

# On Achieving Optimal End-to-End Throughput in Data Networks: Theoretical and Empirical Studies



IEEE INFOCOM 2005

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12/9/2005

# Outline

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- Introduction
- Network Coding
  - What is Network Coding
  - Advantage of Network Coding
- *cFlow* LP, *mFlow* LP and *oFlow* LP
- Empirical Studies
- Conclusion

# Introduction

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- The throughput of information transmission within a data network is constrained by the network topology and link capacities.
- Improve transmission throughput
  - Traditional techniques: routing strategy
  - New dimension: network coding
- Optimal transmission strategy to achieve max throughput includes both a routing scheme and a corresponding coding scheme.

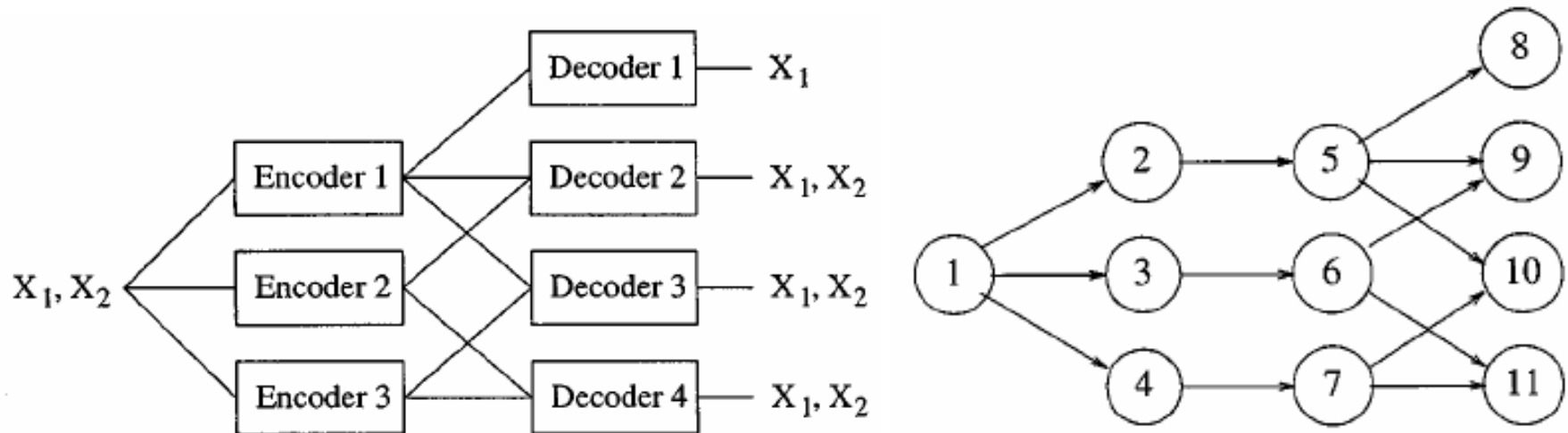
# What is Network Coding (1/2)

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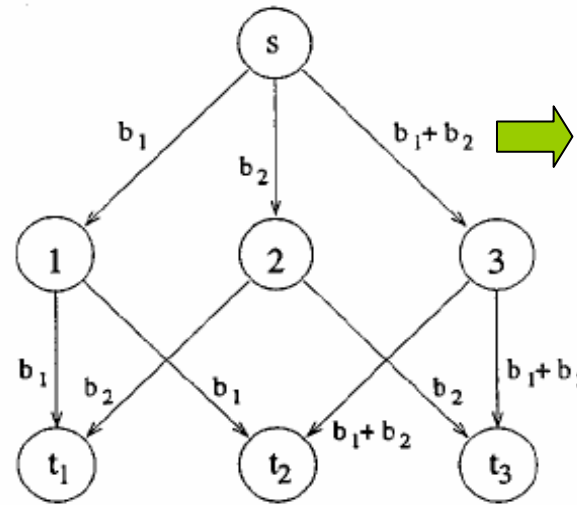
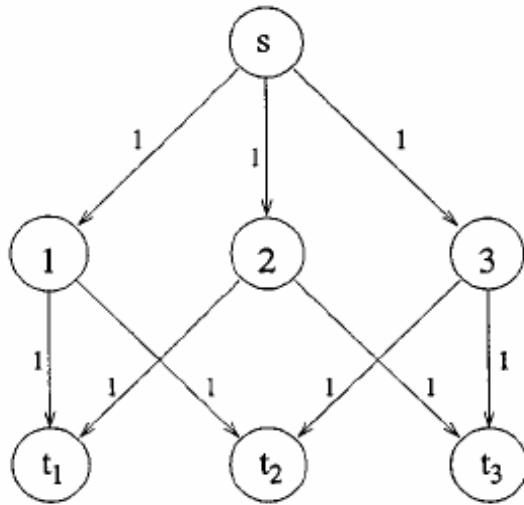
- In existing computer networks, each node functions as a switch that either
  - Relays information from an input link to an output link, or
  - Replicates information from an input link and sends to a certain set of output links
- A node can function as an encoder in the sense that it receives information from all input links, encodes, and sends information to all output links

