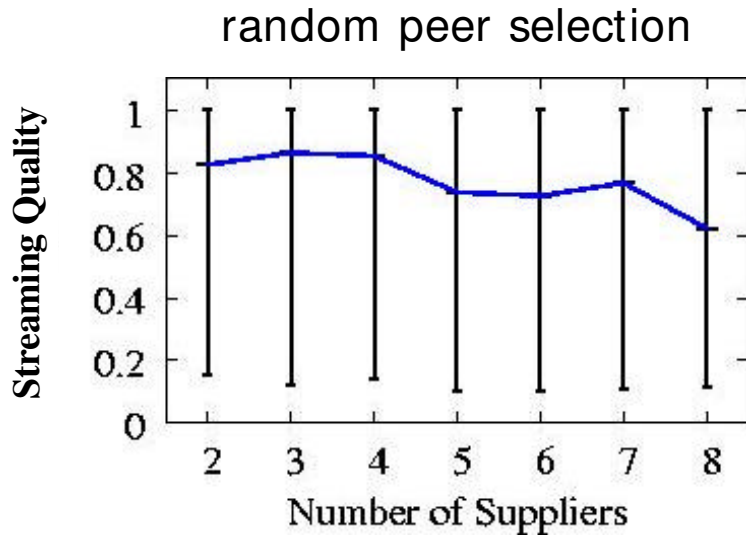
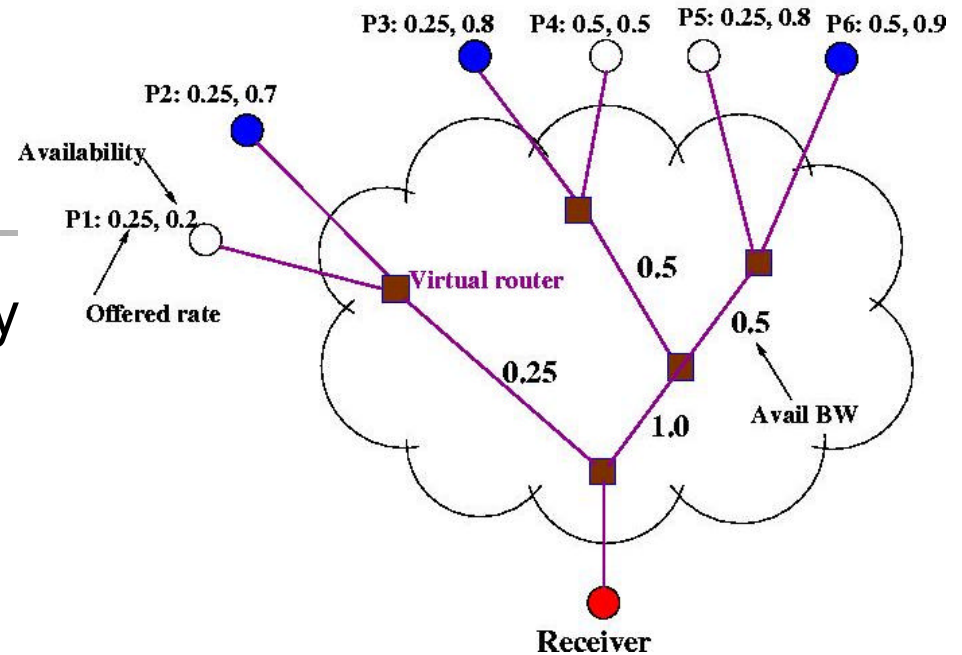
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Case Studies: P2P Streaming

- Peers contribute forwarding/uploading BW
- On-demand P2P streaming [Habib04]:
 - Many-to-one: each peer can stream from multiple peers
 - Asynchronous consumption & contribution
- Live-event P2P streaming [Chu04]:
 - One-to-many: single publisher, multiple receivers
 - Simultaneous consumption & contribution
- Different incentive mechanisms
 - Implemented for PROMISE and ESM systems, respectively

