



# **NETWORK CODING**

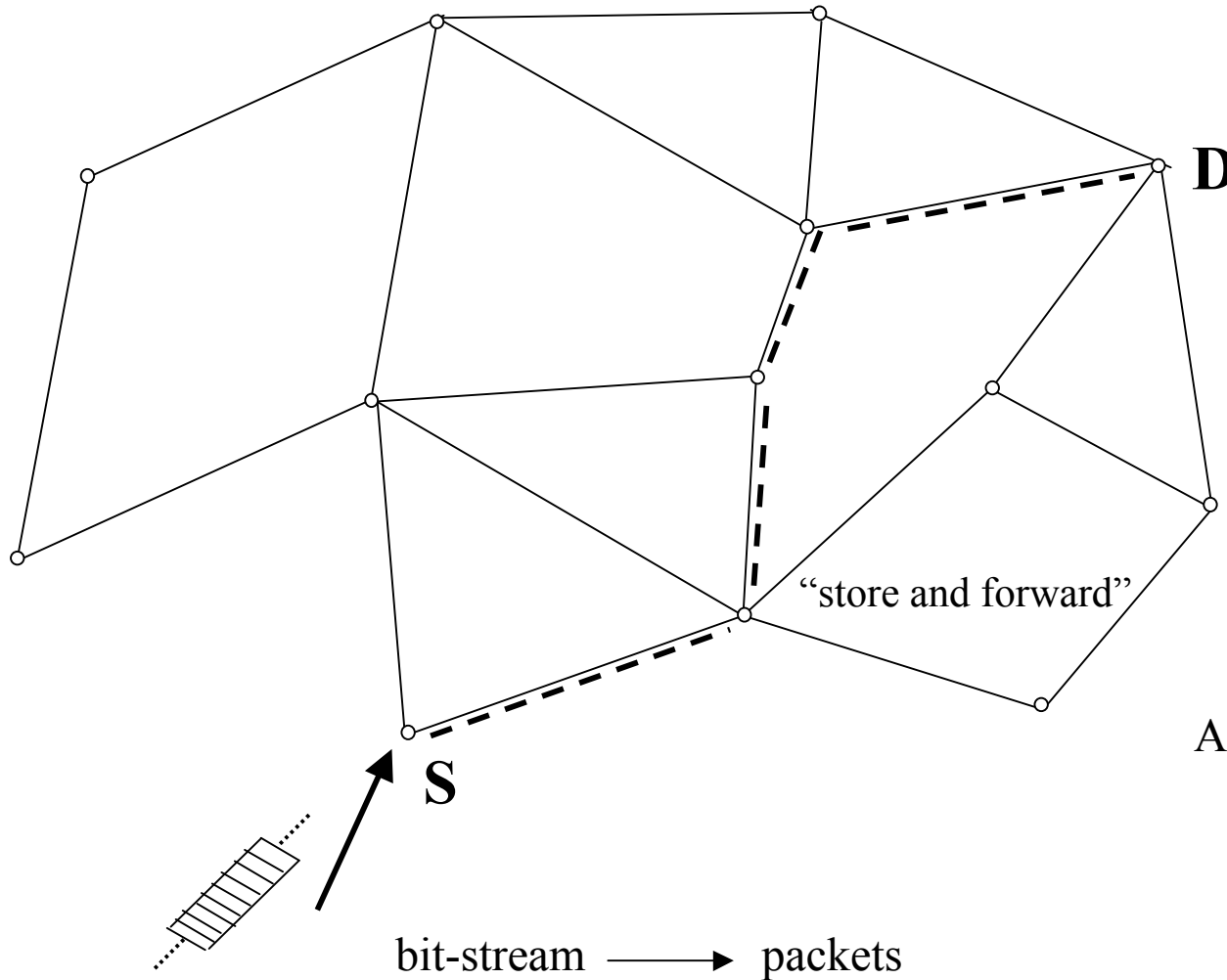
**- A NEW PARADIGM FOR NETWORKING -**

**February 29, 2008**  
**University of Minnesota**

**Anthony Ephremides**  
**University of Maryland**

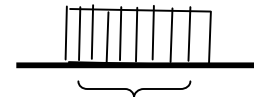


# THE CURRENT PARADIGM



packet "length" =  $N$  or  $T$

$N$  = # of bits



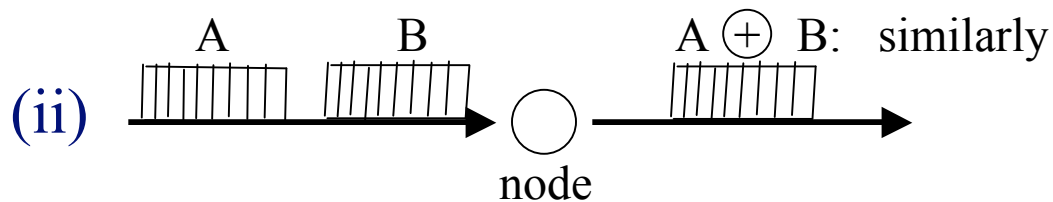
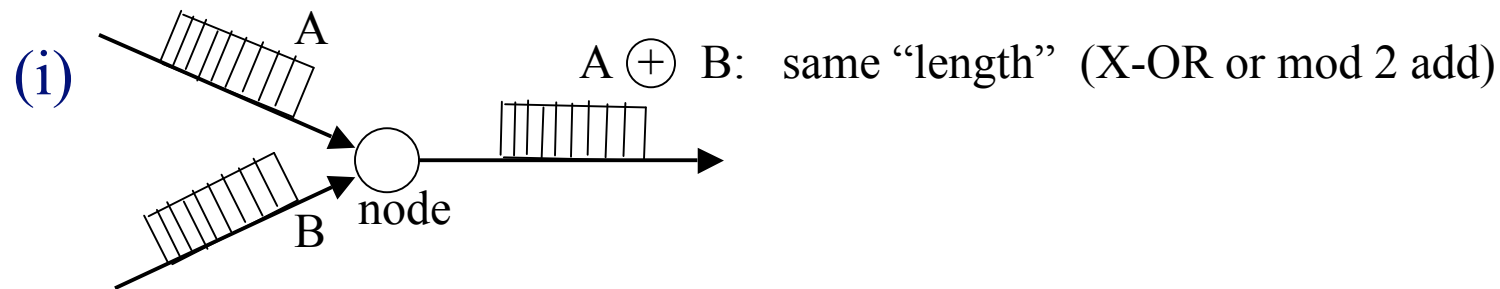
$T$  = duration

A "packet" is a "monolith."



# WHAT IS WRONG WITH IT?

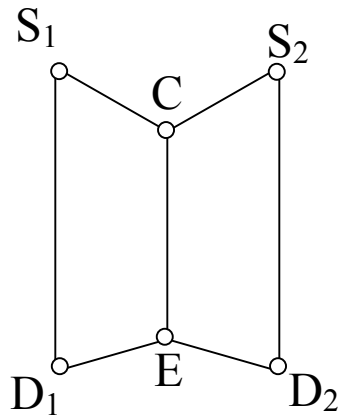
- “ORIGINAL SIN” of networking : Layering
- Physical layer was forgotten (or “Separated”)
- Recall: packets consist of bits (a simple and obvious truth)
- Bits can be operated upon



- Why may this be good?
- Because it permits the output to be a function of the input!