# What is Network Coding (2/2)

- Directed graph  $G=(V,E)$ , let  $\mathbf{R}=[R_{ij}, (i,j) \in E]$ 
  - A vector  $\mathbf{R}$  is admissible if and only if there exists a coding scheme satisfying the set of multicast requirements such that the coding rate from node  $i$  to node  $j$  is less than or equal to  $R_{ij}$  for all  $(i, j) \in E$

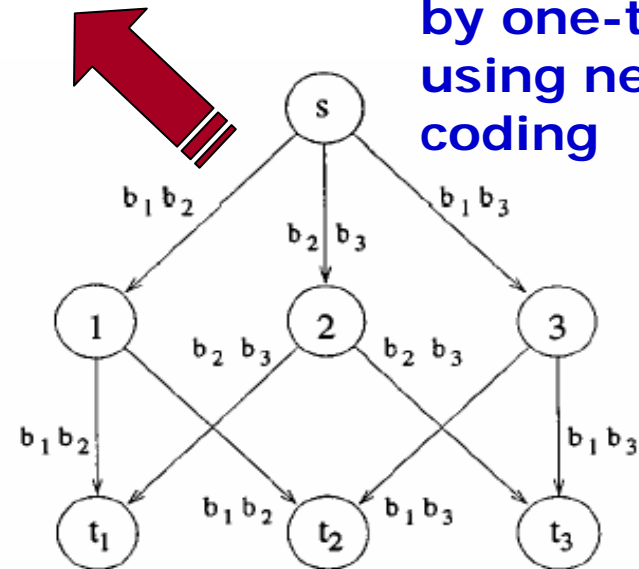
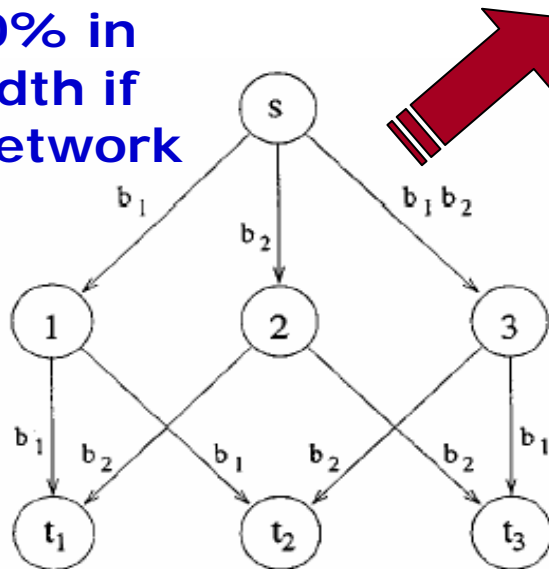


# Advantage of Network Coding (1/2)



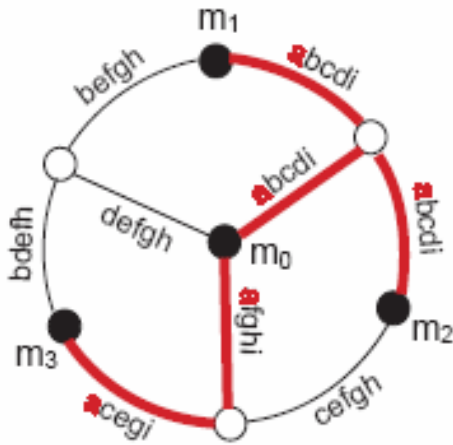
Simple coding:  
 $b_1$  or  $b_2$

Save 10% in  
Bandwidth if  
using network  
coding

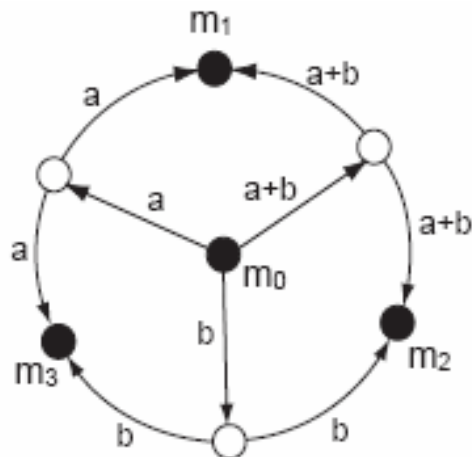


Increase the  
throughput  
by one-third if  
using network  
coding

# Advantage of Network Coding (2/2)



(a) steiner tree packing and multicast without coding.