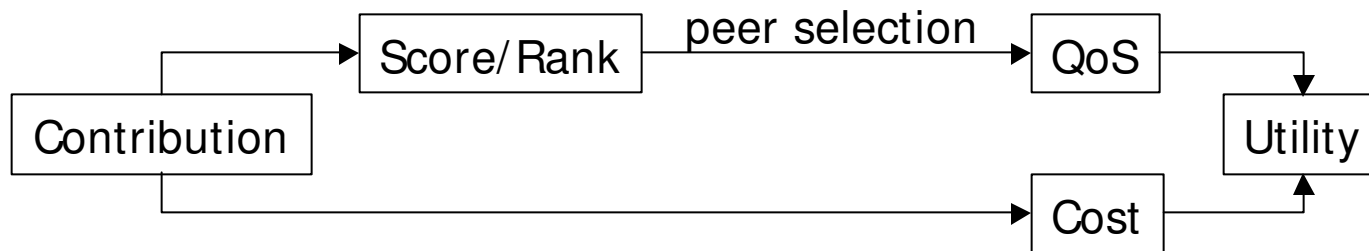
On-Demand P2P Streaming

- Observation: session quality dictated by peer selection
 - Number, capacity, and location of supplying peers



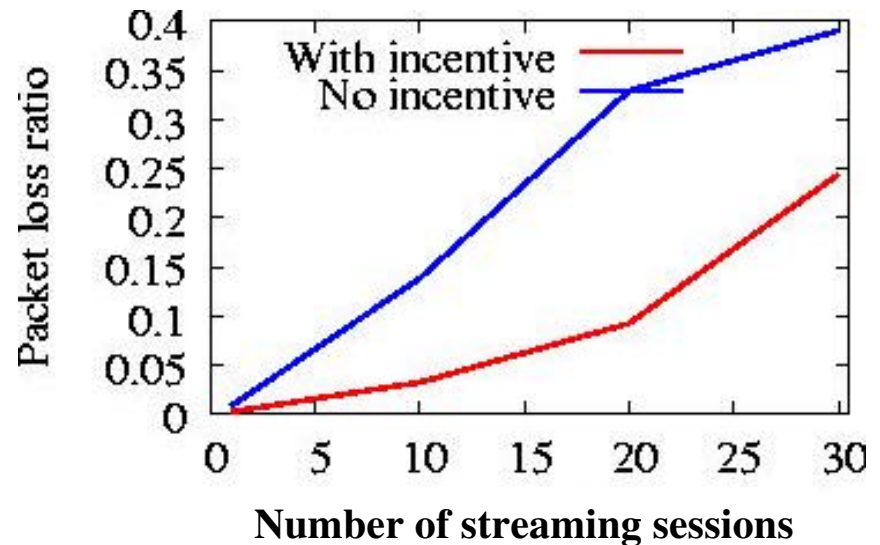
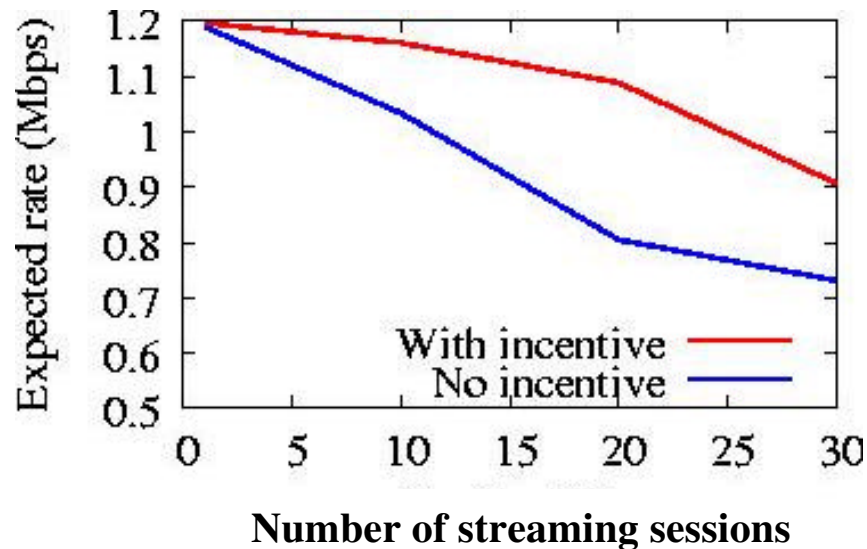
On-Demand P2P Streaming

