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# Network Coding for networks of noisy & interfering channels

Daniela Tuninetti (University of Illinois at Chicago)

with Urs Niesen (MIT) and Christina Fragouli (EPFL)

`daniela@ece.uic.edu, uniesen@mit.edu, christina.fragouli@epfl.ch`

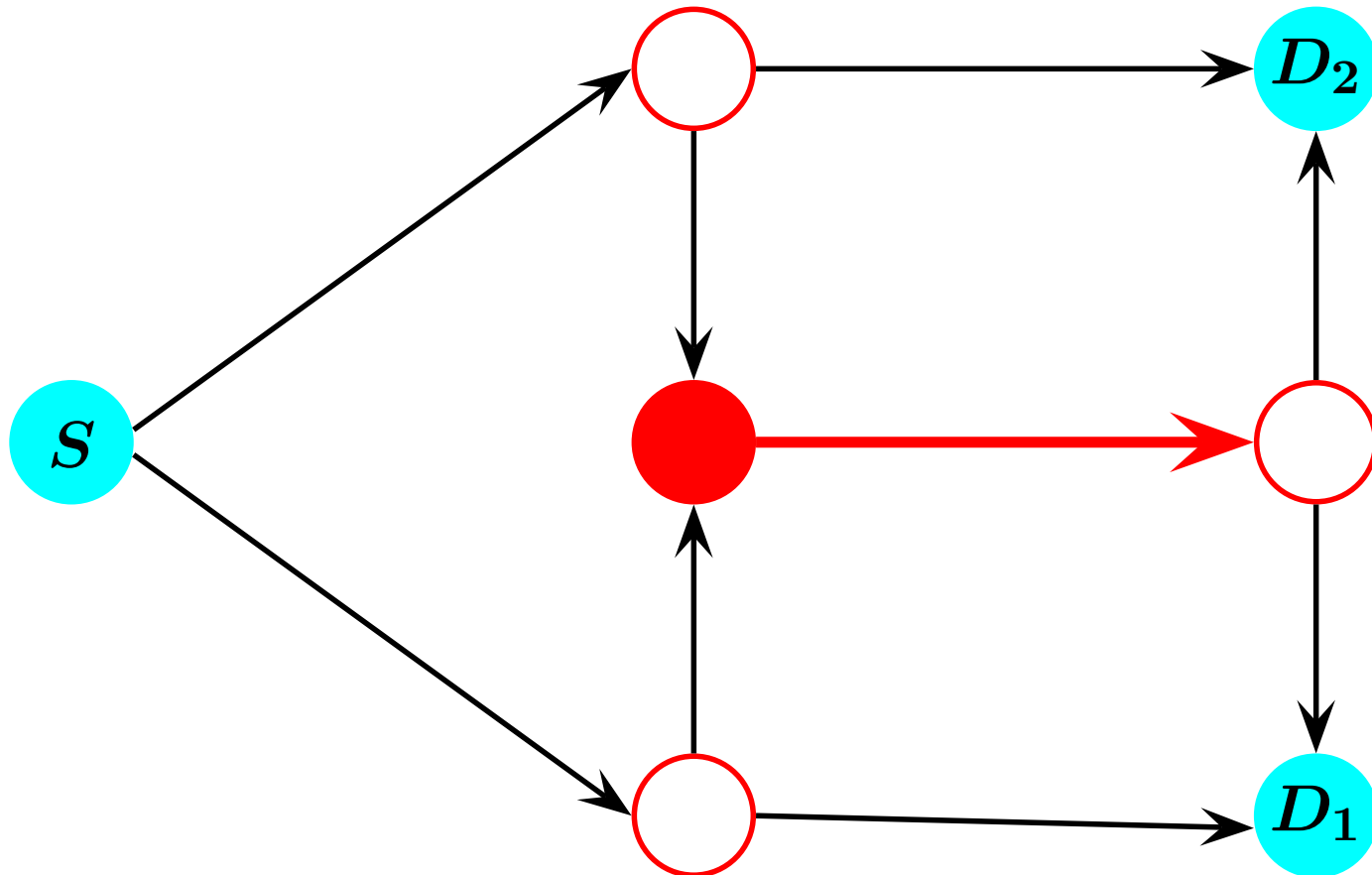
# Motivation

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- Communication networks today are organized in large scale networks (Internet) where packets traverse multiple hops in order to reach the destination
- In Ad-hoc wireless networks, the number of hops scales as  $\sqrt{\#nodes}$
- Each hop introduces errors, that become more pronounced as the number of hops increases
- Does processing at the intermediate node improve performance? If so, what kind of processing?