(b) multicast with network coding.

- State-of-the-art approaches to compute the optimal throughput of multicast sessions
  - Steiner tree packing
  - Steiner strength
- Both Steiner tree packing and Steiner strength have been shown to be NP-complete
- The achievable optimal throughput
  - 1.8 without coding (Steiner tree packing)
  - 2.0 with simple network coding

# Steiner Tree Packing and Steiner Strength

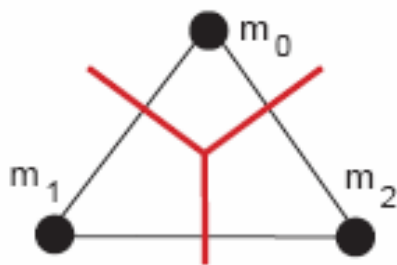
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- A Steiner tree is a sub-tree of the network that connects every multicast node. The network is decomposed into weighted steiner trees such that the total of tree weights is maximized, referred to as the **steiner tree packing number**
- In an undirected network  $N$ , let  $P$  be the set of network partitions where there exists at least one source or receiver node in each component of the partition, the **steiner strength** of  $N$  is defined as  $\min_{p \in P} |E_c| / (|p| - 1)$ , where  $|E_c|$  is the total inter-component capacity on the set of link  $E_c$  being cut, and  $|p|$  is the number of components in the partition  $p$

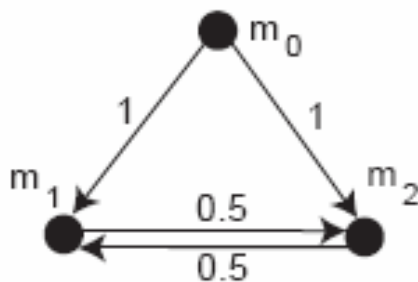


# Directed vs. Undirected Network

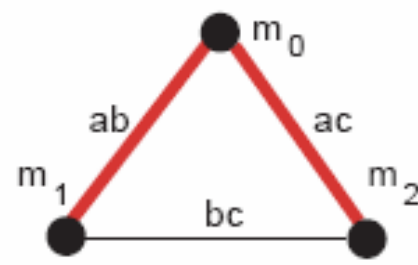
- In directed networks, if a rate  $x$  can be achieved for each receiver in the group independently, it can also be achieved for the entire multicast session.
- For an undirected data network  $N$  with a single multicast session,  $\pi(N) \leq \chi(N) \leq \eta(N)$ , where
  - $\pi(N)$  is the steiner tree packing number
  - $\chi(N)$  is the achievable optimal throughput
  - $\eta(N)$  is the steiner strength



(a) A partition.



(b) Optimal throughput with network coding is 1.5.



(c) Optimal throughput without network coding is also 1.5.

# cFlow Linear Program

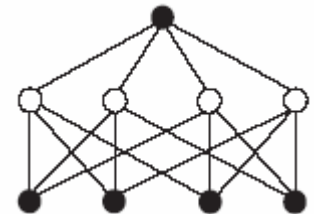
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- *cFlow* (conceptual flow): network flows that co-exist in the network without contending for link capacities
- *cFlow* LP: compute optimal throughput with network coding
  - $m_0$  is the source and  $m_1 \dots m_k$  are the multicast receivers
  - $f^1 \dots f^k$  are conceptual flows from sender  $m_0$  to each of the receivers;  $f^i(a)$  is the flow rate for each directed link  $a$
  - Maximize  $f^*$  under constraints of
    - Orientation constraints
    - Independent network flow constraints for each conceptual flow
    - Equal rate constraints  $f^* = f_{in}^i(m_i) \quad \forall i \in [1 \dots k]$
  - $f^* = \max_{o \in O} \left[ \min_{m_i \in M - \{m_0\}} (\text{maximum } m_0 \rightarrow m_i \text{ flow rate}) \right]$
  - Complexity:  $O(|M| \cdot |E|)$

# *cFlow* LP vs. Steiner Tree Packing

Network	$ V $	$ M $	$ E $	$\chi(N)$	$\pi(N)$	$\frac{\chi(N)}{\pi(N)}$	# of trees
Fig. 1	7	3	9	2	1.875	1.067	17
$C(3, 2)$	7	4	9	2	1.8	1.111	26
$C(4, 3)$	9	5	16	3	2.667	1.125	1,113
$C(4, 2)$	11	7	16	2	1.778	1.125	1,128
$C(5, 4)$	11	6	25	4	3.571	1.12	75,524
$C(5, 2)$	16	11	25	2	1.786	1.12	119,104
$C(5, 3)$	16	11	35	3	—	—	49,956,624

- ❑ *cFlow* LP is much more scalable and efficient than Steiner tree packing
- ❑ Optimal throughput with coding is always lower bounded by that without coding, however,  $\chi(N)/\pi(N)$  no higher than 1.125
- ❑ Coded transmission may lead to more integral flow rates and throughput than uncoded transmission



