

# Network Coding for Line Networks with Broadcast Channels

Gerhard Kramer\* and Sadegh Tabatabaei Yazdi\*\*

\*Technische Universität München, Germany

\*\*Corporate R&D, Qualcomm, San Diego, CA

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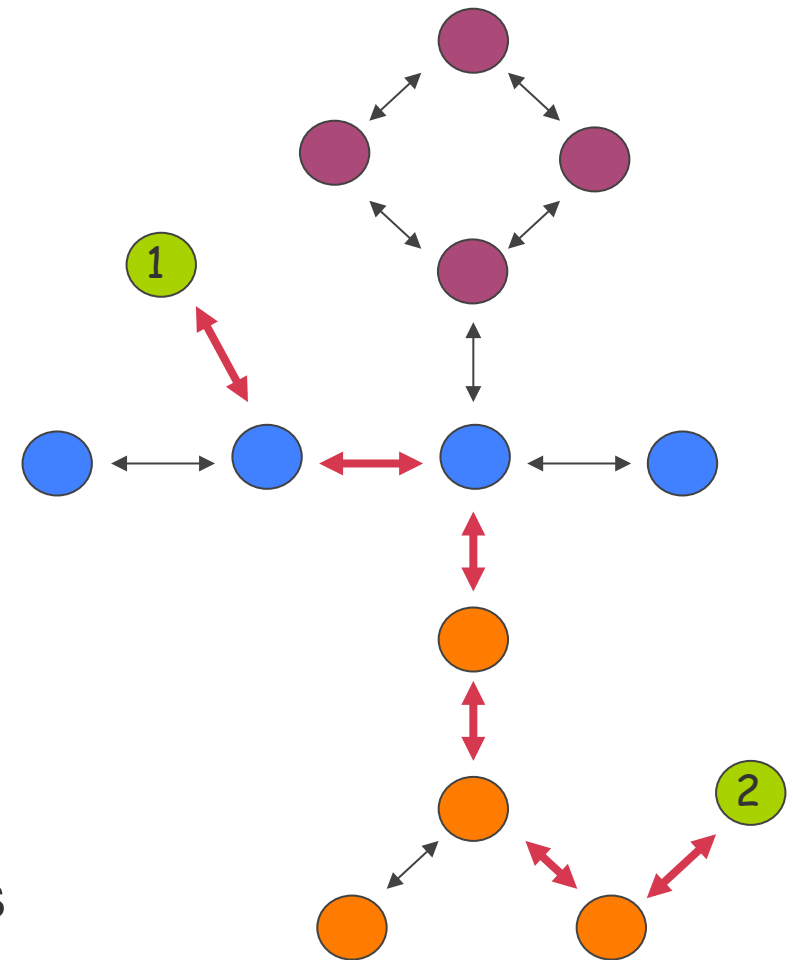
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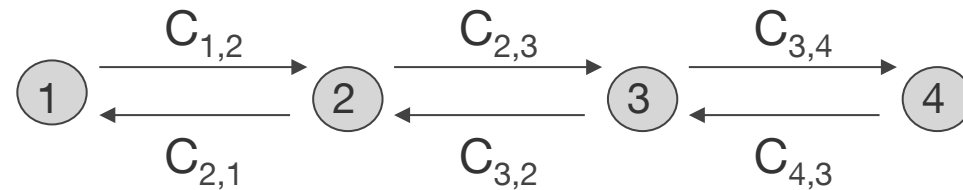
# Network Communication

- Network: represent by a graph
- Example: network of 3 networks
- **Line**, e.g., an ethernet bus
  - Single-path routing common for simplicity, control, security
- **Star**, e.g., a radio network cell
  - Hub controls and monitors
  - Scalable, can isolate failures
- **Ring**, e.g., an optical network
  - Two paths protect against failures