# THE “BUTTERFLY” EXAMPLE (~1999)



- S<sub>1</sub> wants to deliver packet A to both D<sub>1</sub> and D<sub>2</sub>
- S<sub>2</sub> wants to deliver packet B to both D<sub>1</sub> and D<sub>2</sub>
- Each link can carry one packet in each slot  
(capacity of each link = 1)

**Q: How many slots are needed to complete this delivery under “store-and-forward”?**

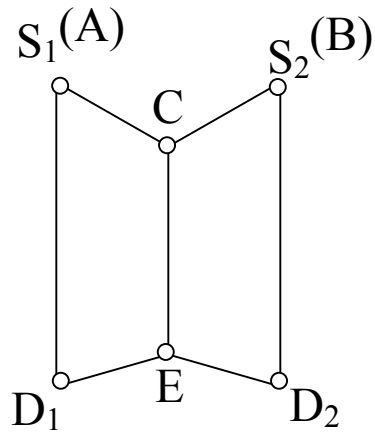
- 1: - S<sub>1</sub> sends A to C and D<sub>1</sub> (over S<sub>1</sub>C and S<sub>1</sub>D<sub>1</sub> respectively)  
- S<sub>2</sub> sends B to C and D<sub>2</sub> (over S<sub>2</sub>C and S<sub>2</sub>D<sub>2</sub> respectively)
- 2: - C sends A to E
- 3: - C sends B to E  
- E sends A to D<sub>2</sub>
- 4: - E sends B to D<sub>1</sub>

**Answer: FOUR (4) SLOTS**



# ALTERNATIVE

Q: How many slots are needed to complete the same delivery under, so called, “NETWORK CODING”?



