

# On Networks of Two-Way Channels

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## ■ Outline

1. Network model
2. Cut set bounds
3. Implications for network coding
4. Disconnecting set bounds

# 1. Network Model

## ■ Network

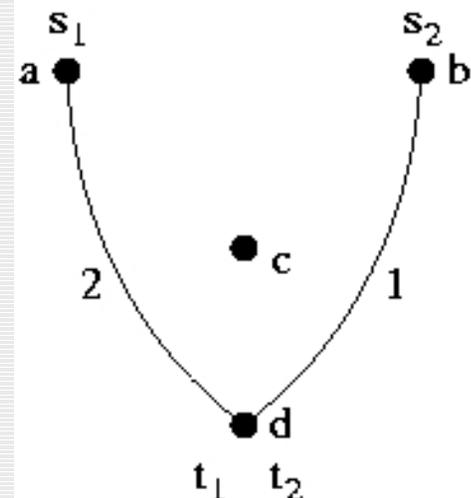
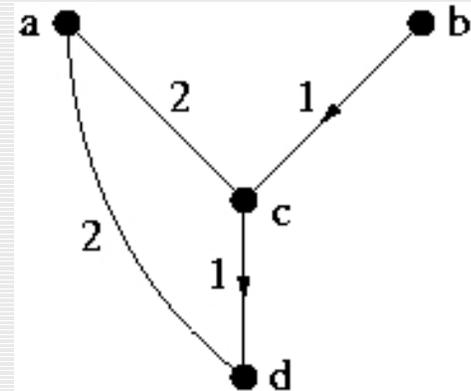
- graph  $G=(V,E)$
- vertices  $V$ : “terminals”
- edges  $E$ : “channels”

## ■ Channels:

- directed/undirected
- capacity restrictions

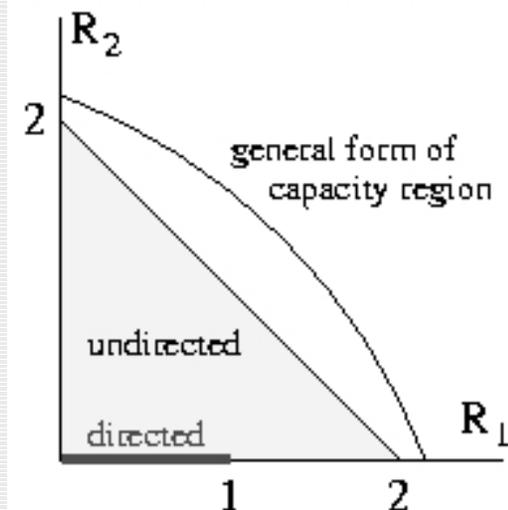
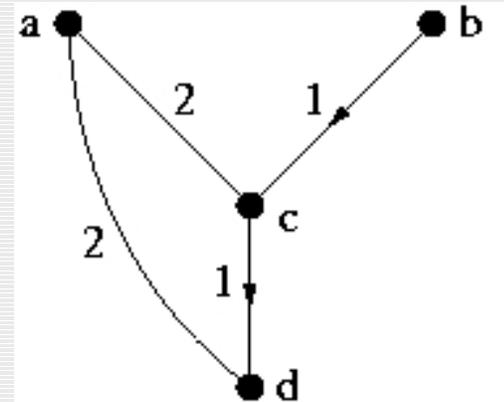
## ■ Demand (sources and destinations)

- multi-commodity flow
- multi-casting



# Communication Networks

- Edges: cables, wireless channels, etc.
  - two-way channels (TWCs)  
edge  $bc$ :  $P(y_b, y_c | x_b, x_c)$
- Capacity Region
  - the set of rate pairs  $(R_1, R_2)$  achievable with coding
  - convex if time-sharing permitted
  - consider  $\epsilon$ -error capacity region
- Network capacity:  
what can the vertices can do?