- Incentive technique: **service-differentiated peer selection**
 - Contributors get to select the best available peers



- Since consumption and contribution are independent, need to keep history
- Rational user determines optimal contribution level to maximize utility

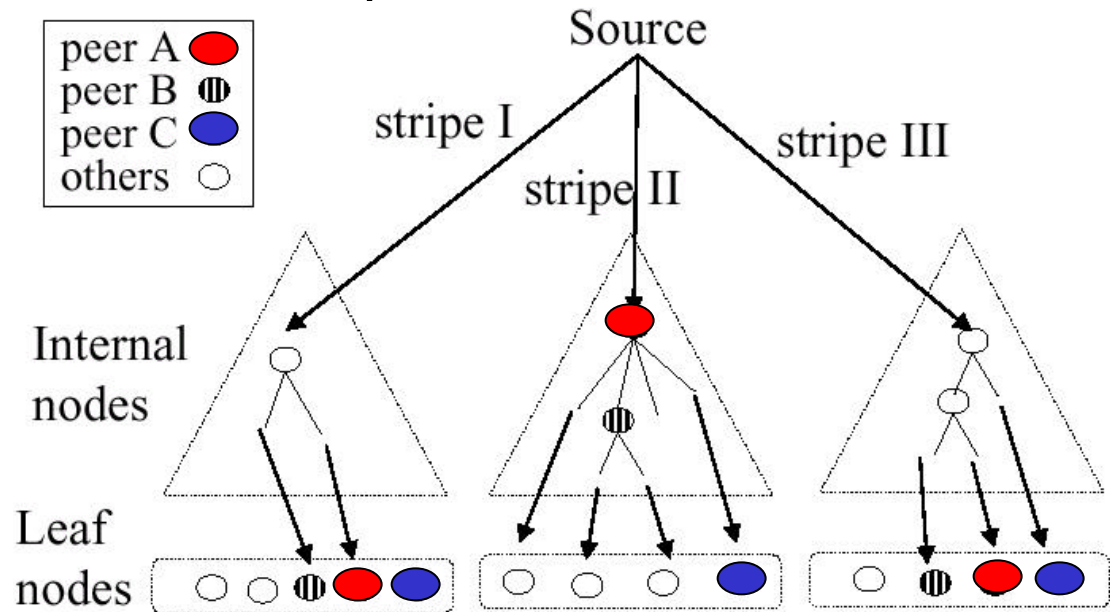
On-Demand P2P Streaming



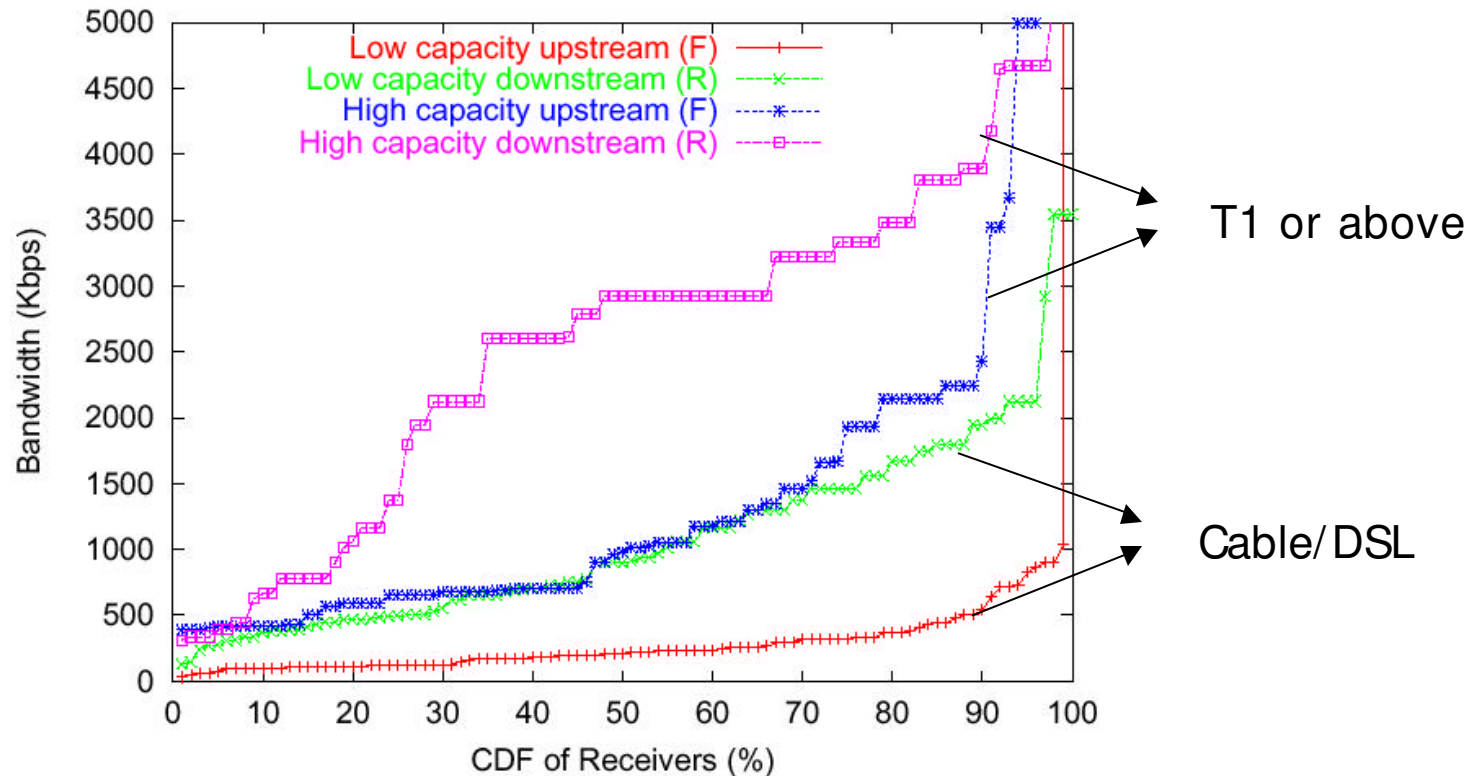
- Use of incentive mechanism improves system performance
 - Except when system load is low, or when network is congested

Live-Event P2P Streaming

- Video stream split into multiple stripes
- Peers form multiple disjoint tree structure
- Simultaneous consumption and contribution
 - No need to maintain history



Node Heterogeneity



- Measured TCP throughput for slashdot trace
- Not all peers could (should) consume and contribute the same amount of bandwidth

Taxation

- Publisher sets and enforces tax schedule to achieve resource re-distribution
 - Subsidization of resource-poor nodes by resource-rich nodes
- Rich literature in public finance
 - Optimal income taxation