1. - S<sub>1</sub> sends A to C and D<sub>1</sub> (over S<sub>1</sub>C and S<sub>1</sub>D<sub>1</sub>, respectively)  
- S<sub>2</sub> sends B to C and D<sub>2</sub> (over S<sub>2</sub>C and S<sub>2</sub>D<sub>2</sub>, respectively)
2. - C sends  $A \oplus B$  to E
3. - E sends  $A \oplus B$  to D<sub>1</sub> and D<sub>2</sub> (over ED<sub>1</sub>, and ED<sub>2</sub>, respectively)

(D<sub>1</sub> and D<sub>2</sub> recover the missing packet by “X-OR” ing  $A \oplus B$  with the one they already have)

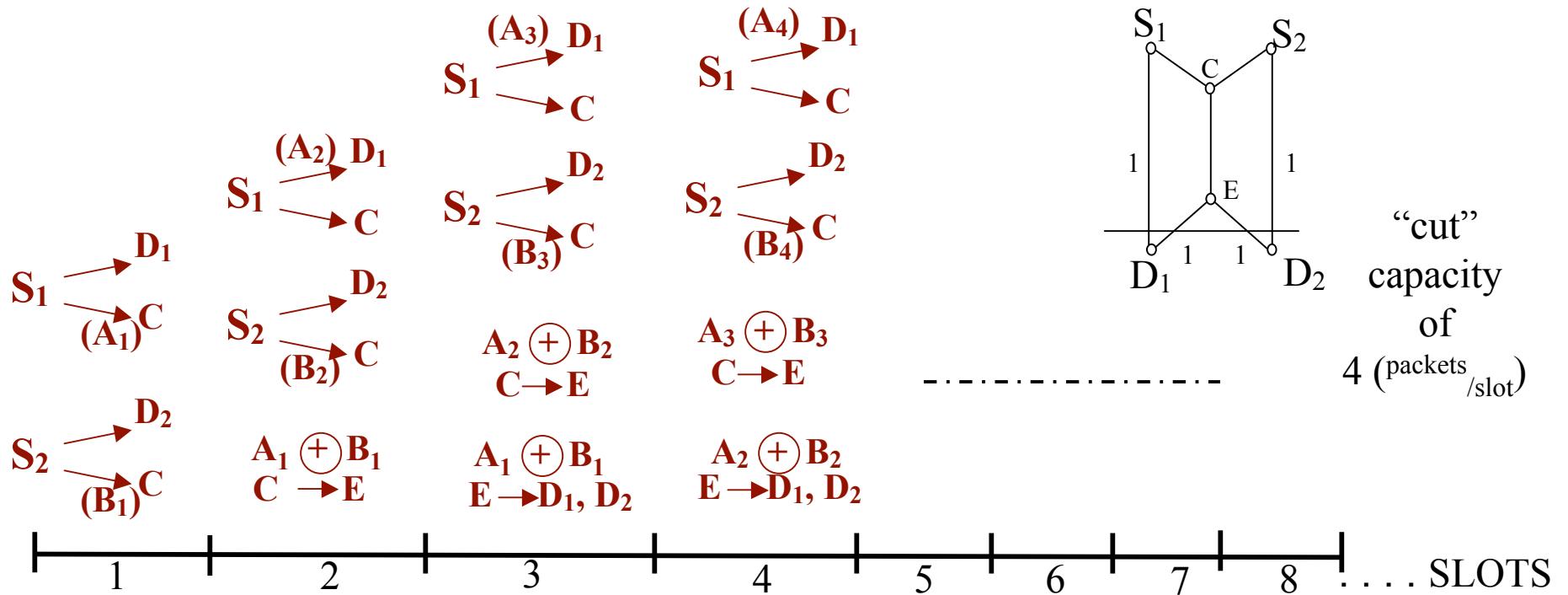
**Answer: THREE (3) SLOTS**

**Savings: 25%**

Note: THIS WAS “MULTICASTING” (i.e., each packet had multiple destinations)



# SUSTAINED OPERATION (“Capacity”-Achieving)



In steady-state, in each slot there are two packets received by each destination, e.g.