# Networks of TWCs

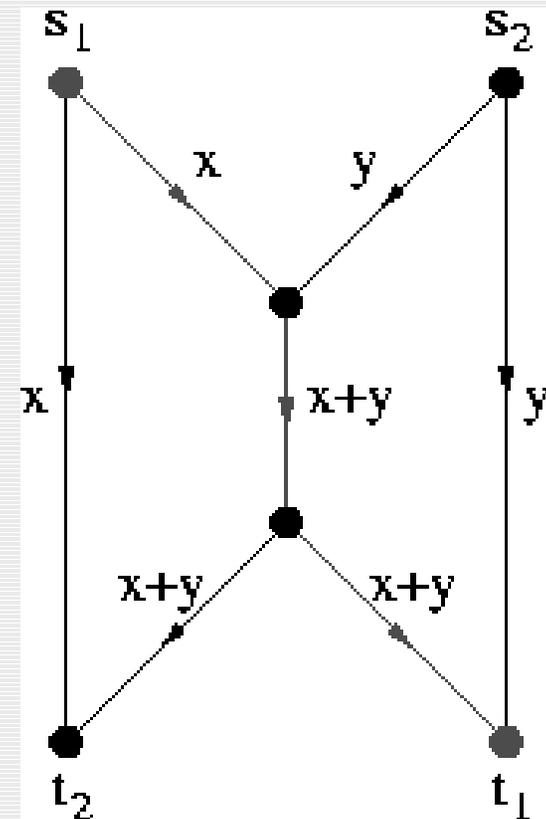
## ■ Model:

- messages  $W_1, \dots, W_M$  available at  $s_1, \dots, s_L$ , where  $L \leq M$
- network is clocked, i.e., a universal clock ticks  $N$  times
- vertex  $v$  can transmit one symbol into its TWCs after clock tick  $n$  and before clock tick  $n+1$  for all  $n = 1, 2, \dots, N$
- symbols are received at clock tick  $n+1$  for all  $n$
- flow or routing: vertices can collect, store and forward symbols (including local message symbols)
- here: network coding is allowed, i.e., for all clock ticks  $n$ , vertex  $v$  transmits (let  $W_{M(v)}$  be the set of messages at  $v$ )

$$X_v[n] = f_n(W_{M(v)}, Y_v[1, 2, \dots, n-1])$$

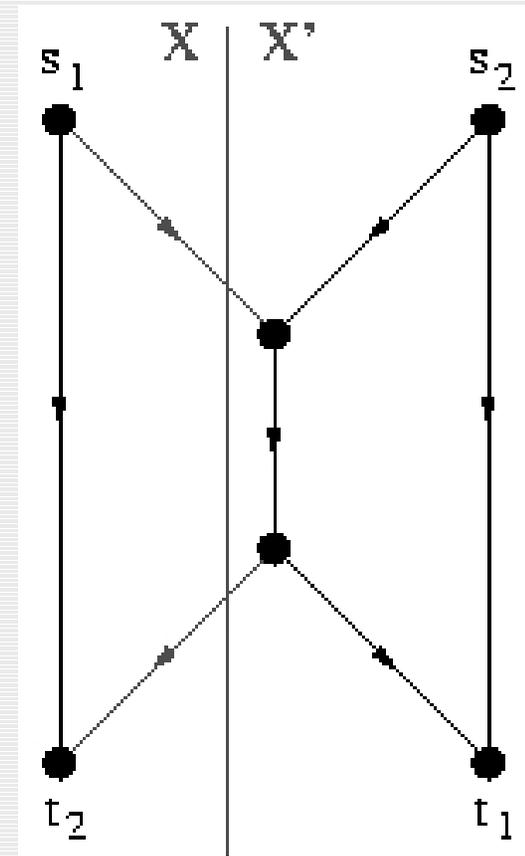
# Network Coding Gains

- A standard example (Ahlsweede, Cai, Li, Yeung, 2000):
  - a two-flow problem with directed, unit capacity edges
  - max flow: 1
  - max coded sum rate: 2  
can even decode both messages at both nodes
  - avg. resources used:  
flow: 3 edges/clock tick  
coding: 7 edges/clock tick