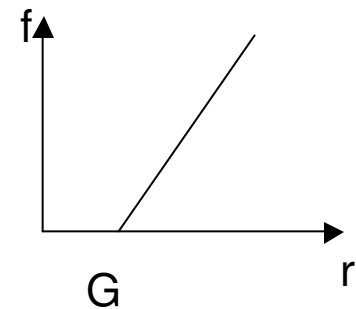
Linear taxation

- Contribution according to tax schedule

$$f = \max[t^*(r - G), 0]$$

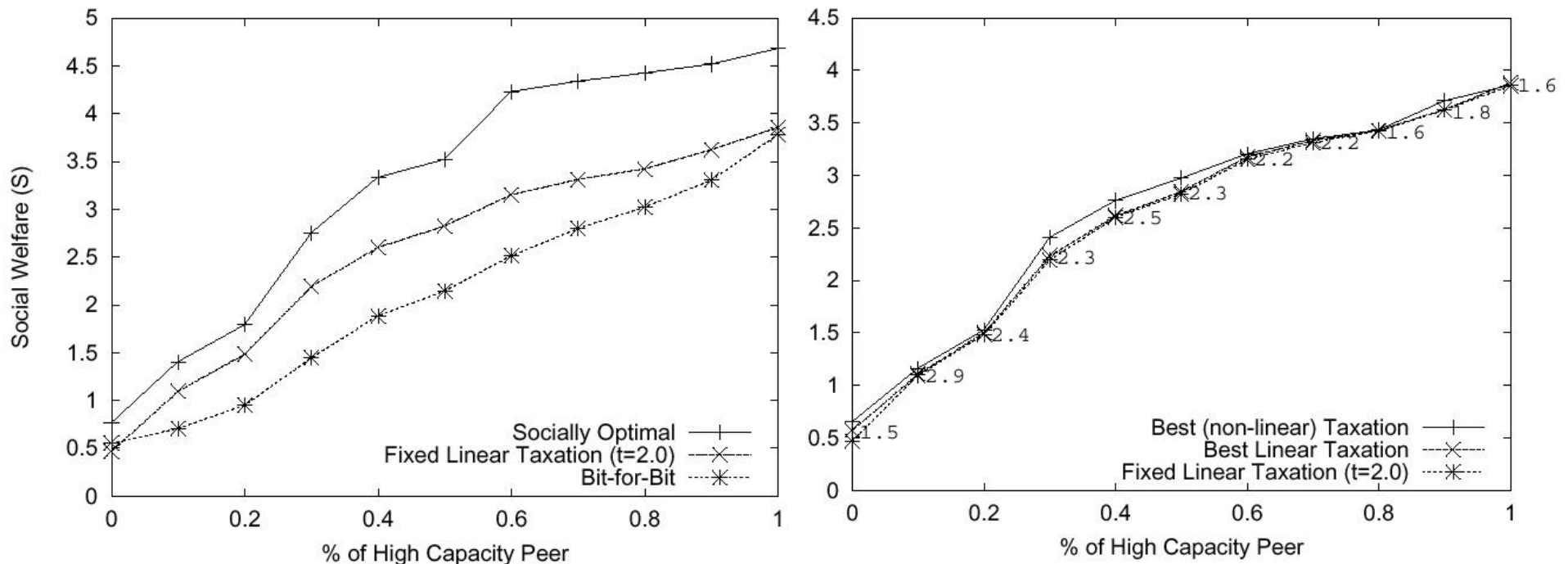
- where

- f = forwarding bandwidth
- r = received bandwidth
- t = marginal tax rate
- G = demogrant



- Publisher sets t and G , peers choose f and r
- Every peer receives at least a demogrant G
- Note: “tit-for-tat” scheme of Bittorrent [Cohen03] is special case with $t=1$ and $G=0$

Evaluation: Social Welfare



- Simple linear taxation scheme with fixed tax rate and dynamically adjusted demogrant is robust for different peer compositions

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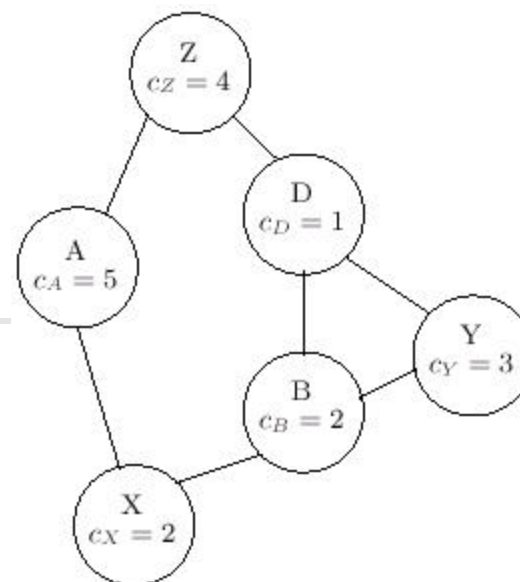
Information Asymmetry

- Condition in which some relevant information is known to some but not all of the parties involved
 - Hidden information
 - Hidden action

Hidden Information

- Agents possess private information (e.g., individual preferences, costs)
- How to induce truthful revelation to compute allocation outcome?
 - e.g., auction: agents submit truthful bids; auctioneer receives all bids and determine winner and price
- Mechanism design
 - Sometimes referred to as inverse game theory