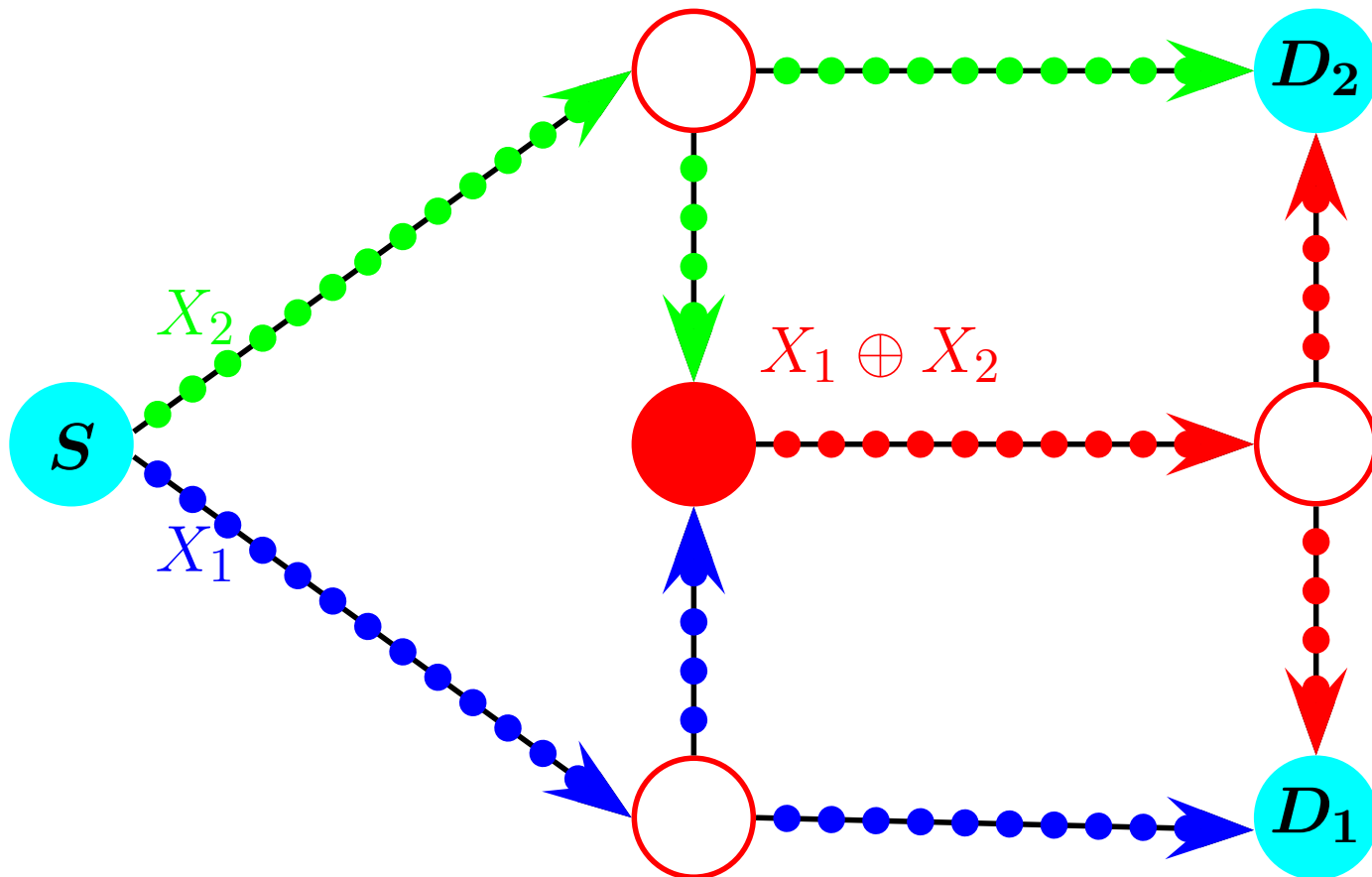
# Motivation - cont.