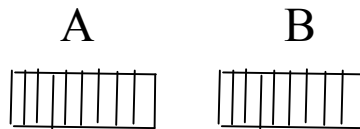
Slot 3: $D_1$ receives $A_3$ and $B_1$	}	i.e. 4 packets/slot
$D_2$ receives $B_3$ and $A_1$		
Slot 4: $D_1$ receives $A_4$ and $B_2$		
$D_2$ receives $B_4$ and $A_2$		



# THIS IS NOT ALL THERE IS

- Max-flow Limit can be achieved by network coding in “arbitrary” multicast networks
- “ALPHABET” size: each symbol in the packet need not be a single bit, but, rather, one of  $Q$  different values (strings of bits)

**REMARKABLE RESULT:** It is sufficient to combine packets linearly with randomly chosen coefficients to achieve this capacity result



A = 00110100

B = 10100010

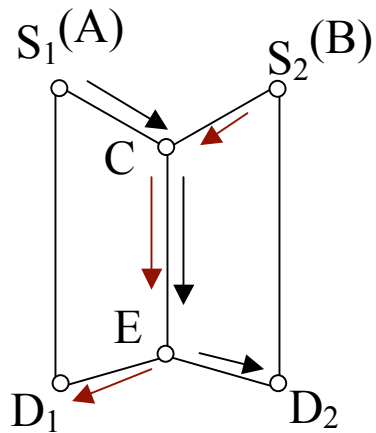
$$\left. \begin{array}{l} A = 00110100 \\ B = 10100010 \end{array} \right\} \longrightarrow a A \oplus b B \quad \text{where } a, b = 0 \text{ or } 1$$

(X-OR uses  $a=b=1$ )

**10010110**



# WHAT ABOUT UNICAST?



Now -  $S_1$  wants to deliver A to  $D_2$  only  
 -  $S_2$  wants to deliver B to  $D_1$  only

## Network Coding

1.  $S_1 \xrightarrow{A} C, D_1, \quad S_2 \xrightarrow{B} C, D_2$
2.  $C \xrightarrow{A \oplus B} E$
3.  $E \xrightarrow{A \oplus B} D_1, D_2$

## Store-and-Forward

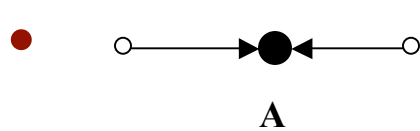
1.  $S_1 \xrightarrow{A} C, \quad S_2 \xrightarrow{B} C$
2.  $C \xrightarrow{A} E$
3.  $C \xrightarrow{B} E, \quad E \xrightarrow{A} D_2$
4.  $E \xrightarrow{B} D_1$

**But not capacity achieving  
 (i.e. only 2 packets/slot)  
 (Back-Pressure algorithm) <sub>8</sub>**



# AND NOW WIRELESS

- What is different?



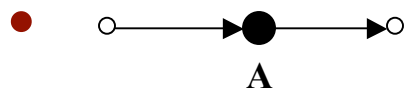
X

Node cannot receive simultaneously two different messages  
(actually.....it can, but.....)



X

Node cannot send simultaneously two different messages (it can certainly send the same message to multiple receivers)  
(actually..... it can, but.....)

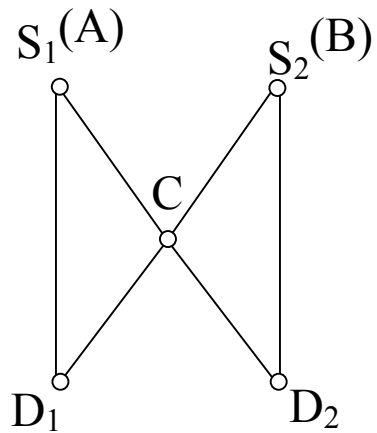


X

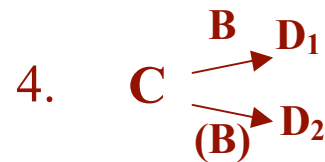
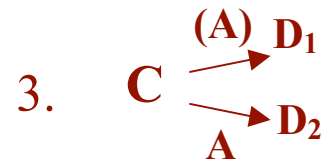
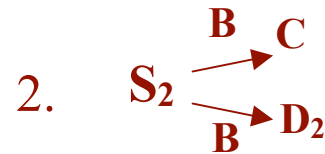
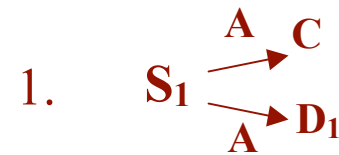
Node cannot send and receive simultaneously  
(no ifs and buts!)



