

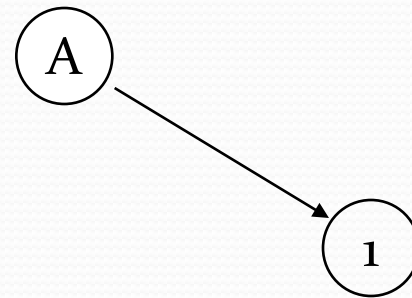
# Codificação em Redes (Network Coding)

Prof. Luiz Filipe M. Vieira  
DCC/UFMG

[lfvieira@dcc.ufmg.br](mailto:lfvieira@dcc.ufmg.br)

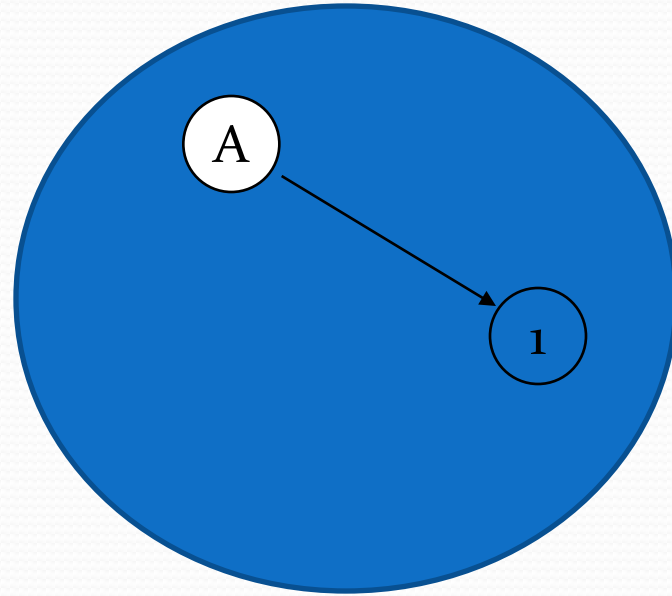
# Modeling Networks

- Use Graphs (V,E)
- Vertex
- Edge
- Edges connect vertices that communicate



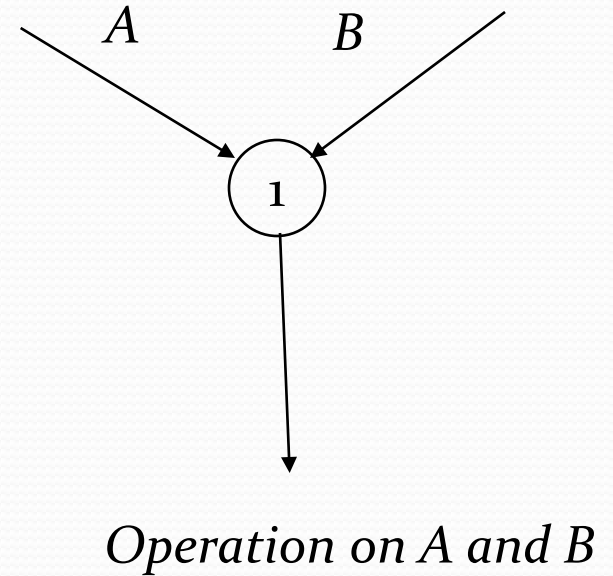
# Modeling Wireless Networks

- Use Graphs (V,E)
- Vertex
- Edge
- Edges connect vertices that communicate



# What is Network Coding?

- Nodes inside the network can perform coding
- Coding: any type of operation involving the messages
- It has many potentials gains



# Operation

- Truth Table

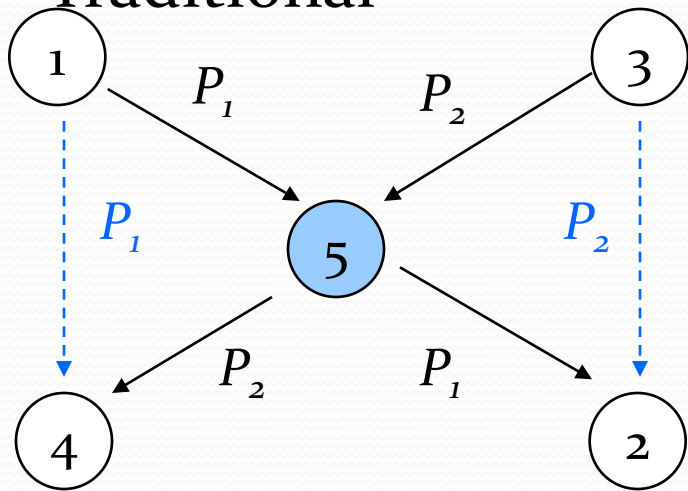
A	B	XOR
0	0	0
0	1	1
1	0	1
1	1	0

What is  $A \text{ XOR } A$ ?

What is  $A \text{ XOR } A \text{ XOR } B$ ?