# *mFlow* LP and *oFlow* LP

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## □ *mFlow* LP

- Compute optimal throughput for multiple sessions
- Replace standard network flow constraints in *cFlow* LP with a set of multicommodity *cFlow* constraints
- Complexity:  $O(s \cdot |M| \cdot |E|)$

## □ *oFlow* LP

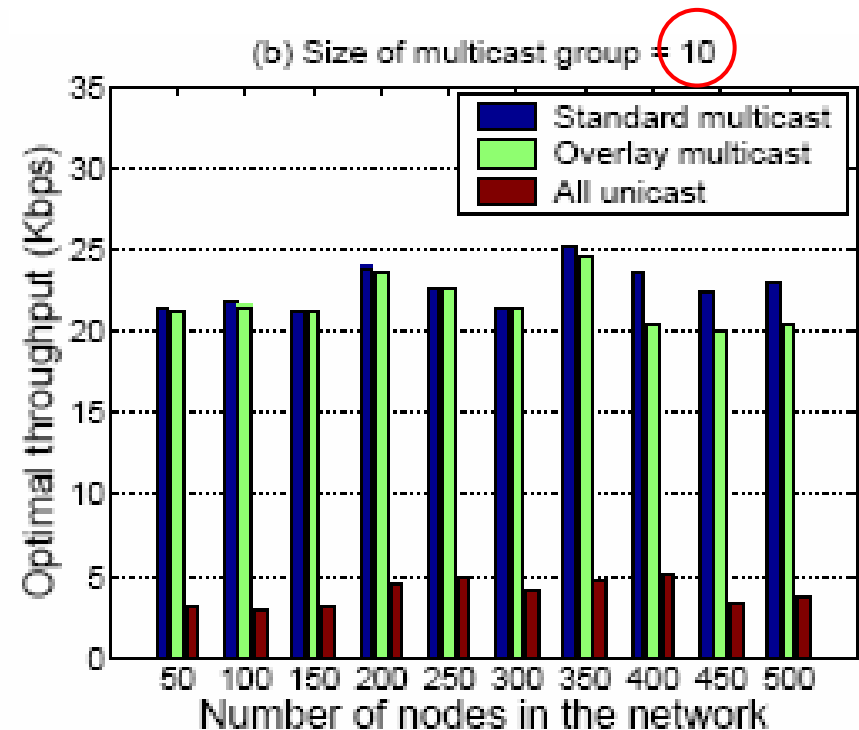
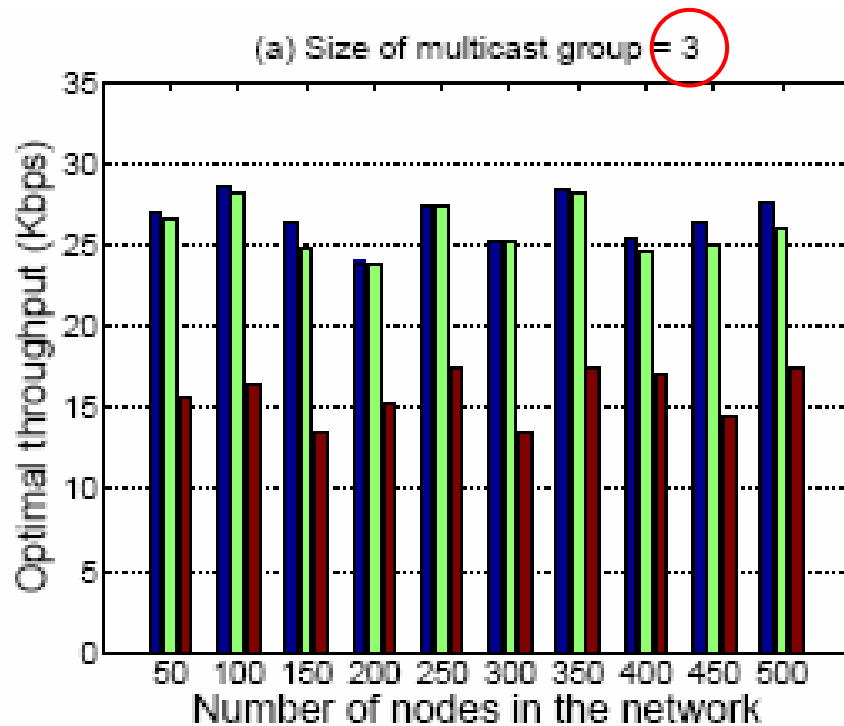
- Compute optimal throughput for the overlay networks
- Standard multicommodity flow constraints are specified for the underlay flows between end hosts and only via routers
- Map the underlay flow rate to the overlay link capacity and then apply original *cFlow* constraints in the overlay level
- Complexity:  $O(|H|^2 \cdot |E|)$ , H: set of overlay nodes