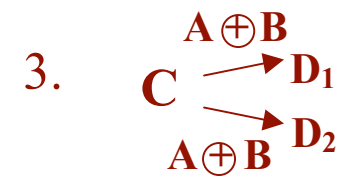
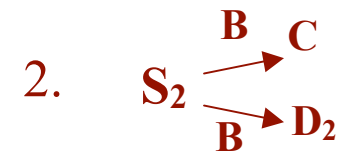
# THEREFORE



Store and Forward:



Network Coding:

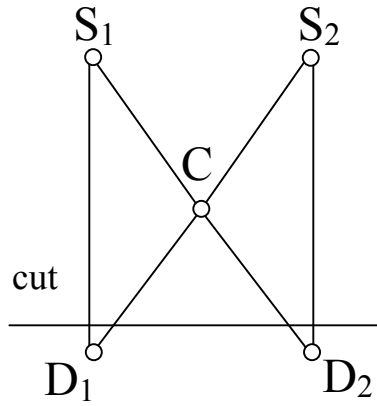


\* first: about the \*  
shown links \*

\* Here only one node can  
transmit at a time \*

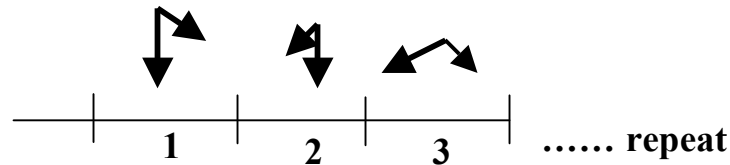


# AND HENCE



Limited pipelining (in this case none)

2 packets delivered to 2 destinations (total of 4) over 3 slots

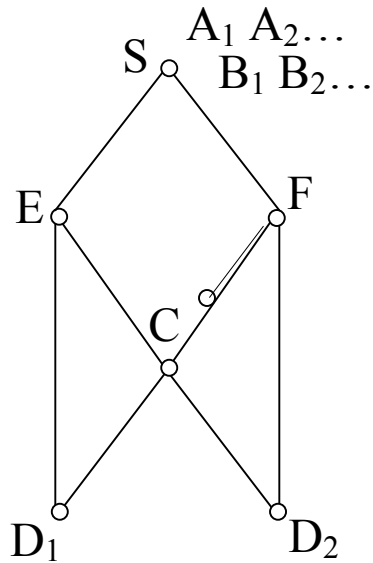


Cut capacity ? NOT 4 / slot

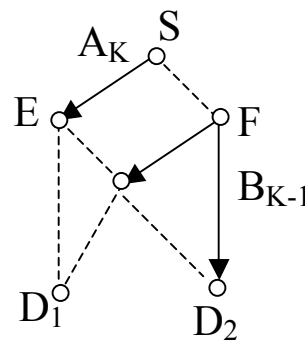
- Needs to be redefined (“degree” of node and time division effect)
- Then random linear coding again achieves max-flow/min-cut limit



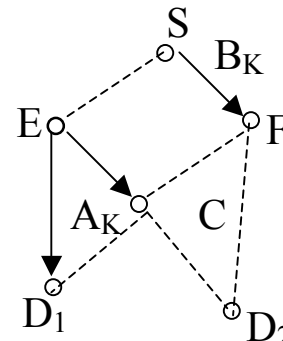
# HOWEVER: IS IT ALL GAINS?



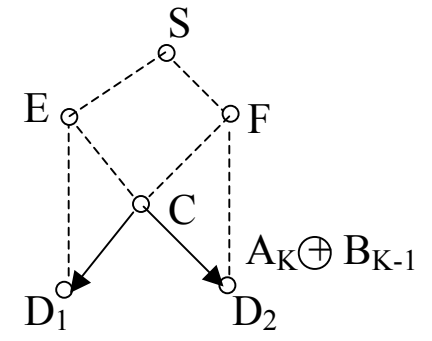
Feasible simultaneous activations:



(1)



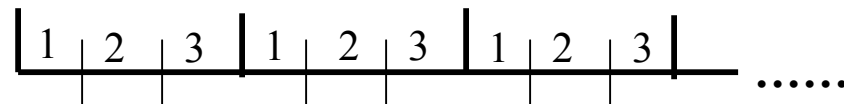
(2)