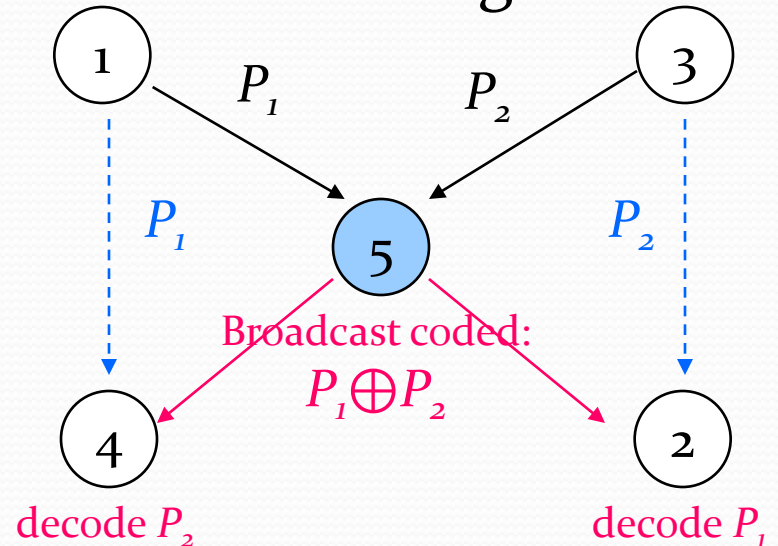
# Wireless Network

- Traditional



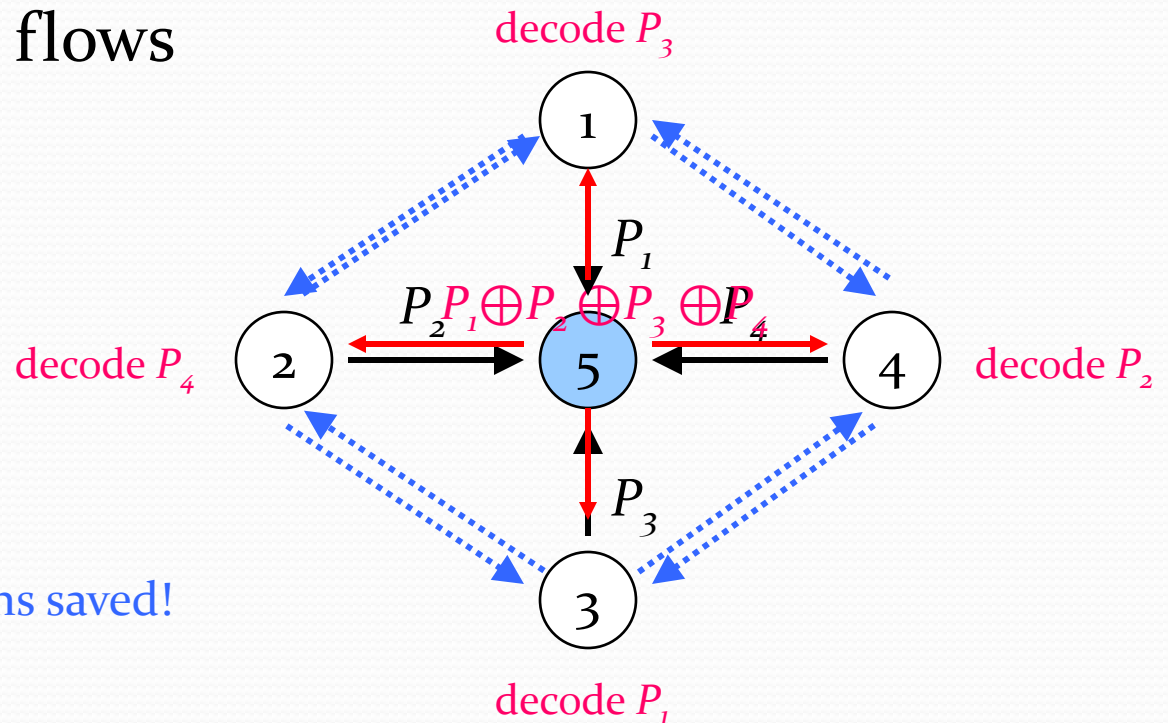
Two flows:  $1 \rightarrow 5 \rightarrow 2$   
 $3 \rightarrow 5 \rightarrow 4$

- Network Coding



# Network Coding

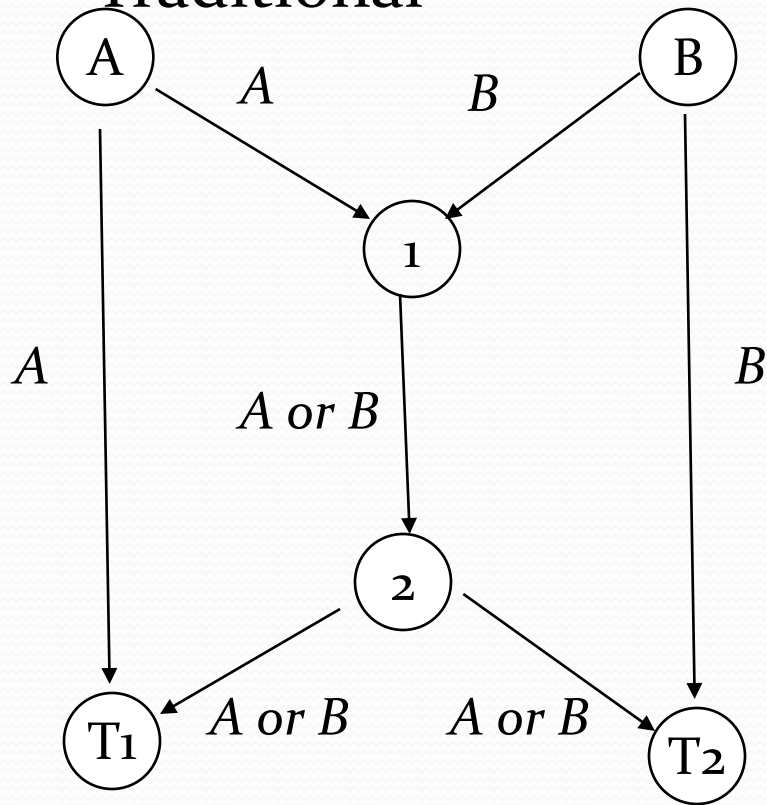
- More complicated scenario...
- 4 bi-directional flows



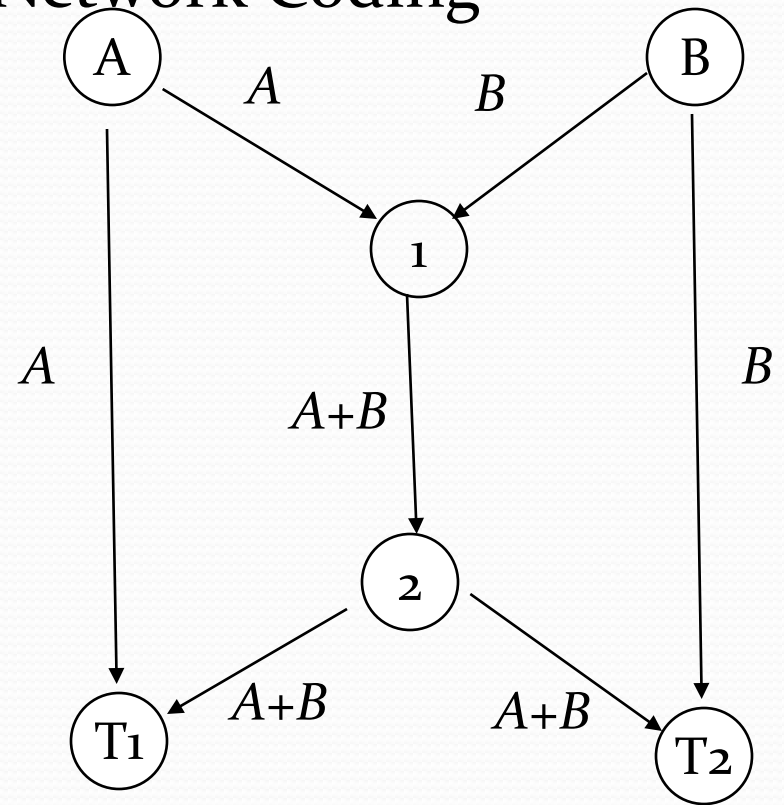
Three transmissions saved!