DAMD



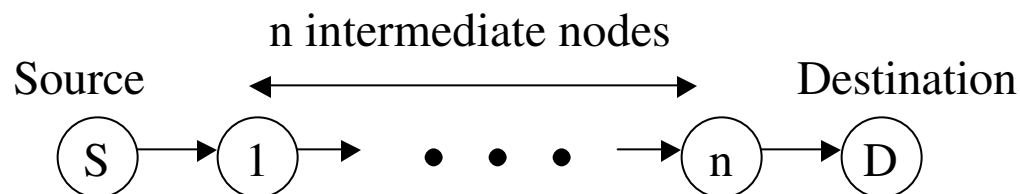
- Mechanism design (MD)
 - Centralized computation
- Distributed algorithmic mechanism design (DAMD)
 - Distributed computation
 - Computation and communication complexity
 - Internet applications [Feigenbaum02a]:
 - BGP routing [Feigenbaum02b] and Multicast cost sharing [Feigenbaum01]
 - P2P & overlay networks, web caching, distributed task allocation

Hidden Action

- Agents' actions may be unobservable by principal
- Objective: the principal designs contract to induce desired action/behavior by the agents
- Also known in economics literature as the “moral hazard” problem

Hidden Action in Multi-hop Routing

[Feldman04c]



- Multi-hop routing requires cooperation by intermediate nodes
 - P2P overlay networks (e.g., DHT)
 - Wireless ad hoc networks
 - Inter-domain routing
- Intermediate nodes have disincentives to cooperate [Christin04]

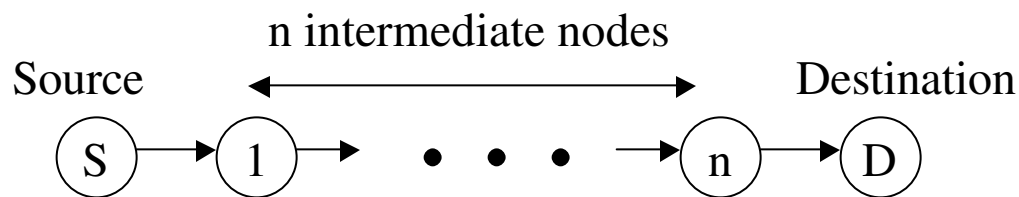
Hidden Action in Multi-hop Routing

- Actions of intermediate nodes are hidden from the sender and receiver
 - **Multi-hop:**
 - cannot attribute failure to a specific node
 - **Stochastic outcome:**
 - external factors beyond the node's control
- Rational intermediate nodes may choose to forward packets at a low priority or not forward at all

Research Questions

- Is it possible to design contracts to induce cooperative behavior of intermediate nodes despite hidden-action?
- Under what circumstance, if any, might monitoring mechanisms be useful?
- What are the implications to network design?

Model



- Principal-agent model with multiple agents performing sequential hidden action
- Agents choose between high and low effort actions
 - Drop vs. forward
 - Best-effort vs. priority forwarding
- Principal can observe
 - Final outcome only (without monitoring)
 - Per-hop outcome (with monitoring)
- Principal signs contract with each agent; payment based on final outcome (without monitoring) or per-hop outcome (with monitoring)

Actions, Costs and Outcomes

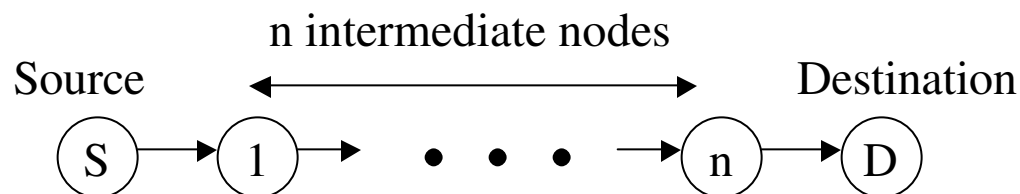
- **Actions** $a_i \in \{0,1\}$:
 - Low-effort: $a_i=0$
 - High-effort: $a_i=1$
- **Costs** associated with actions:
 - $C(a_i=0) = 0$
 - $C(a_i=1) = c$
- **Outcomes** $X(a, k) = x \in \{x^L, x^H\}$
 - x^L : packet doesn't reach destination
 - x^H : packet reaches destination