# How advantageous is network coding with respect to improving optimal throughput

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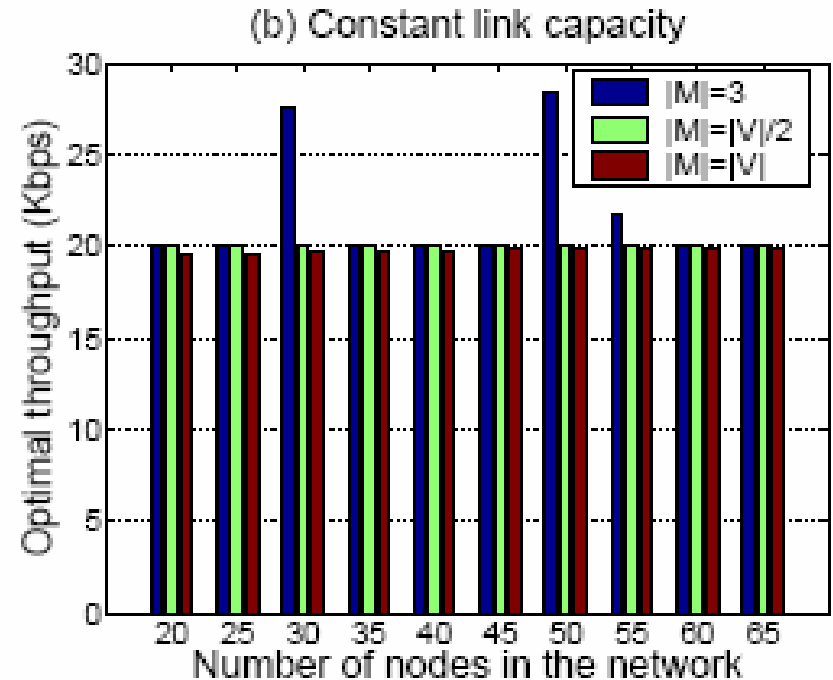
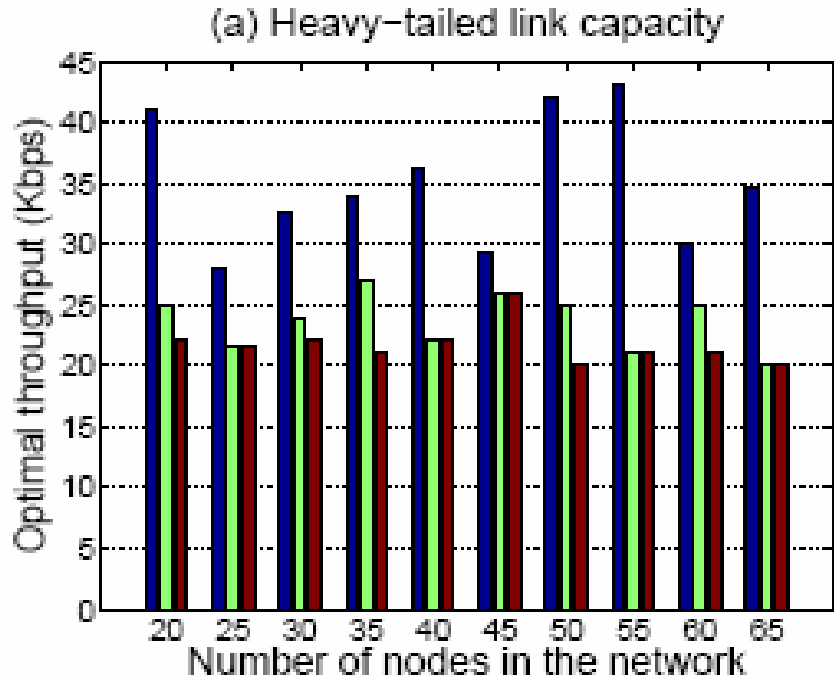
- ❑ Coding advantage: the ratio of achievable optimal throughput with coding over that without coding
- ❑ Previous work shows that in directed acyclic networks with integral routing requirements, there exist multicast networks where the coding advantage grows proportionally as  $\log(|V|)$
- ❑ For multicast transmission in undirected networks, the coding advantage is bounded by a constant factor of 2
- ❑ The fundamental benefit of network coding is not higher optimal throughput, but to facilitate significantly more efficient computation and implementation of strategies

# How advantageous is standard multicast compared to unicast and overlay multicast?



- The optimal throughput achieved by overlay multicast is almost identical to that achieved by standard multicast