# Butterfly Network

- Traditional



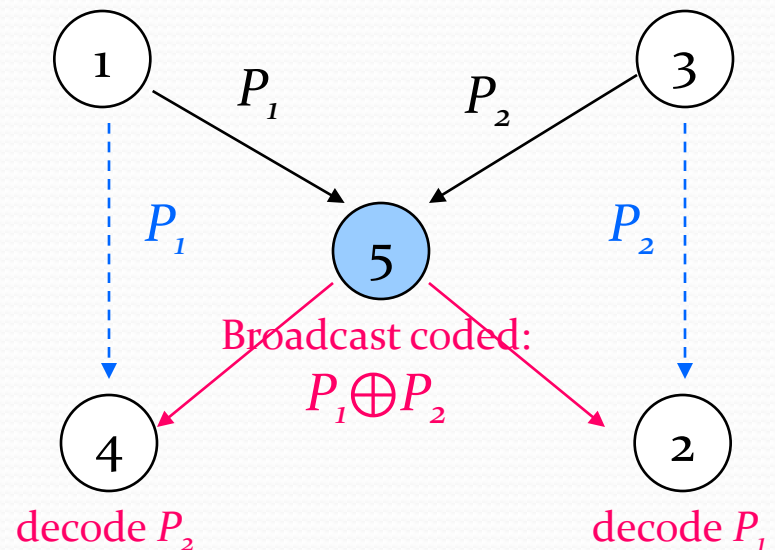
- Network Coding





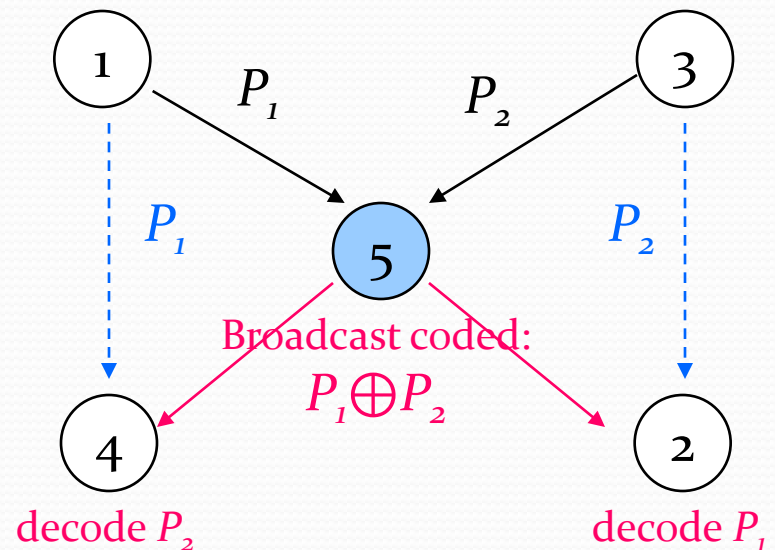
# Advantages of Network Coding

- Increases throughput:
  - More information can be sent over the network in a given period of time.



# Advantages of Network Coding

- Decreases energy consumption:
  - ➡ Less transmissions

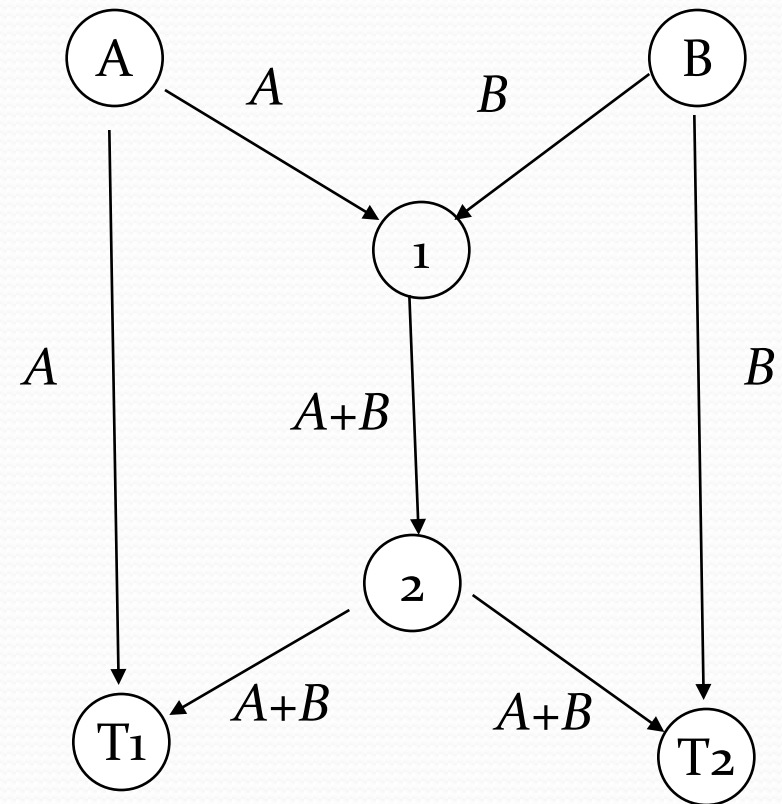


# Advantages of Network Coding

- Robustness:
  - Messages may be lost
  - By appropriately combining packets, information may be recovered

# Applicability - Wired Protocols

- Same idea as the butterfly network

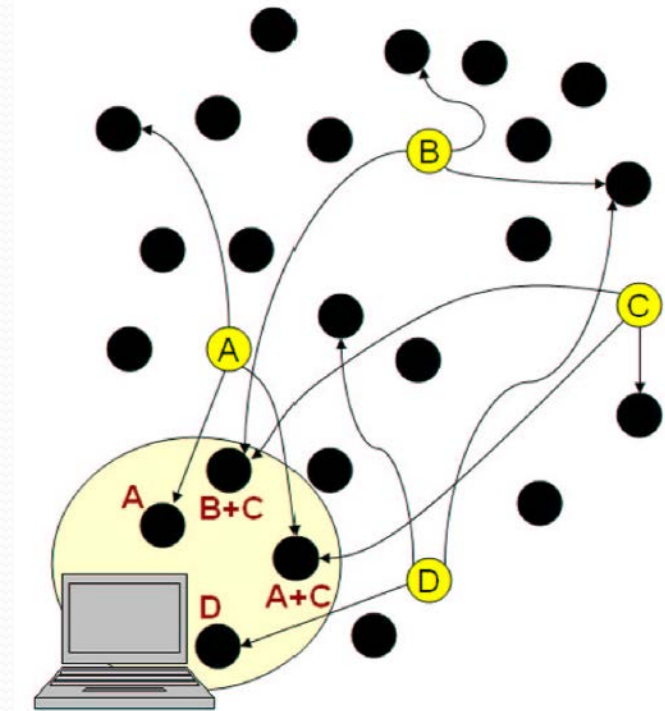


# Applicability - Wireless Protocols

- Packet loss occurs
- Shared medium
- How to take advantage?
- Focus on wireless protocols