## 2. Cut Set Bounds

- Cut set  $E'$ : edges that disconnect each of a set of sources from (one of) its sinks, and that divide  $V$  into  $(X, X')$
- $R_X$ : sum of rates of flows starting in  $X$  with a sink in  $X'$
- $C_{X \rightarrow X'}$ : sum of capacities of edges in  $E'$  going from  $X$  to  $X'$
- $C_X$ : sum of capacities of edges in  $E'$
- Bounds:  $R_X \leq C_{X \rightarrow X'}$   
 $R_X + R_{X'} \leq C_X$



# Information Theory (IT) Cut Set Bound

- Cut set: same as above
- Need bound to apply to network coding
- Optimization of a standard IT cut set bound:
  - 1) convert every edge (TWC) into a pair of directed edges (one-way channels) whose rate pair is a boundary point of the capacity region of this edge
  - 2) apply the flow cut set bound
  - 3) repeat 1) and 2) for all boundary points on all edges
- IT cut set bound implies the above flow cut set bound

# Example 1: undirected edges

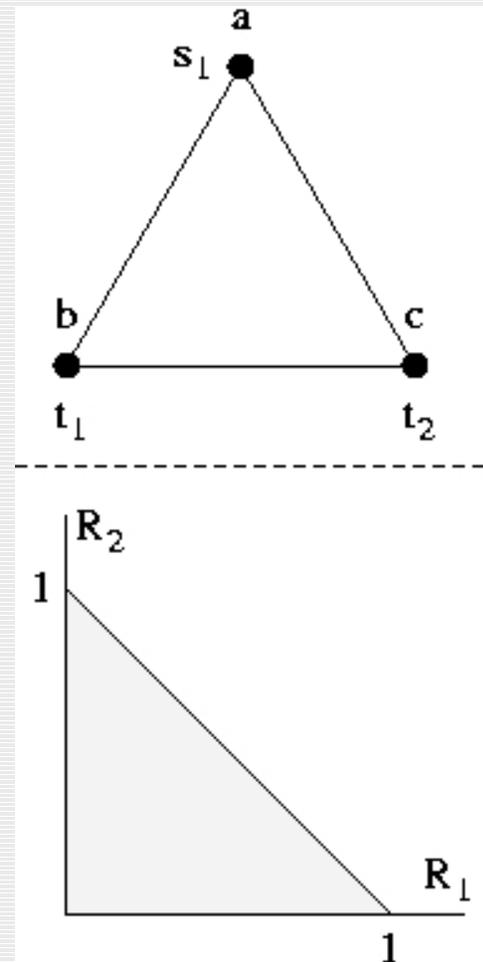
- unit capacity, undirected edges, multi-casting with two sinks
- flow cut set bound:  $R \leq 2$
- IT cut set bound:  $0 \leq R_{ij}, R_{ij} + R_{ji} \leq 1$

$$R \leq R_{ab} + R_{ac}, R_{ab} + R_{cb}, R_{ac} + R_{bc}$$

The last two bounds give

$$2R \leq R_{ab} + R_{ac} + 1 \leq 3$$

- IT bound is stronger and tight
- rings with 1 source and  $K$  separate sinks:  $R = (K+1)/K$  is best