Payments and Utilities

- **Individual payments**, s_i , depend on outcome
- **Utility** of participants:
 - Agent i : $U_i(s_i, c_i, a_i) = s_i - a_i c_i$
 - Principal: $W(x, S) = b(x) - S$, where: $S = \sum_{i=1}^n s_i$
- Principal needs to satisfy two constraints for each agent:
 - **IR**: individual rationality (participation constraint)
 - **IC**: incentive compatibility

Assumptions

- Transit cost, c , is common knowledge
- Topology is common knowledge
- Nodes are risk-neutral
- $(n+1)$ per-hop transmission events are i.i.d.



Results

- Scenario 1: drop vs. forward without monitoring
- Scenario 2: drop vs. forward with monitoring
- Scenario 3: best-effort vs. priority forwarding
- Scenario 4: multiple disjoint paths

Scenario 1: Drop Versus Forward without Monitoring

- Probability of a one-hop success:

$$\Pr(x_{i \rightarrow i+1}^H | a_i) = (1 - k)a_i$$

- Principal observes only the final outcome
- Payment schedule to agent i : $s_i = (s_i^H, s_i^L)$
where:

$$s_i^H = s_i(x = x^H) \quad \text{If packet reaches **destination**}$$

$$s_i^L = s_i(x = x^L) \quad \text{If packet does not reach **destination**}$$

Scenario 1: Drop Versus Forward without Monitoring

Result: Under the best contract that induces high-effort behavior from all agents in a **Nash equilibrium:**

- Agent's expected payment = Agent's expected cost
- Principal achieves the first-best utility
- Payment schedule:

$$\begin{aligned} s_i^L &= 0 \\ s_i^H &= \frac{c}{(1-k)^{n-i+1}} \end{aligned}$$

Scenario 1: Drop Versus Forward without Monitoring

Proof sketch:

■ IC constraint:

$$\Pr(x^H | a_{j \geq i} = 1) s_i^H + \Pr(x^L | a_{j \geq i} = 1) s_i^L$$

$$E[s]_{a_{j \geq i} = 1} - c \geq E[s]_{a_i = 0, a_{j > i} = 1}$$

$$\Pr(x^H | a_i = 0, a_{j > i} = 1) s_i^H + \Pr(x^L | a_i = 0, a_{j > i} = 1) s_i^L$$

■ IR constraint:

$$\Pr(x^H | a_{j \geq i} = 1) s_i^H + \Pr(x^L | a_{j \geq i} = 1) s_i^L$$

$$s_i^L$$

$$\Pr(x_{S \rightarrow i}^H | a_{j < i} = 1) (E[s]_{a_{j \geq i} = 1} - c) + \Pr(x_{S \rightarrow i}^L | a_{j < i} = 1) E[s]_{a_i = 0, a_{j > i} = 1} \geq 0$$

Scenario 1: Drop Versus Forward without Monitoring

Proof sketch (continued):

- IC and IR bind at the optimal contract

$$\Pr(x^H) s_i^H + \Pr(x^L) s_i^L$$

- Expected payment to node i:

$$E[s]_{a_{j=1} \forall j} = (1-k)^i c$$

- Expected cost to node i:

$$\Pr(x_{S \rightarrow i}^H) c = (1-k)^i c$$

Scenario 2: Drop Versus Forward with Monitoring

- With per-hop monitoring, sender knows outcome of each per-hop transmission
- Scenario reduces to n instances of single principal – single agent problem

- IC: $E[s]_{a_i=1} - c \geq E[s]_{a_i=0}$ \rightarrow $(1-k)s_i^H + ks_i^L - c \geq s_i^L$

- IR: $E[s]_{a_i=1} - c \geq 0$ \rightarrow $(1-k)s_i^1 + ks_i^0 - c \geq 0$

- Principal obtains same utility as first-best contract
- n identical payment schedules:

$$s_i^L = 0$$
$$s_i^H = \frac{c}{1-k}$$

The Value of Per-Hop Monitoring

- The sender derives the same expected utility whether it obtains per-hop monitoring or not
- Yet, several differences