# Applicability - Distributed Storage

- K data nodes
- N storage nodes
- Data is diffuse to storage nodes
- Randomly select storage nodes
- Data collector can recover it by accessing k storage nodes

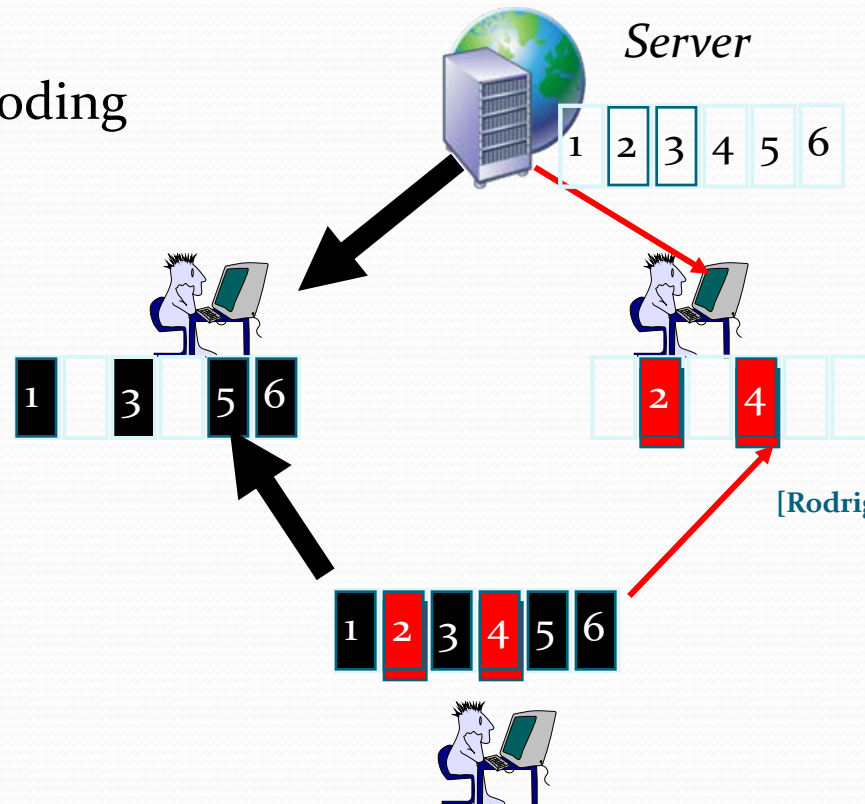


- K= 4 measuring information
- N=23 storage nodes

A. G. Dimakis et al., Decentralized Erasure codes for distributed networked storage, TON 2007

# Network Coding in P2P Swarming

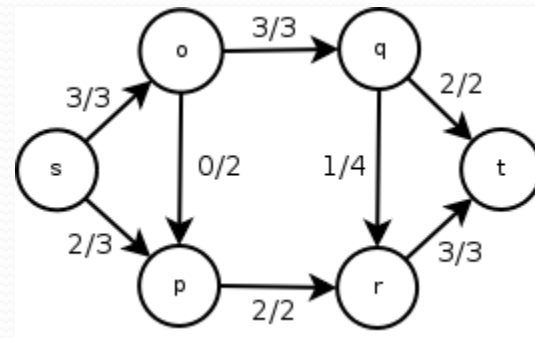
- P2P Swarming
  - File is divided into many small pieces for distribution
  - Clients request different pieces from the server/other peers
  - When all pieces are downloaded, clients can re-construct the whole file
  - Rare piece problem
- P2P using Network Coding
  - Avalanche



[Rodriguez, Biersack, Infocom'00]

# Max-Flow

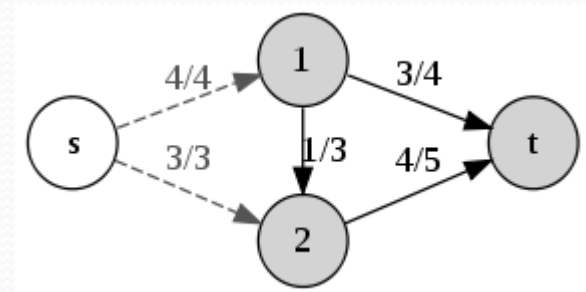
- Given:
  - a network  $G(N,E)$ , and
  - edges capacities
- Find the maximum flow from a sink to a terminal





# Max-Flow Min-Cut

- The maximum amount of flow passing from the source to the sink is equal to the minimum capacity that needs to be removed from the network so that no flow can pass from the source to the sink.



# Max Flow – LP Formulation

*Max-Flow LP:*

maximize  $f_{RS}$

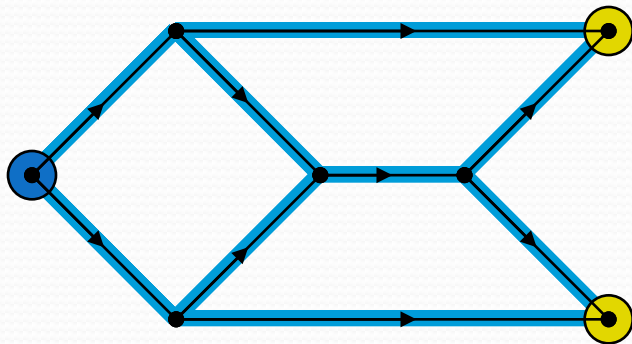
subject to

$$\sum_{(v,u) \in E} f_{vu} = \sum_{(u,w) \in E} f_{uw}, \quad \forall u \in V \quad (\text{flow conservation})$$