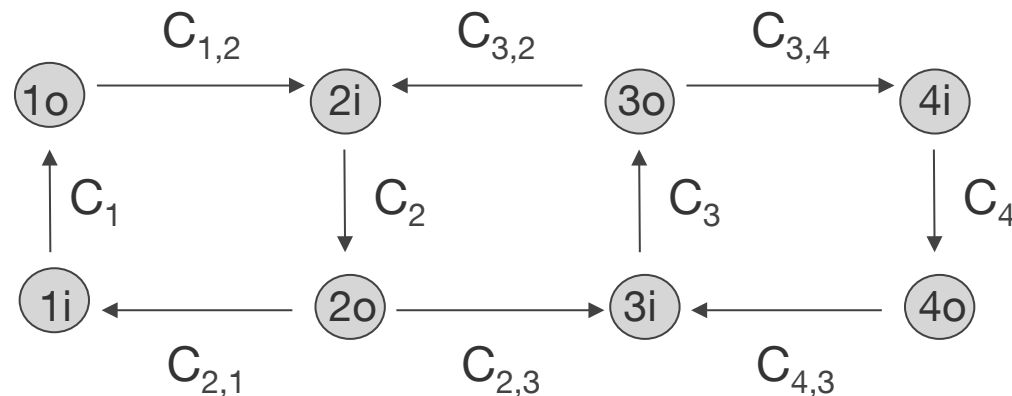


# 1) Models

- Wireline: **edge** capacity constraints  $C_{u,v}$  for **edge**  $(u,v)$

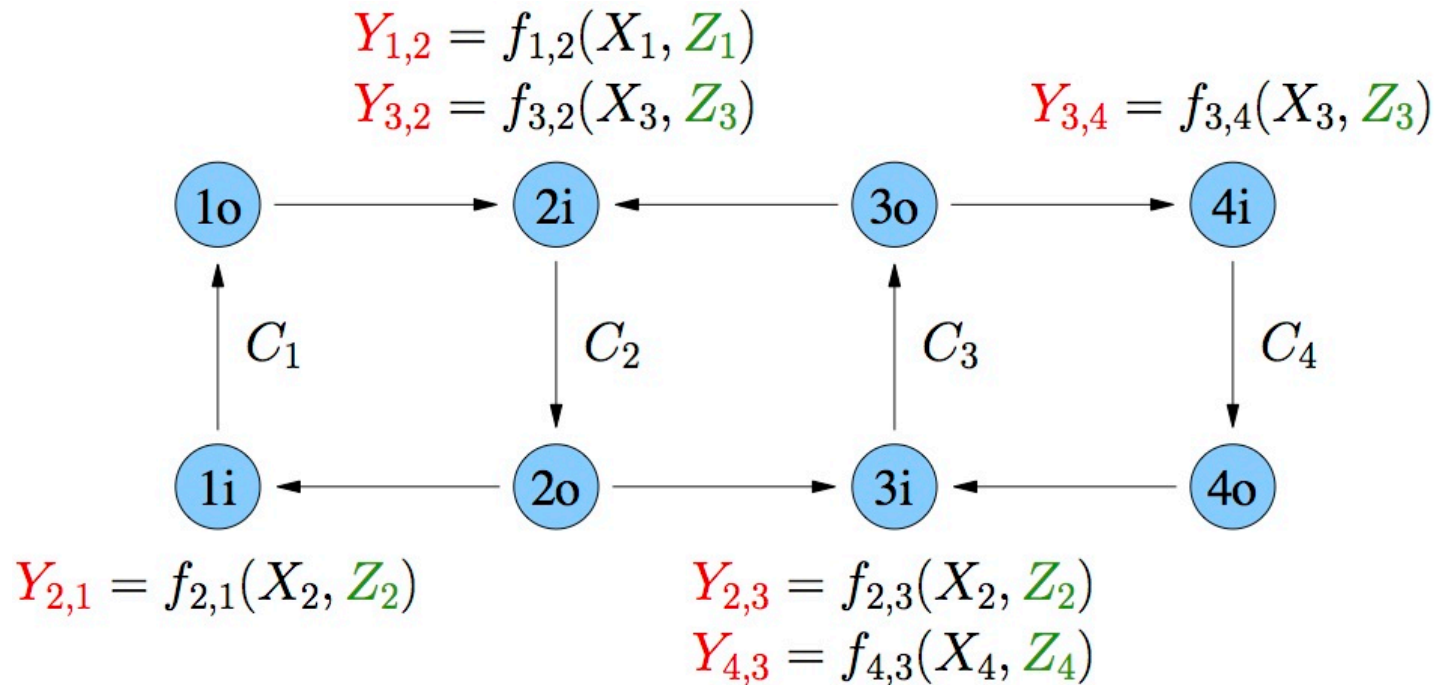


- **Nodes** can also be bottlenecks, e.g., processor energy, speed, bus bandwidth constraints. Capacity  $C_u$  for **node**  $u$