## Example 2: symmetric TWCs

- suppose capacity regions are the set of  $(R_1, R_2)$  satisfying

$$0 \leq R_1^2 + R_2^2 \leq 1$$

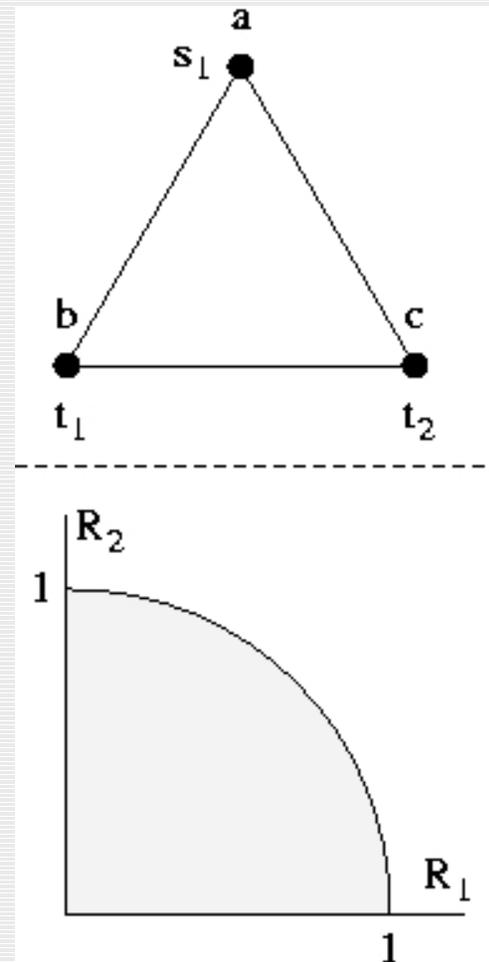
- flow cut set bound:  $R \leq 2$
- IT cut set bound:  $R_{ij}^2 + R_{ji}^2 = 1$

$$R \leq R_{ab} + R_{ac}, R_{ab} + R_{cb}, R_{ac} + R_{bc}$$

The last two bounds give

$$2R \leq R_{ab} + R_{ac} + (R_{cb} + R_{bc}) \leq 2 + 2^{1/2}$$

- IT bound is again stronger and tight



## Example 3: bidirected edges

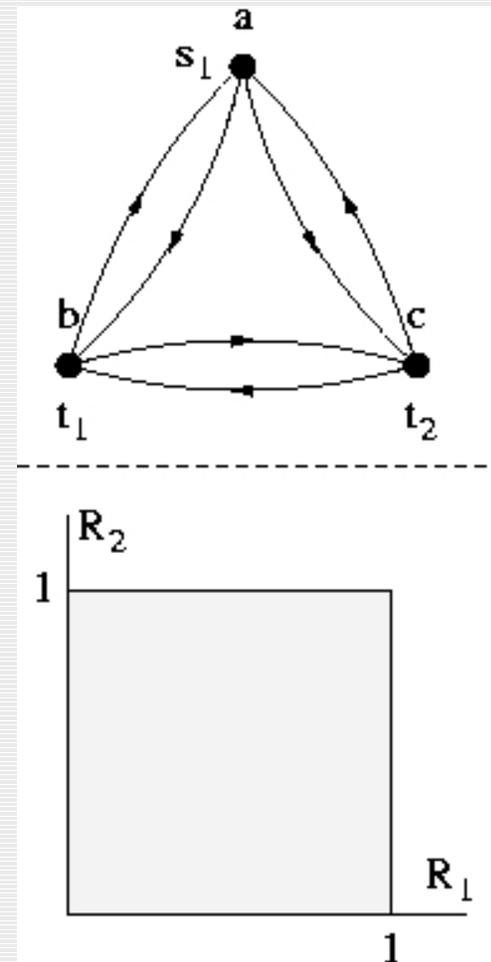
- suppose capacity region is the set of  $(R_1, R_2)$  satisfying

$$0 \leq R_1 \leq 1, 0 \leq R_2 \leq 1$$

- flow cut set bound:  $R \leq 2$
- IT cut set bound:  $R_{ij}=1, R_{ji}=1$

$$R \leq 2$$

- Flow and IT cut set bounds are the same for networks with directed edges
- multi-casting capacity is known for directed graphs (Koetter, Médard 2003)