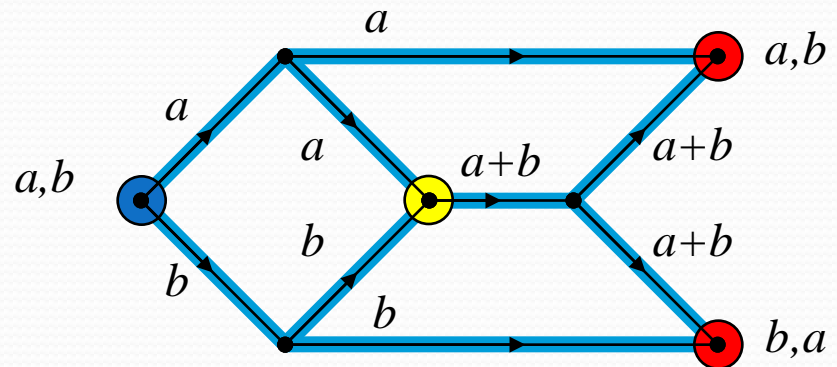
$$f_{vu} \leq c_{vu}, \quad \forall (v,u) \in E \quad (\text{capacity constraints})$$

$$f_{vu} \geq 0, \quad \forall (v,u) \in E$$

# NC achieves multicast capacity



optimal routing  
throughput = 1



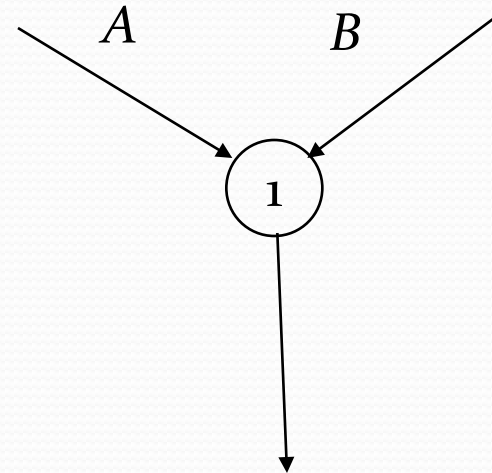
network coding  
throughput = 2

- Alswede, Cai, Li, Yeung (2000):
  - $\min_{t \in T} \text{MinCut}(s, t)$  is always achievable by network coding
  - $h = \min_{t \in T} \text{MinCut}(s, t)$  is “multicast capacity”

● sender  
● receiver  
● coding node

# Linear Coding

- Each node generates a new packet, which is a linear combination of the earlier received packets on the link, by coefficients in a finite field.



*Linear Operation on  $A$  and  $B$*

# Linear Coding

- A message generated so  $X_k$  is related to the received messages  $M_i$  by the relation:

$$X_k = \sum_{i=1}^S g_k^i \cdot M_i$$

- Each node forwards the computed value  $X_k$  along with all the coefficients used in the  $k$ th level

- The values are the coefficients from the Galois field  $GF(2^s)$
- Makes encoding and decoding easy to implement in practice

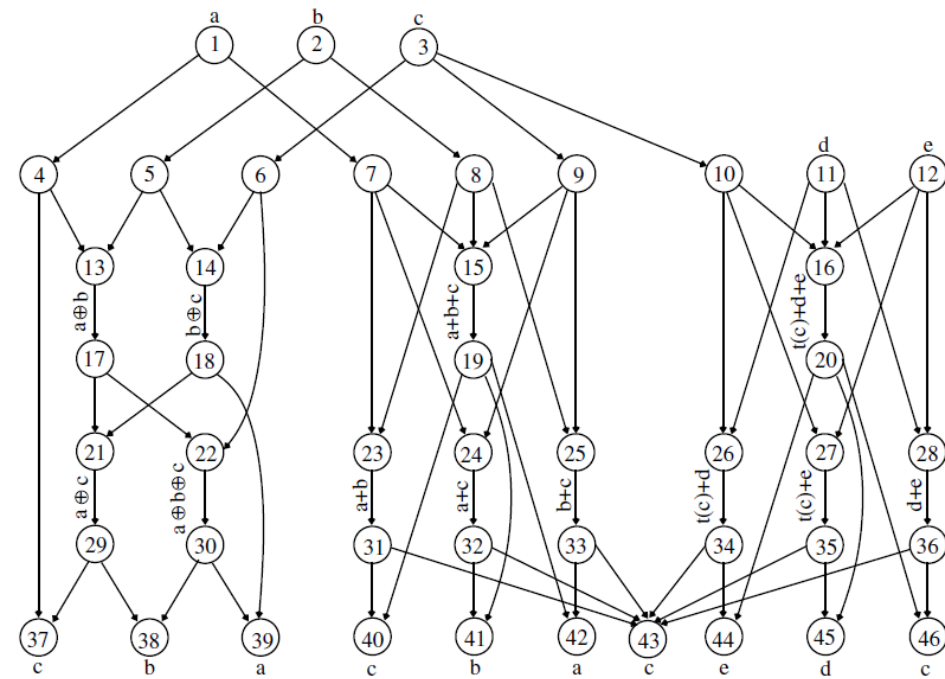
# Linear Coding – Theoretical Results

- For one source Li et. al gave an explicit construction of a code for multicast in a network that achieves the max-flow
- Linear Coding can achieve max-flow

Linear Network Coding, Li et al., IEEE Transactions on Information Theory, 2003

# Insufficiency of Linear Coding

- In 2005, it was shown that the linear coding is not sufficient in general (multisource, multisink with arbitrary demands)



Insufficiency of Linear Coding,  
Dougherty et al., IEEE  
Transactions on Information  
Theory, 2003.

# Random Linear Coding

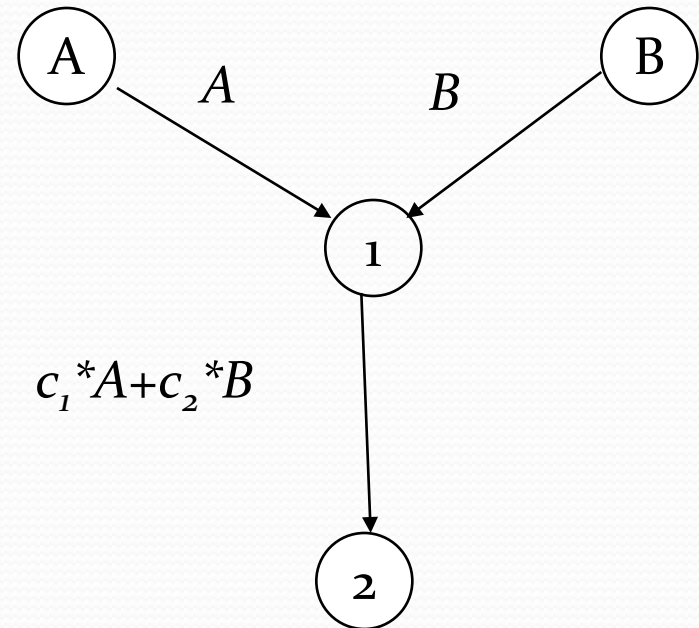
- Randomized coding approach
- For robust, distributed transmission and compression of information in network
- Interior nodes perform encoding
- Destination performs decoding