	Solution concept	Location effect	Vulnerability to collusion
Without monitoring	Nash equilibrium	Location dependent contracts	Not vulnerable
With monitoring	(Weak) dominant strategy	Location independent contracts	Vulnerable

Scenario 3: Best-Effort versus Priority Forwarding

- Priority forwarding reduces the loss rate
- Probability of a one-hop success:

$$\Pr(x_{i \rightarrow i+1}^H \mid a_i) = 1 - (k - qa_i)$$

where:

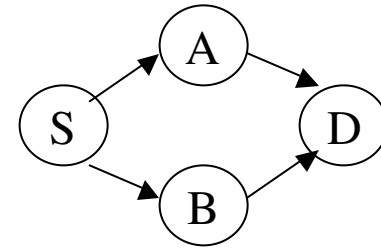
$$q \in (0,1] \quad \text{and} \quad k \in [q,1]$$

- Packet may reach the destination under low-effort actions, but with lower probability

Scenario 3: Best-Effort versus Priority Forwarding

- Result: sender derives same expected utility with or without monitoring
- At the optimal contract, the payment upon a failure is negative (transfer from agent to principal)
 - If limited liability constraint is imposed ($s \geq 0$), first-best cannot be achieved
- The sender may maximize its utility by signing a contract with only m out of the n nodes
 - Without monitoring: contract with nodes closest to destination, since expected cost decreases in i

Scenario 4: Multiple Disjoint Paths



- Multiple disjoint paths exist from source to destination
- Sender elects to send multiple copies of the packets to maximize likelihood of delivery
- Two scenarios:
 - **Per-path monitoring**: has *a specific copy* of the packet reached destination?
 - **No per-path monitoring**: has *at least one copy* of the packet reached destination?
- Result: sender derives same expected utility whether it obtains *per-path* monitoring information or not

Discussion

- Appropriate design of contracts achieves cooperative behavior despite hidden-action
- Sender achieves first-best utility in Nash equilibrium in the absence of monitoring under several assumptions
- Per-hop or per-path monitoring:
 - Does not reduce implementation cost to sender under these assumptions
 - Achieves cooperative behavior in dominant strategy
 - Vulnerable to various forms of collusion
 - May yield some benefit under different assumptions, which may or may not justify its cost
- Implications to system design
 - Monitoring vs. contracting

Ongoing and Future Work

- Uniqueness of equilibrium
- Recursive contracts
- Relax assumptions:
 - Correlated transmission events (not i.i.d.)
 - Risk-averse agents
 - Topology and/or transit costs are not common knowledge
- More realistic monitoring mechanisms
- Collusive behavior
- Uncertainty with respect to choice and observability

Outline

- P2P system characteristics
 - Disincentives in sharing → free-riding
- Incentive mechanisms
 - Tokens, reputation, taxation, contracts, ...
 - Challenges: whitewashing, collusion, etc.
- Case study:
 - On-demand P2P streaming
 - Live event P2P streaming
- Information Asymmetry
 - Hidden action in multi-hop routing
- **Conclusions**

Conclusions

- Inherent decentralization of P2P systems brings incentives to the forefront
 - Peers not just obedient or malicious, but strategic
 - Collective welfare often misaligned with individual rationality
 - Significant challenges and opportunities in designing incentive mechanisms for diversity of P2P systems

Conclusions

- Economics-informed P2P system design
 - Game theory (mechanism design, evolution and learning, network formation)
 - Economics of asymmetric information (incentive and contract theory, agency theory)
 - Public finance
 - Theory on public goods and club goods
 - Social network theory
- Generalizable to various distributed and networked systems, including the Internet

Economics-Informed System Design

- Emerging multidisciplinary research communities
 - p2pecon
 - p2pecon'03: <http://www.sims.berkeley.edu/p2pecon/>
 - p2pecon'04: <http://www.eecs.harvard.edu/p2pecon/>
 - PINS
 - Practice and Theory of Incentives and Game Theory in Networked Systems
 - <http://www.acm.org/sigs/sigcomm/sigcomm2004/pins.html>
 - WEIS
 - Workshop on Economics and Information Security
 - WEIS'04: <http://www.dtc.umn.edu/weis2004/>

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