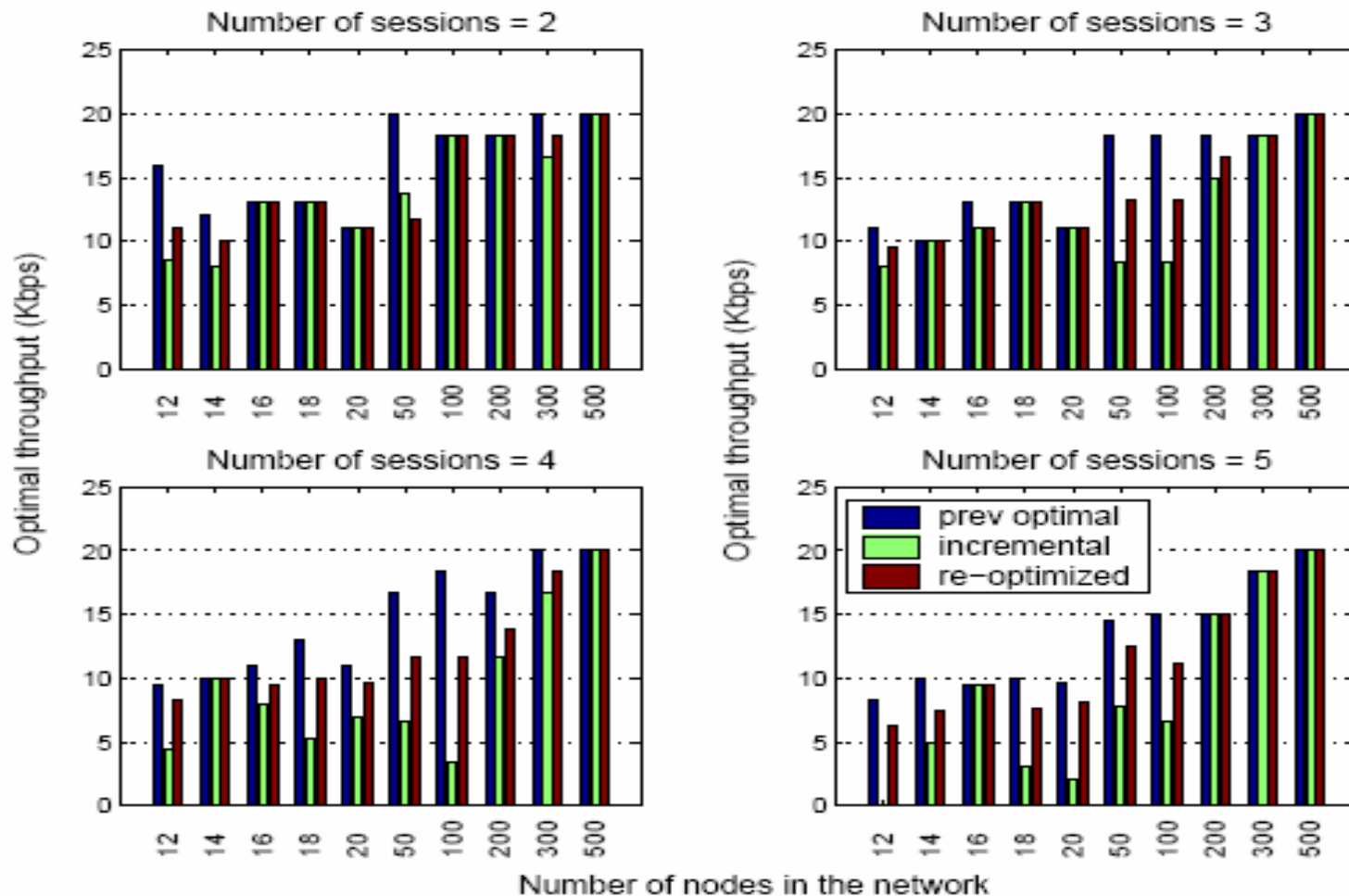
# How sensitive is optimal throughput to node joins?



- Effect on achievable throughput is rather significant for multicast group from 3 to  $|V|/2$

- Power-law network topologies
- Optimal multicast throughput remains roughly constant