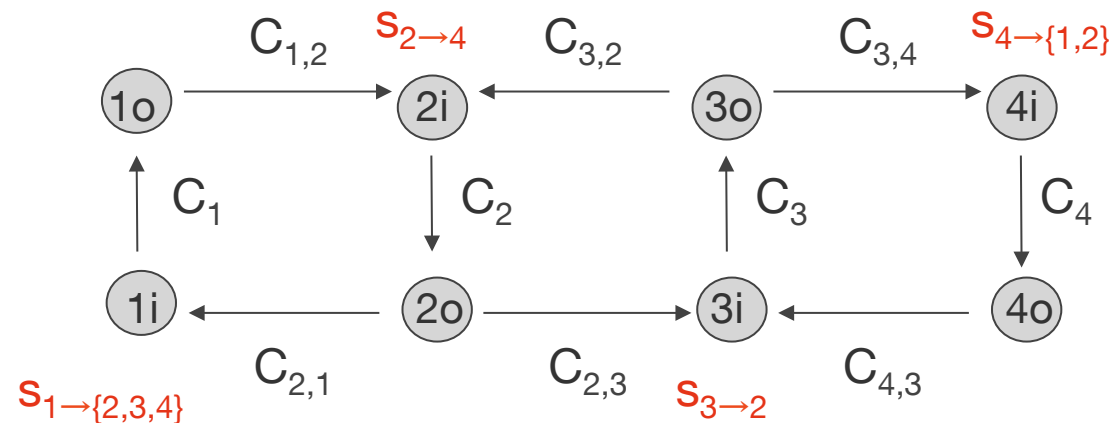
# Wireless with Broadcast Channels (BCs)

- **Broadcast constraint** via  $X_u$  rather than  $X_{u,u-1}$  and  $X_{u,u+1}$
- Time-frequency slots: no interference
- General: add **interference** via  $Y_u$  rather than  $Y_{u-1,u}$  and  $Y_{u+1,u}$