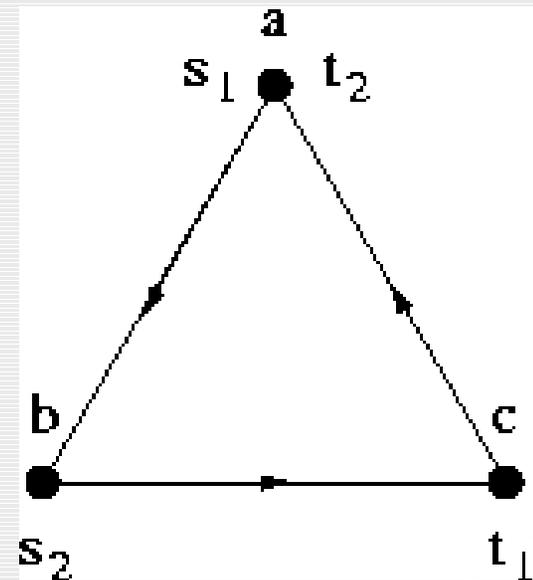


### 3. Implications for Network Coding

- If max-flow=flow-min-cut, routing is optimal
  - single commodity flow (Ford-Fulkerson, 1956)
  - two commodities in an undirected graph (Hu, 1963)
    - not true more generally (see standard example)
  - undirected planar graphs, multi-commodity flow, sources and sinks on boundary of infinite region (Okamura, Seymour, 1981)
- Flow/routing questions:
  - when is max-flow=IT-min-cut for undirected networks?
  - when is max-flow=IT-min-cut for mixed networks?
  - do there exist, e.g., disconnecting set bounds for coding?

## 4. A Disconnecting Set Bound

- Example: directed triangle
  - unit capacity edges
  - two commodities
  - max-flow is 1
- Disconnecting set: edge  $bc$ 
  - IT cut set bound permits sum rate of 2!
  - Is this rate achievable with coding?

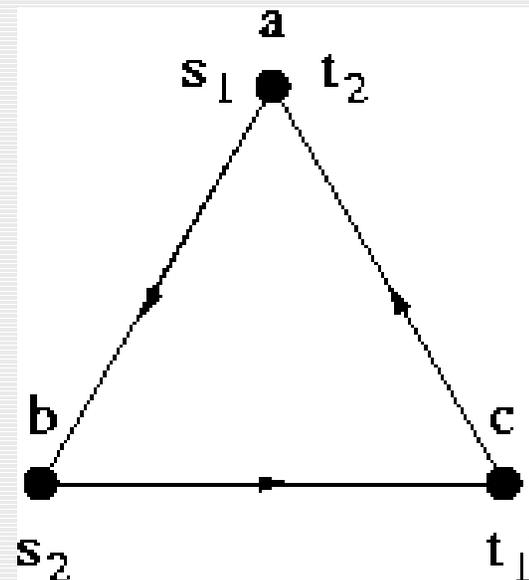


# An improved IT bound

- We have the IT inequalities:

$$\begin{aligned} N(R_1+R_2) &\leq I(W_1; \underline{X}_{bc}) + I(W_2; \underline{X}_{ca} | W_1) \\ &= I(W_1; \underline{X}_{bc}) + I(W_2; \underline{X}_{ca} | W_1) \\ &\leq I(W_1; \underline{X}_{bc}) + I(W_2; \underline{X}_{bc} | W_1) \\ &= I(W_1 W_2; \underline{X}_{bc}) \\ &\leq H(\underline{X}_{bc}) \leq N \end{aligned}$$

- A simple disconnecting set bound.  
Can one generalize it?  
Yes, but in a limited way.



# Summary and Some Open Problems

## ■ Summary

- model: network of TWCs
- IT cut set bound needed for network coding

## ■ Open Problems

- what can flow/routing achieve for TWC edges?
- when is max flow=flow-min-cut for TWC edges?
- when is max flow=IT-min-cut (even for basic TWCs)?
- what kinds of network codes are needed for general TWC capacity regions? Linear/nonlinear?
- does a symmetric TWC capacity region simplify things?