# How sensitive is optimal throughput to the addition of new sessions?

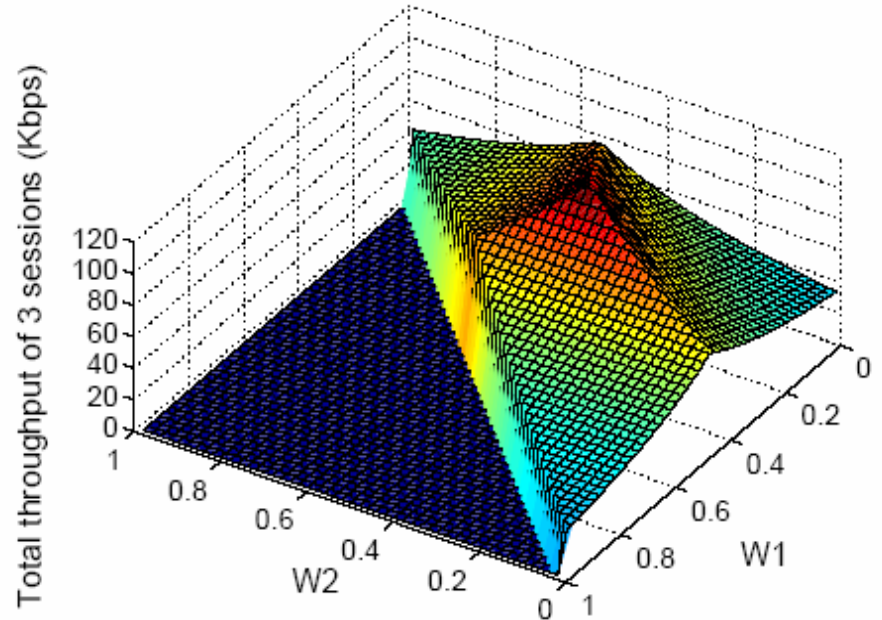


- Addition of extra session does not dramatically affect achievable optimal throughput, especially when network size is large



# How sensitive is optimal throughput to fairness constraints?

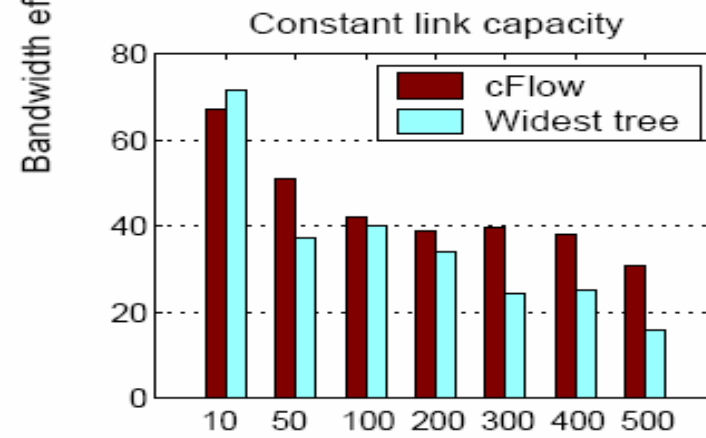
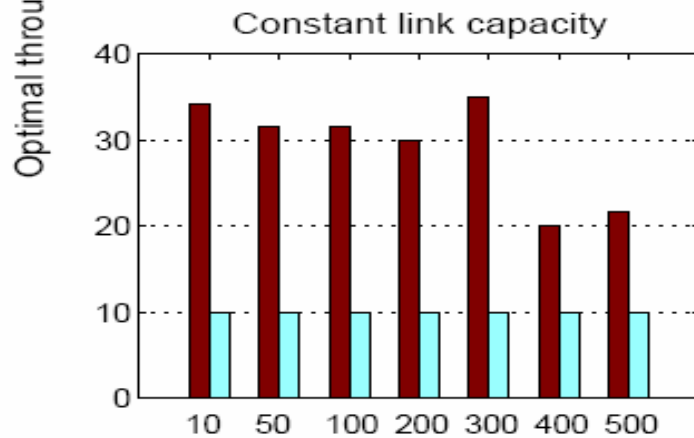
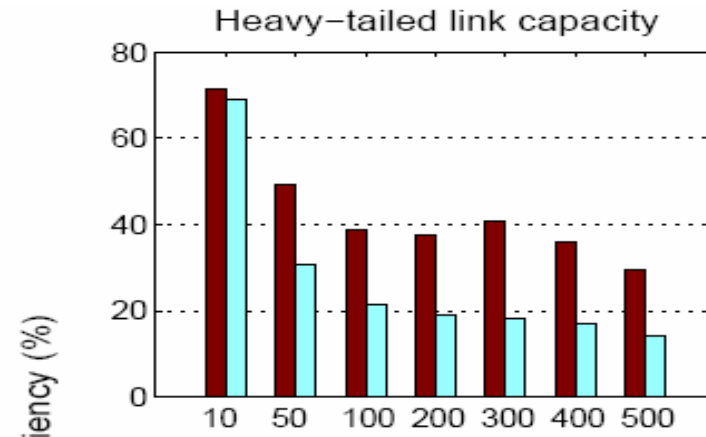
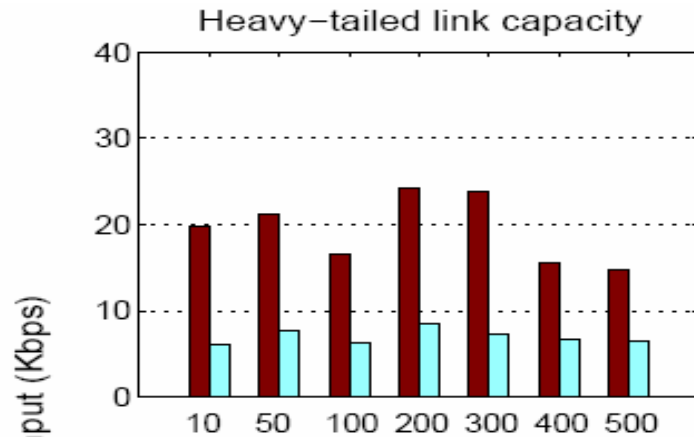
- 3 1-to-2 multicast sessions, 4 types of fairness constraints are investigated
  - No fairness requirement
  - Absolute fairness
  - Weighted proportional fairness
  - Max-min fairness
- Global optimal throughput:  $(w_1, w_2, w_3) = (0.287, 0.407, 0.306)$  which is identical to the throughput with max-min fairness