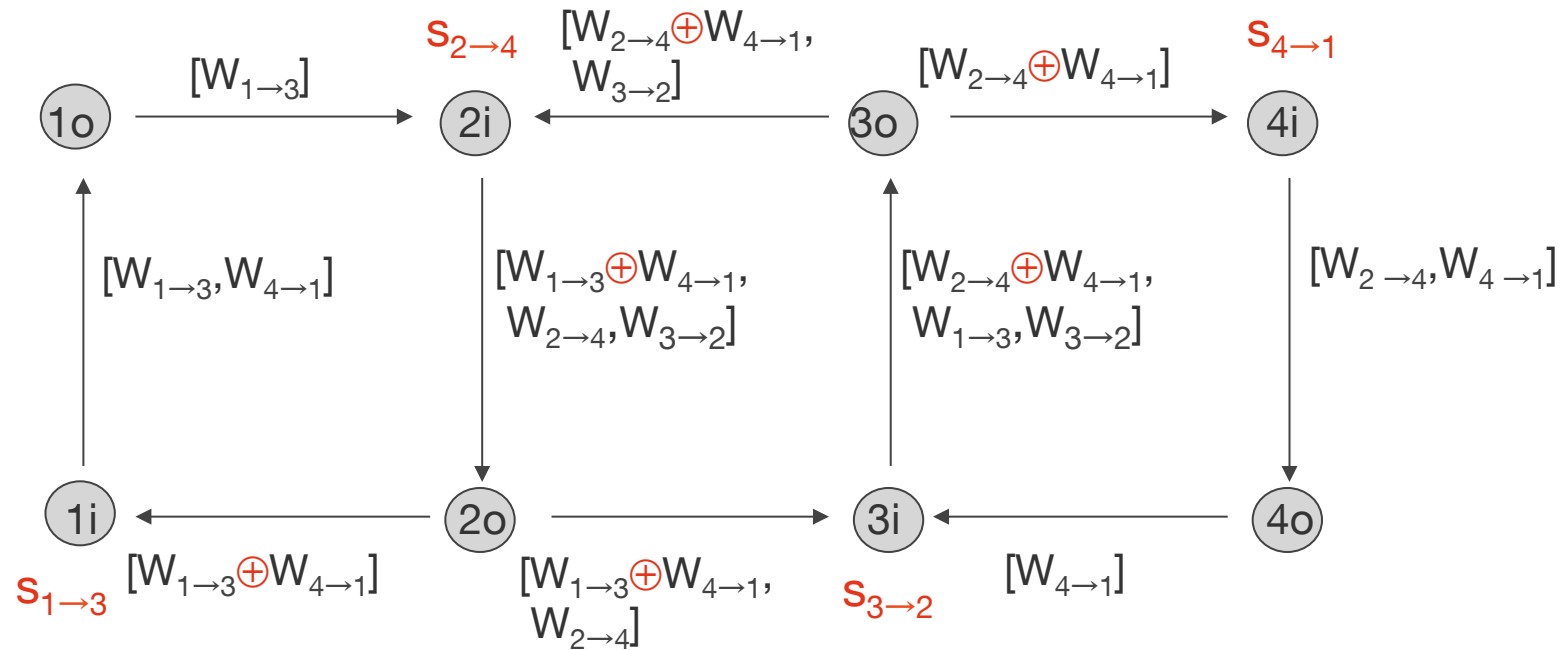
## Traffic Sessions

- Traffic Sessions:  $u \rightarrow D(u) = \{v(1), \dots, v(L)\}$ , rate  $R(u \rightarrow D(u))$ 
  - **Unicast**: up to  $n(n-1)$  sessions between node-pairs
  - Broadcast:  $n$  sessions (one node to all other nodes)
  - Multicast:  $n(2^{n-1}-1)$  sessions (one node  $u$  to a node set  $D(u)$ )
- Node constraints: can place sources & sinks at different sub-nodes for different problems



## 2) Wireline: How to Communicate?

- Network coding helps: many “butterflies”
- Guess: Routing, copying, and “butterfly” binary linear network coding is optimal. For equal-length packets:

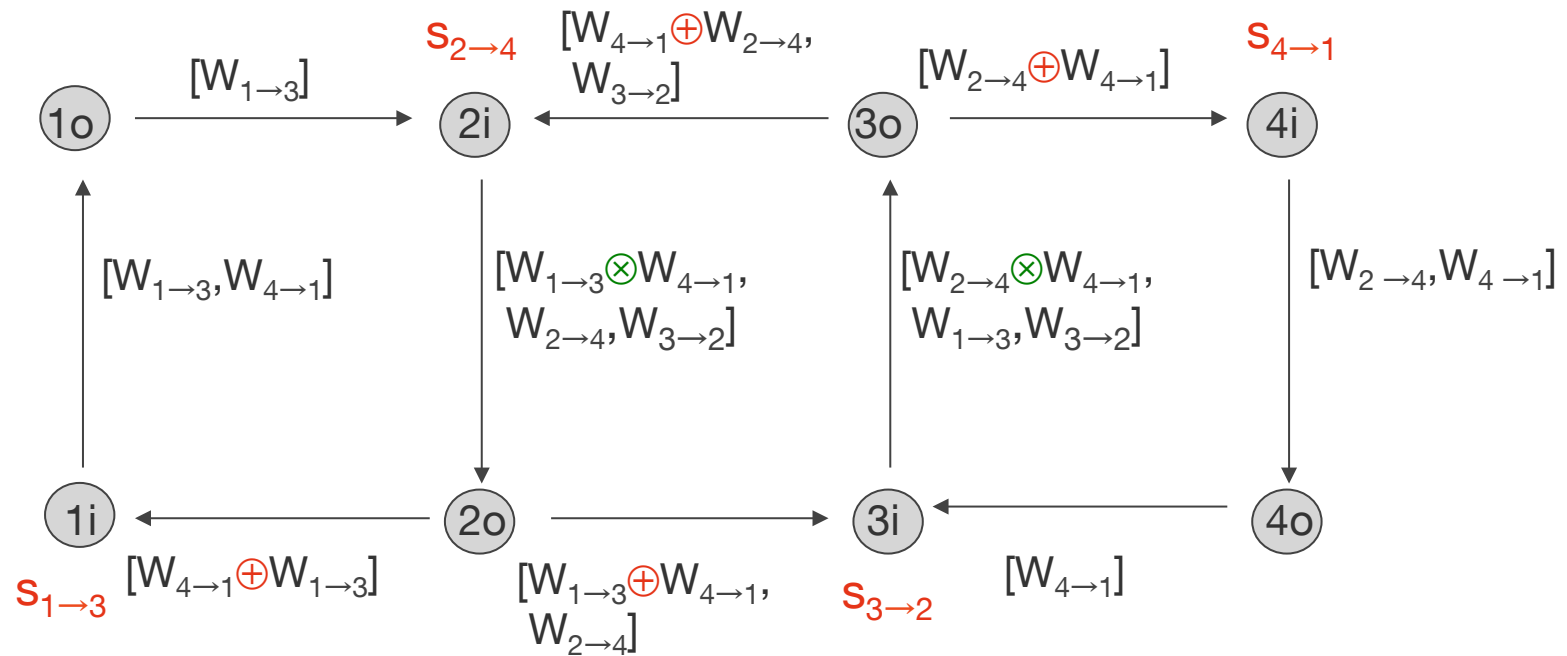


# Non-uniform Packet Lengths and Rates

■ Let:

$$A \oplus B = \begin{cases} [A_1 \oplus B_1, \dots, A_m \oplus B_m] & m \leq n \\ [A_1 \oplus B_1, \dots, A_n \oplus B_n, A_{n+1}, \dots, A_m] & m > n \end{cases}$$

$$A \otimes B = \begin{cases} [A_1 \oplus B_1, \dots, A_m \oplus B_m, B_{m+1}, \dots, B_n] & m \leq n \\ [A_1 \oplus B_1, \dots, A_n \oplus B_n, A_{n+1}, \dots, A_m] & m > n \end{cases}$$



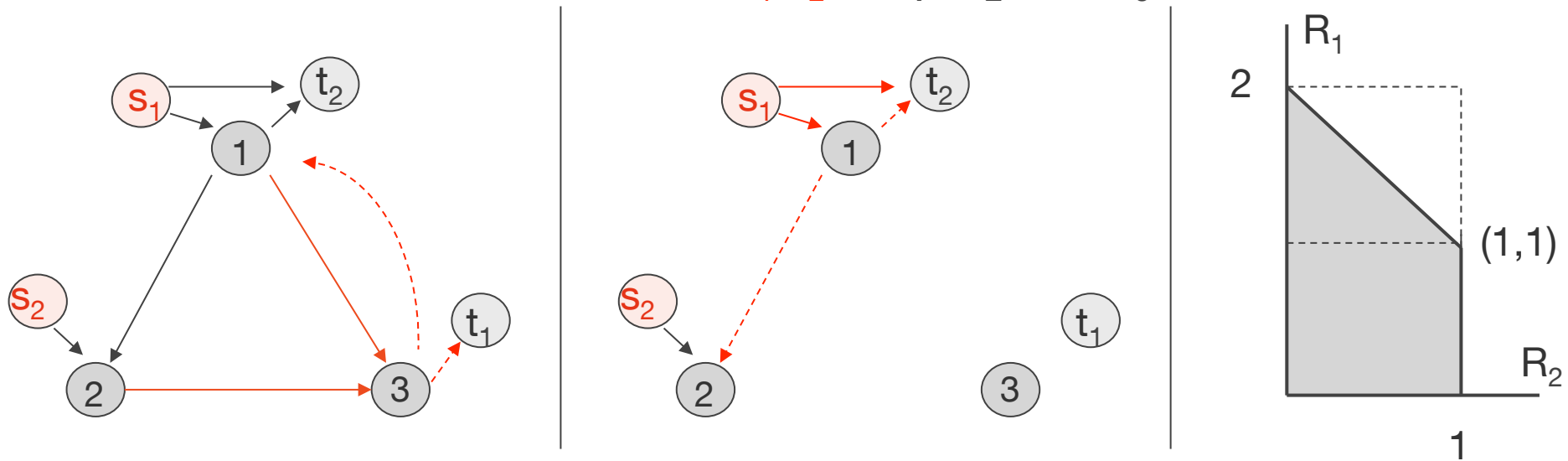
## Notes

- Method seems simple but requires careful control. Each node  $u$  treats **8 sets** of messages differently
  - 1) Left-to-right (LR) messages through node  $u$
  - 2) Right-to-left (RL) messages through node  $u$
  - 3) Left-to-right (LR $u$ ) messages also destined for  $u$
  - 4) Right-to-left (RL $u$ ) messages also destined for  $u$
  - 5) L-to-R and R-to-L messages “stopping” at node  $u$  ( $u$ )
  - 6) Node  $u$  messages going to left and right ( $u,LR$ )
  - 7) Node  $u$  messages going to right ( $u,R$ )
  - 8) Node  $u$  messages going to left ( $u,L$ )
  