The Benefits of Coding over Routing in a Randomized Setting, Ho et al., IEEE International Symposium on Information Theory Theory, 2003



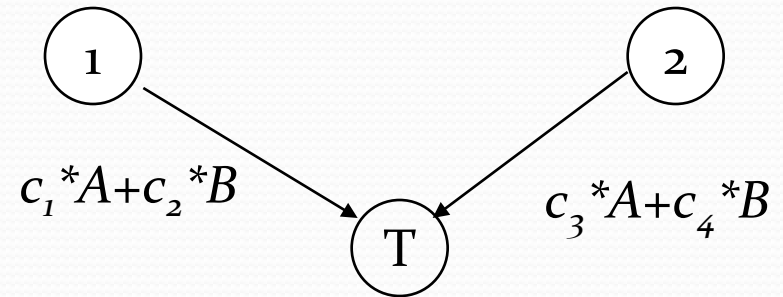
# Random Linear Coding - Encoding

- Interior nodes independently choose random linear coefficients
- Output is a linear combination of inputs multiplied by random coefficients

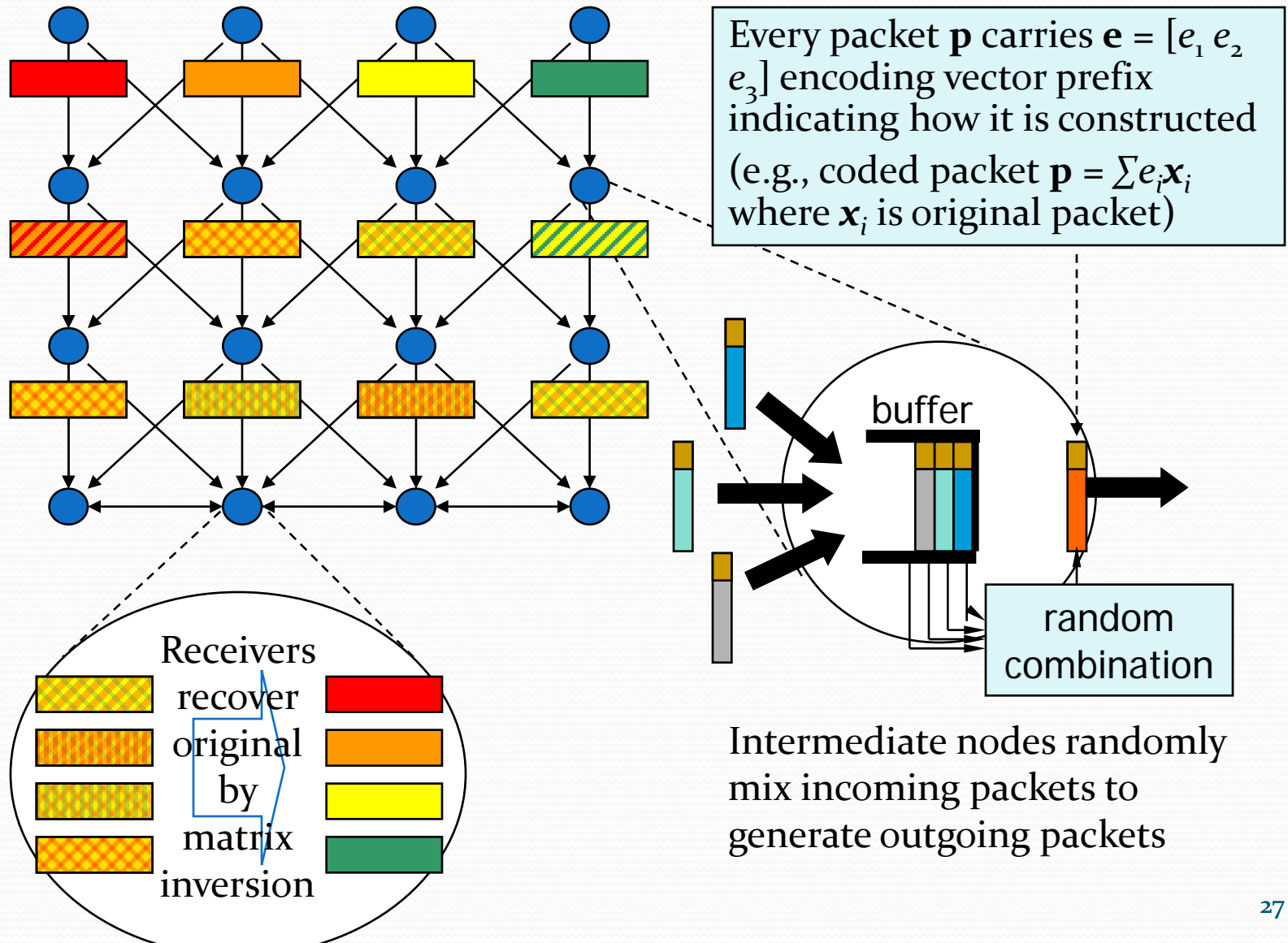


# Random Linear Coding - Decoding

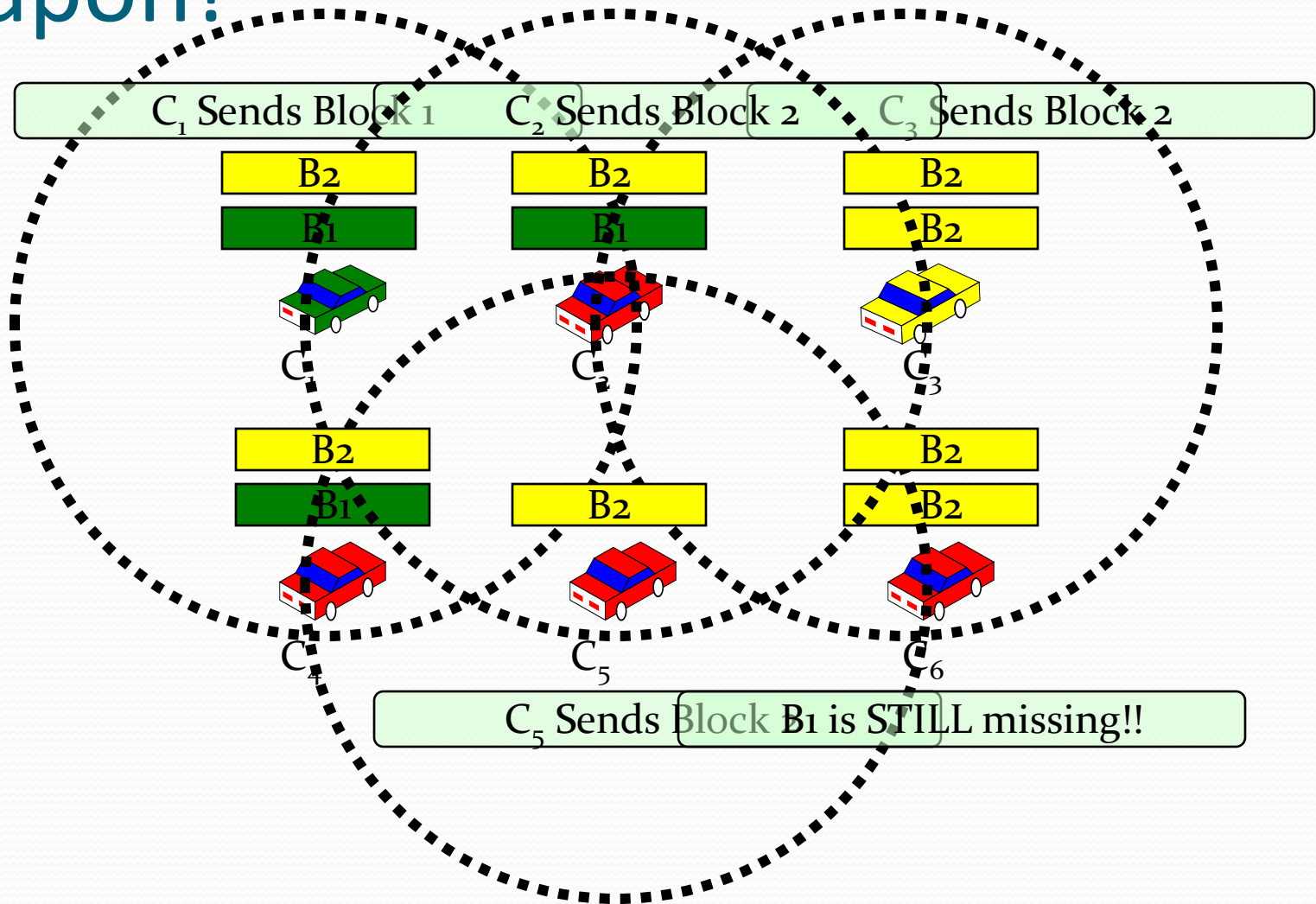
- Receiver nodes can decode if they receive as many independent linear combinations as the number of source packets
- Coefficient are stored into a matrix T
- Compute the inverse of T