network size	10	20	50	100	150	250	350
max-min (Kbps)	120.0	136.7	173.3	160.0	146.7	146.7	183.3
optimal (Kbps)	126.1	140.0	173.3	160.0	146.7	146.7	183.3

# Does optimal throughput lead to low bandwidth efficiency?

- Bandwidth efficiency of optimal throughput multicast is also better than that of the widest steiner tree multicast

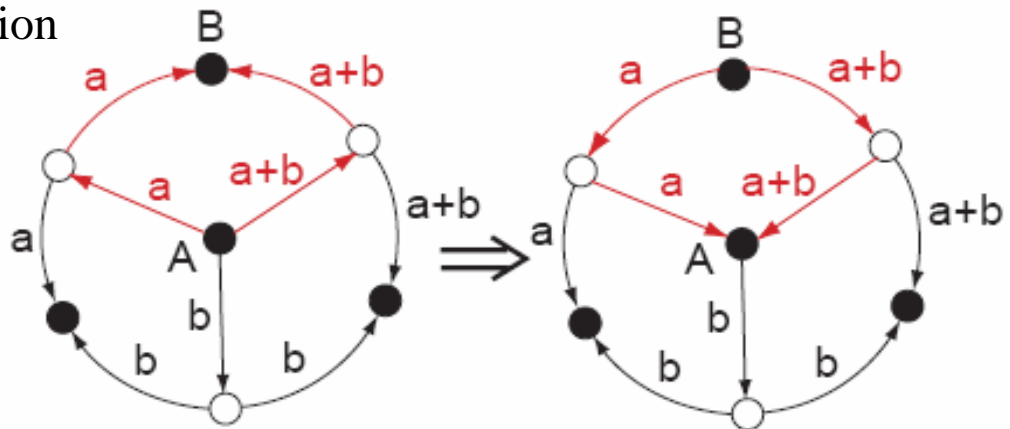


Number of nodes in the network

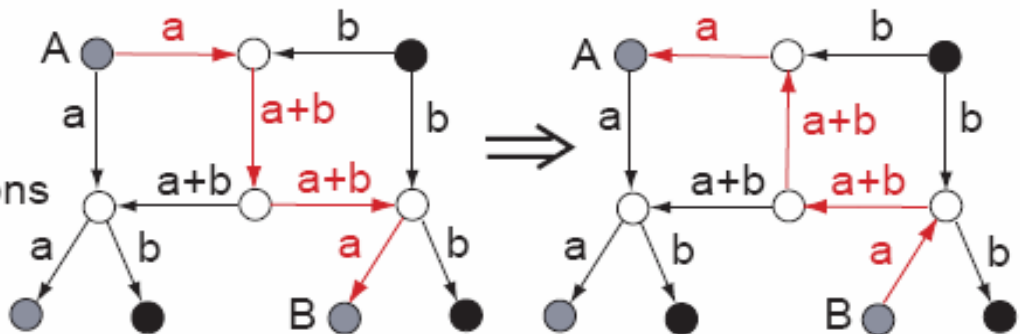
# Is the optimal throughput dependent on the selection of data sources in a session?

- For an undirected data network with one or more communication sessions, the achievable optimal throughput is completely determined by
  - Network topology
  - Irrelevant to the selection of data source
  - Link capacities
  - Set of nodes in each session
  - Inter-session fairness

(a) Source independence:  
the case of a single session



(b) Source independence:  
the case of multiple sessions



# Conclusions

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- ❑ This paper focuses on solving the problem of computing and achieving optimal throughput in data networks, in the general case of undirected links.
- ❑ The most significant benefit of network coding is not to achieve higher optimal throughput, but to make it feasible to achieve such optimality in polynomial time.
- ❑ Efficient algorithms are designed for multiple communication sessions of a variety of types, and for the more realistic model of overlay network.