- Converse:
  - Classic cut bounds insufficient
  - **Progressive edge-cut** bounds give the capacity (and include classic cut bounds)



### 3) Progressive Edge Cuts (Kramer-Savari '06)

- Consider a general edge set  $E$  and session set  $S$
- Initialize: remove (1) edges in  $E$ ; (2) edges of sources not in  $S$ ; (3) edges out of nodes directed-sense<sup>1</sup> disconnected from  $S$
- Repeat: test if an  $s$  in  $S$  is undirected-sense<sup>2</sup> disconnected from any of its sinks. If so, remove  $s$  and then edges out of nodes directed-sense<sup>1</sup> disconnected from the remaining sources.
- Successful removal of all sources:  $\sum_{k \in S} R_k \leq \sum_{e \in E} C_e$
- Example:  $E = \{(1,3), (2,3)\}$  and  $S = \{s_1, s_2\}$ :  $R_1 + R_2 \leq 2$  if  $C_e = 1$  for all  $e$



## Line Network Rate Constraints

- **Edges:** get basic routing rates (cf. classic cut-set bound)

$$\sum_{i=1..u} \sum_{D(i) \text{ with a node in } \{u+1..n\}} R(i \rightarrow D(i)) \leq C_{u,u+1} \quad (L \rightarrow R)$$

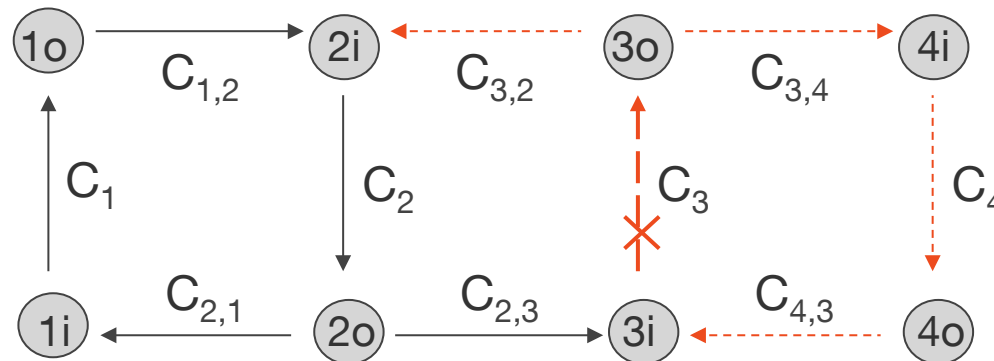
$$\sum_{i=u..n} \sum_{D(i) \text{ with a node in } \{1..u-1\}} R(i \rightarrow D(i)) \leq C_{u,u-1} \quad (R \rightarrow L)$$

- **Nodes:** node  $u$  incoming and outgoing rates plus **max**( $L \rightarrow R$  rates,  $R \rightarrow L$  rates) (see graph on p. 8):

$$\begin{aligned} & \sum_{D(u)} R(u \rightarrow D(u)) + \sum_v \sum_{\text{Traffic stops at } u} R(v \rightarrow D(v)) \\ & + \max\left( \sum_{i=1..u-1} \sum_{D(i) \text{ with a node in } \{u+1..n\}} R(i \rightarrow D(i)), \right. \\ & \quad \left. \sum_{i=u+1..n} \sum_{D(i) \text{ with a node in } \{1..u-1\}} R(i \rightarrow D(i)) \right) \leq C_u \end{aligned}$$

## Application of Edge Cuts to Lines

- Bound for node  $u$ : choose  $E = \{(u_i, u_o)\}$  and  $S = \{L \rightarrow R \text{ sources across } u\} \cup \{u \text{ incoming and outgoing sources}\}$
- Example:  $u=3$  with  $E = \{(3_i, 3_o)\}$ 
  - Remove  $(3_i, 3_o)$ ;  $s$  right of node 3 and  $s$  left of node 3 having sinks left of node 3 only; edges right of  $u$  and  $(3_o, 2_i)$
  - Can remove all sources including node 3 outgoing sources
  - Gives new (non-classic)  $L \rightarrow R$  bounds; similarly get new  $R \rightarrow L$  bounds; these bounds, combined with the classic cut bounds, define the **multiple-multicast capacity region**