# Random network coding

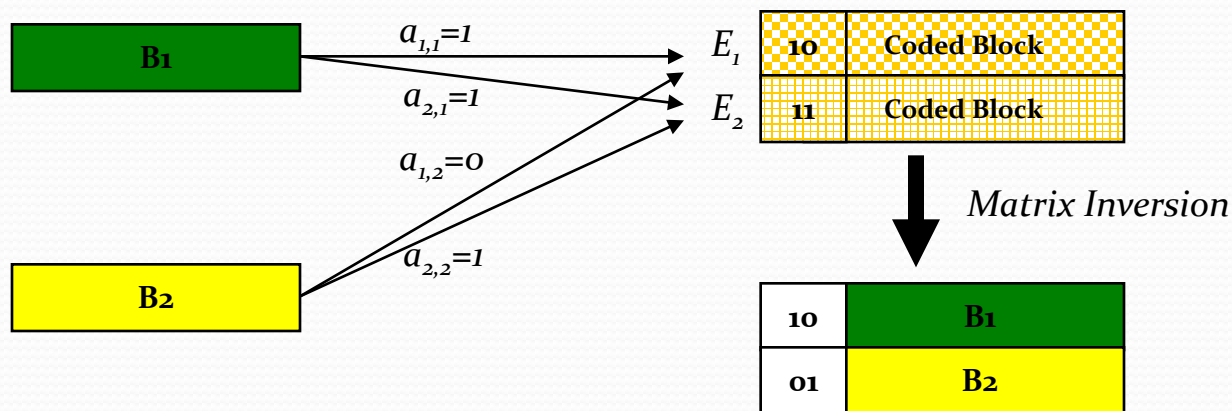


# Swarming limitation: Missing coupon!



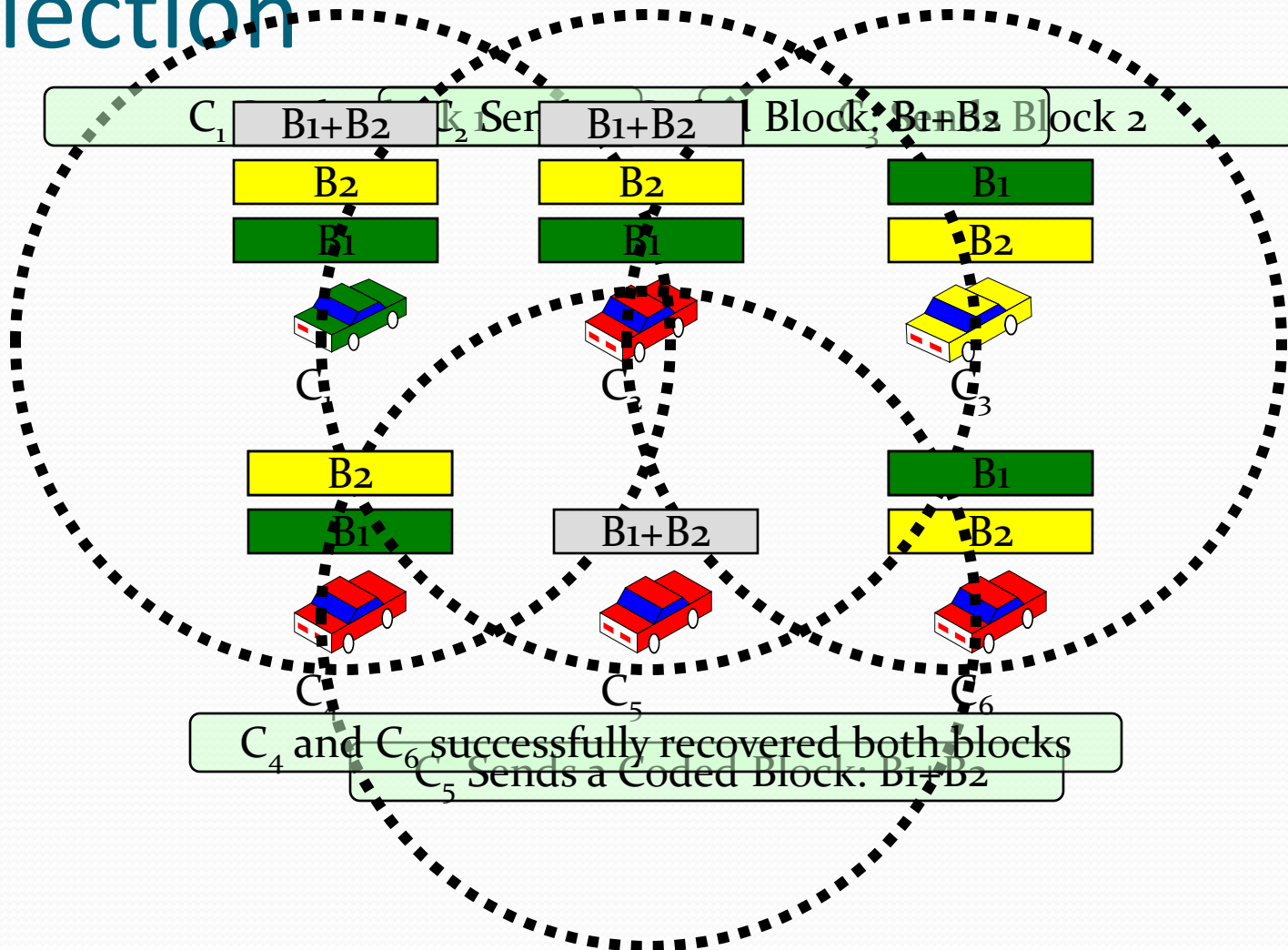
# Network Coding

- Let a file has  $k$  blocks:  $[B_1 B_2 \dots B_k]$
- Encoded block  $E_i$  is generated by
  - $E_i = a_{i,1} * B_1 + a_{i,2} * B_2 + \dots + a_{i,k} * B_k$
  - $a_{i,x}$  : randomly chosen over the finite field