(3)

Time division over them

Throughput: 4 packets per 3 slots = 1.33



$A_K$  needs 3 slots for  $D_2$  and 2 slots for  $D_1$

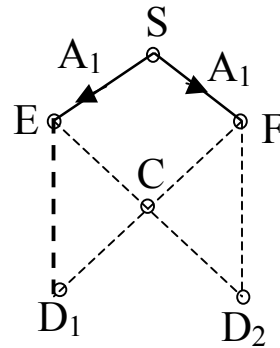
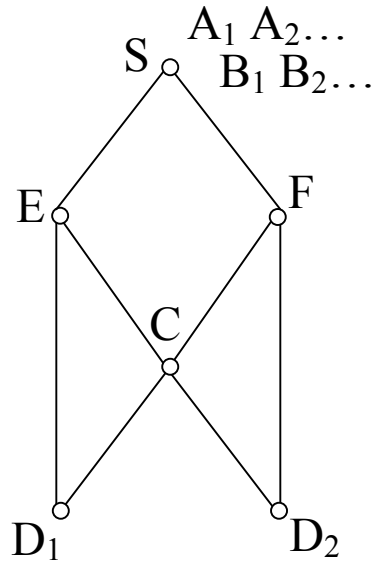
$B_{K-1}$  needs 5 slots for  $D_1$  and 3 slots for  $D_2$

....average = 3.25 slots

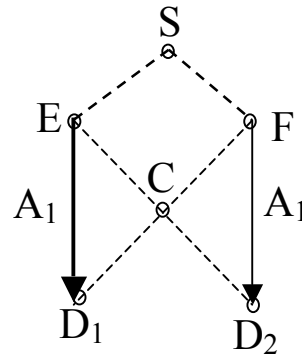


# WHILE

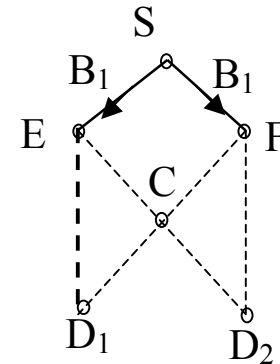
## Store and Forward



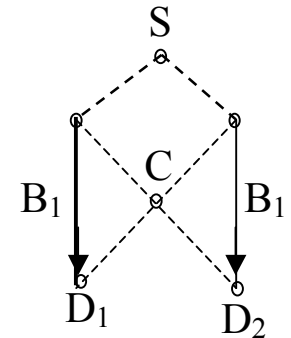
(1)



(2)



(3)



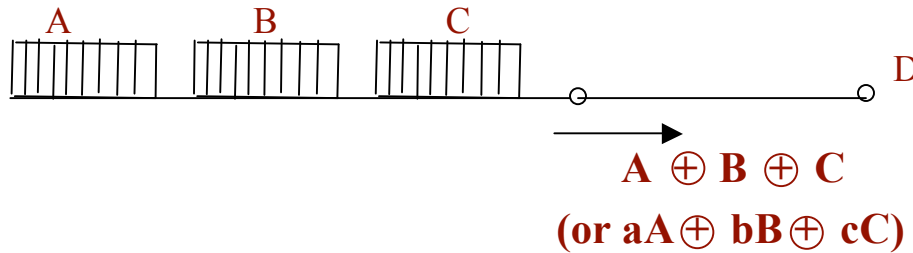
Throughput: 4 packets over 4 slots = 1

Delay: 2 slots (or even 3 slots)

**CONCLUSION: FOR WIRELESS: INTIMATE CONNECTION TO MEDIUM ACCESS (MAC)**



# FOCUS ON ONE LINK



- Receiver needs to know the values of the coefficients
- Alphabet size:  $Q$

Hence



$$: a_1 A_1, \oplus a_2 A_2 \oplus \dots \oplus a_k A_k$$

Block of  $K$  packets (each consisting of  $n$  bits) gets squeezed into  $n$  bits