## 4) What about Wireless?

- **Problem:** capacity of BCs **with feedback** is unknown
- Partial resolution: capacity **is** known for some cases
  - orthogonal channels
  - deterministic channels
  - physically degraded channels, including physically degraded Gaussian BCs [El Gamal, 1978)
- Do the coding/converse methods extend to our networks?
- Answer: **yes!** See our paper “Network coding for line networks with broadcast channels,” Entropy, vol. 14, 2012
- Paper gives a **general achievable** region, and **converses** for the above cases and for packet erasure channels

## Notes: the **Progressive Edge Cut Tool**

- Includes classic cuts as special cases
- Applies to network coding (a classic **edge**-cut bound does **not**)
- Generalizes naturally to **wireless** networks to include **any** coding
- **Wireless** example below: using  $E=\{(1,3),(2,3)\}$  and  $S=\{1,2\}$  gives

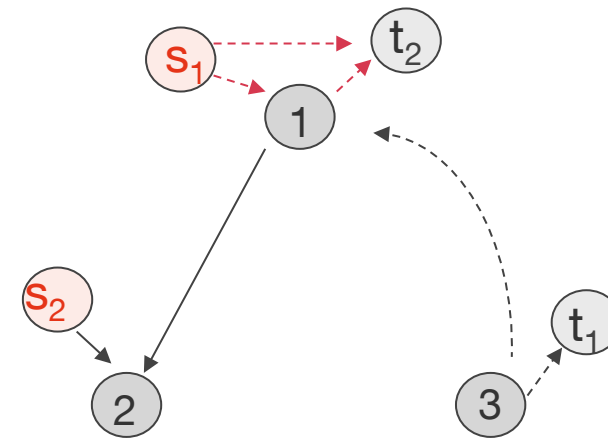
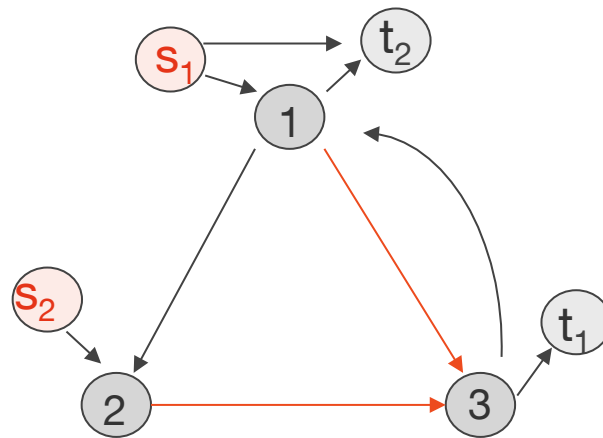
$$R_1 \leq \min[I(X_1; Y_2 Y_3 | X_2 X_3), I(X_1 X_2; Y_3 | X_3)]$$

$$R_2 \leq \min[I(X_3; Y_1 | X_1), I(X_2; Y_3 | X_1 X_3)]$$

$$R_1 + R_2 \leq I(X_1 X_2; Y_3 | X_3)$$

} Classic cuts

← Progressive cut



# Summary

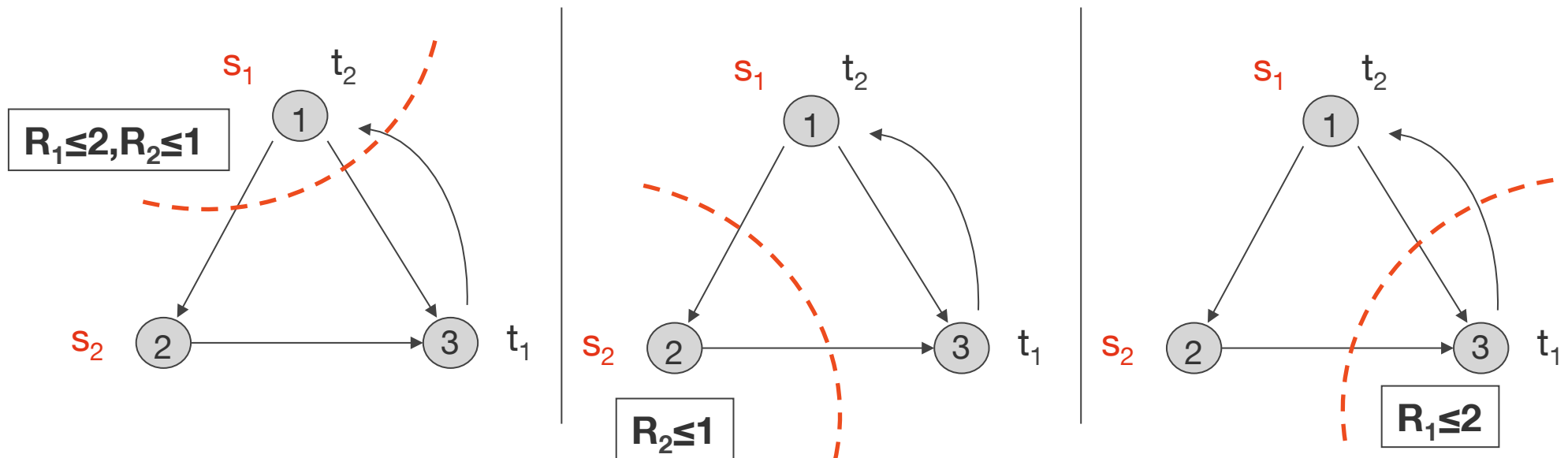
## Line Networks:

- even **wireline** problems require careful coding and have sophisticated capacity regions;
- ideas extend to certain **broadcasting** scenarios;
- for general BCs: we first need the capacities of BCs **with (generalized) feedback**;
- including **interference** will be even tougher!

# Extra Slides

# Classic Cut-Set Bound

- Partition **nodes** into two sets  $N$  and  $N^C$
- Let  $S$  be the set of sessions originating in  $N$  with a sink in  $N^C$
- Cut  $E$  is the set of edges starting in  $N$  and ending in  $N^C$
- Classic cut bound:  $\sum_{k \in S} R_k \leq \sum_{e \in E} C_e$
- Example: ring with 2 unicast sessions and unit-edge capacities.  
We have:  $R_1 \leq 2, R_2 \leq 1$





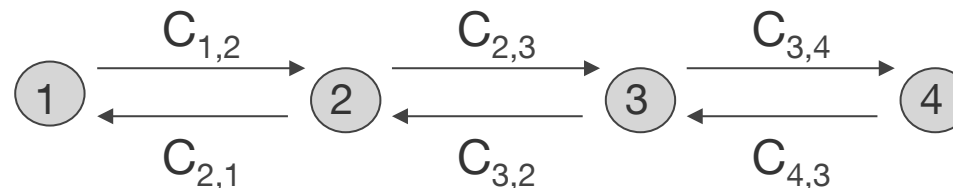
## Line Networks with Edge Constraints Only

- Routing: bounds for  $(u,u+1)$  and  $(u+1,u)$ :

$$\sum_{i=1..u} \sum_{D(i) \text{ with a node in } \{u+1..n\}} R(i \rightarrow D(i)) \leq C_{u,u+1} \quad (L \rightarrow R)$$

$$\sum_{i=u+1..n} \sum_{D(i) \text{ with a node in } \{1..u\}} R(i \rightarrow D(i)) \leq C_{u+1,u} \quad (R \rightarrow L)$$

- Classic cut-set bound
  - For cut  $\{(u,u+1)\}$  is just  $(L \rightarrow R)$
  - For cut  $\{(u+1,u)\}$  is just  $(R \rightarrow L)$
- So routing (+ copying for multicast) is rate-optimal



# fd-Separation (Kramer '98)

- Let  $\underline{A}$ ,  $\underline{B}$  and  $\underline{C}$  be vectors whose entries are RVs (vertices) of a FDG
- Success after the following implies  $I(\underline{A} ; \underline{B} \mid \underline{C}) = 0$  (cf. Pearl 1988)
  - Consider only vertices and edges met when moving backward from the vertices in  $\underline{A}$ ,  $\underline{B}$ , or  $\underline{C}$  (“causality”)
  - Remove the outgoing edges of vertices disconnected from the sources in a **directed** sense
  - Check if there is no **undirected** path from “ $\underline{A}$ ” to “ $\underline{B}$ ”

- Ex:  $I(W_1 ; \hat{W}_1 \mid \underline{Y}_{2,3} \underline{Y}_{1,3} \underline{Z}_{3,1}) = 0$

$$I(W_2 ; \hat{W}_2 \mid \underline{Y}_{2,3} \underline{Y}_{1,3} \underline{Z}_{3,1} W_1) = 0$$