- Any “ $k$ ” linearly independent coded blocks can recover  $[B_1 B_2 \dots B_k]$  by matrix inversion
- Network coding maximizes throughput and minimizes delay



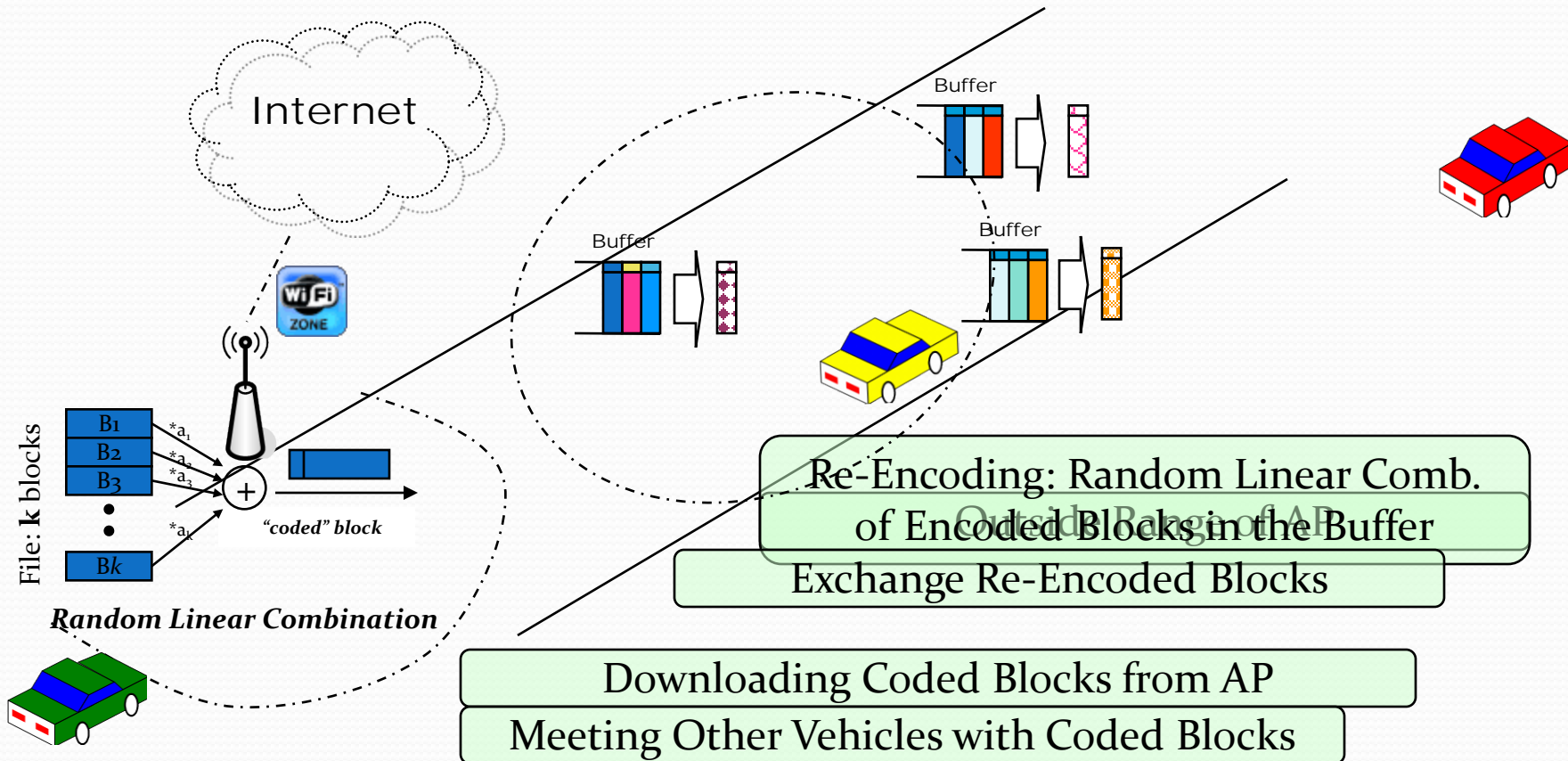
Network coding over the finite field  $GF(2)=\{0,1\}$

# Network coding helps coupon collection



# Protocols

- Single-hop pulling



# Conclusion

- NC achieves multicast capacity
- Reduces complexity
- It is Practical
- Many Applications
- Unicast, Multicast
- MANETS, VANET