OVERHEAD:  $K \cdot \log Q$  bits

\*independent of length  $n$  \*

HENCE:  $\text{OH} \rightarrow 0$  AS  $n \rightarrow \infty$



## FOCUS ON ONE LINK (con't.)

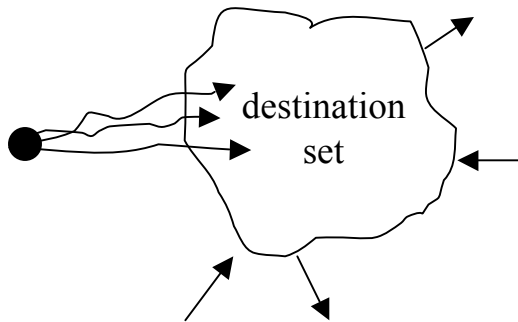
- Need  $K$  linearly independent combinations of  $A_1, \dots, A_K$  to decode
- Coefficients are chosen randomly
- Typically  $N > K$  packets need to be sent
- So why do it this way?  
(if  $Q$ : LARGE,  $N \rightarrow K$ ; but even then delay is  $K$  rather than  $K/2$ )

A: - Fountain coding for content distribution  
- Multicasting over independent channels



# FOUNTAIN CODING

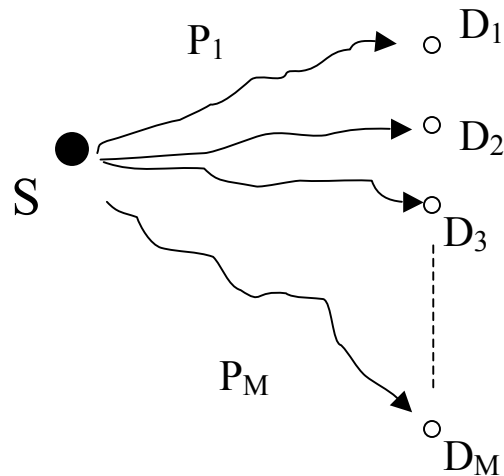
## (content distribution)



- Large file ( $K = \text{large}$ )
- Keep sending random linear combinations of the  $K$  packets
- “Rateless” property
- Different users get sufficient numbers of packets to decode the file at different times
- Microsoft “AVALANCHE”  
(somewhat like “Bit-Torrent”)



# WIRELESS MULTICASTING



- Channel to each  $D_i$  is subject to failures (fades, buffer overflow, etc.)
- Model:
  - Packet erasure probability**
- $P_i$  : probability a packet fails (is erased) on  $i^{th}$  channel
- Independence from channel-to-channel and from packet-to-packet



## WIRELESS MULTICASTING (con't.)

- Alternatives: ARQ or NETWORKING CODING
- ARQ: Repeat each packet transmission until all users receive it correctly
  - (limited by worse channel)
- Network coding: Keep sending random linear combinations of ALL (i.e.  $K$ ) packets
  - every user gets new information in each transmission
  - good-channel users receive all  $K$  packets early
  - poor-channel users receive all  $K$  packets with delay
  - on average: network coding does better

BUT: OH ( $K \log Q$ ) ; need  $n \longrightarrow \infty$



# NEW PROBLEM

Q: can  $P_i$  stay fixed as  $n \longrightarrow \infty$  ?

A: in real channels: NO

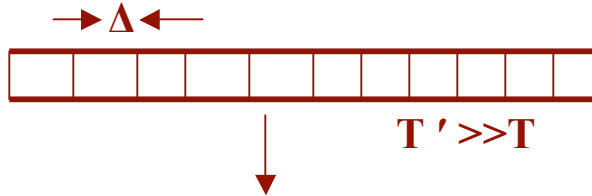
Recent “Results”: Network coding achieves  
 “Capacity” in general packet erasure networks  
 as  $n \longrightarrow \infty$  and the  $P_i$ ’s stay fixed

BUT: As  $n \longrightarrow \infty$  :



The diagram shows a horizontal bar representing a packet of length  $T$ . Above the bar, a small interval of length  $\delta$  is marked with a double-headed arrow, and the text  $\delta \ll \Delta$  is written above it. Below the bar, a vertical arrow points to the label  $T$ , and another vertical arrow points to the label  $P_i \rightarrow 1$ .

or



The diagram shows a horizontal bar representing a packet of length  $T' \gg T$ . Above the bar, a larger interval of length  $\Delta$  is marked with a double-headed arrow. Below the bar, a vertical arrow points to the label  $T' \gg T$ .

Model breaks down



## NEW PROBLEM

- Actually we can determine how  $P_i$  depends on  $n$   
 $P_i$  ( $n \log Q$ ) increasing in  $n$  and  $Q$   
and approaches 1 as  $n$  or  $Q$  go to infinity
- Can determine (in principle) optimal value of alphabet size and length
- **Leads to the ultimate question of combining information and communication theory with networking**