*Network Coding* improves the end-to-end performance, even on network of noise-free links!



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- the links are noisy?
- the channels interfere?
- the graph has cycles?

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We'll comment on this at the end of this talk ...
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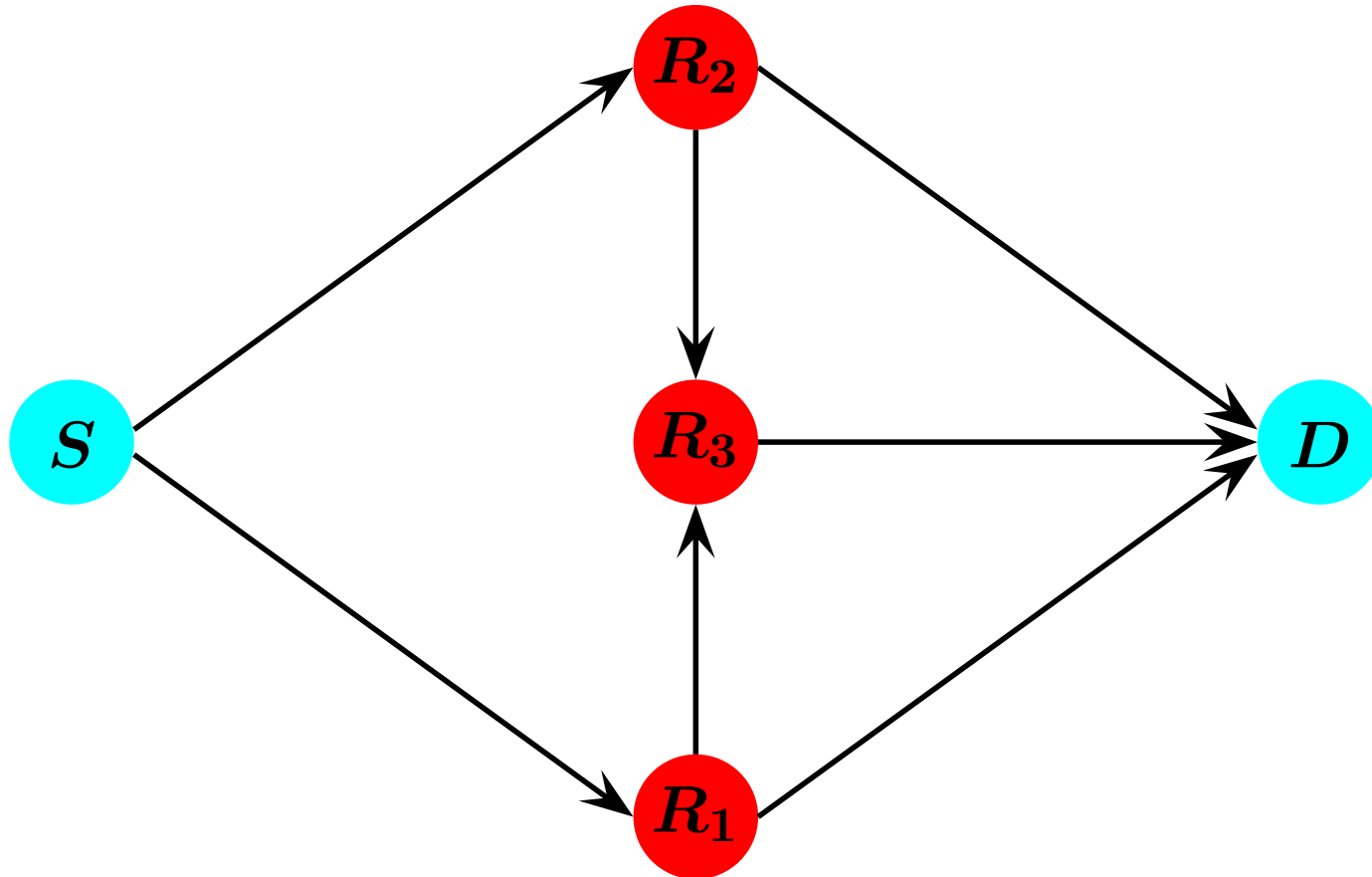
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As before, if the relays have unlimited complexity
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- the graph has cycles?  
Feedback: open problem ...

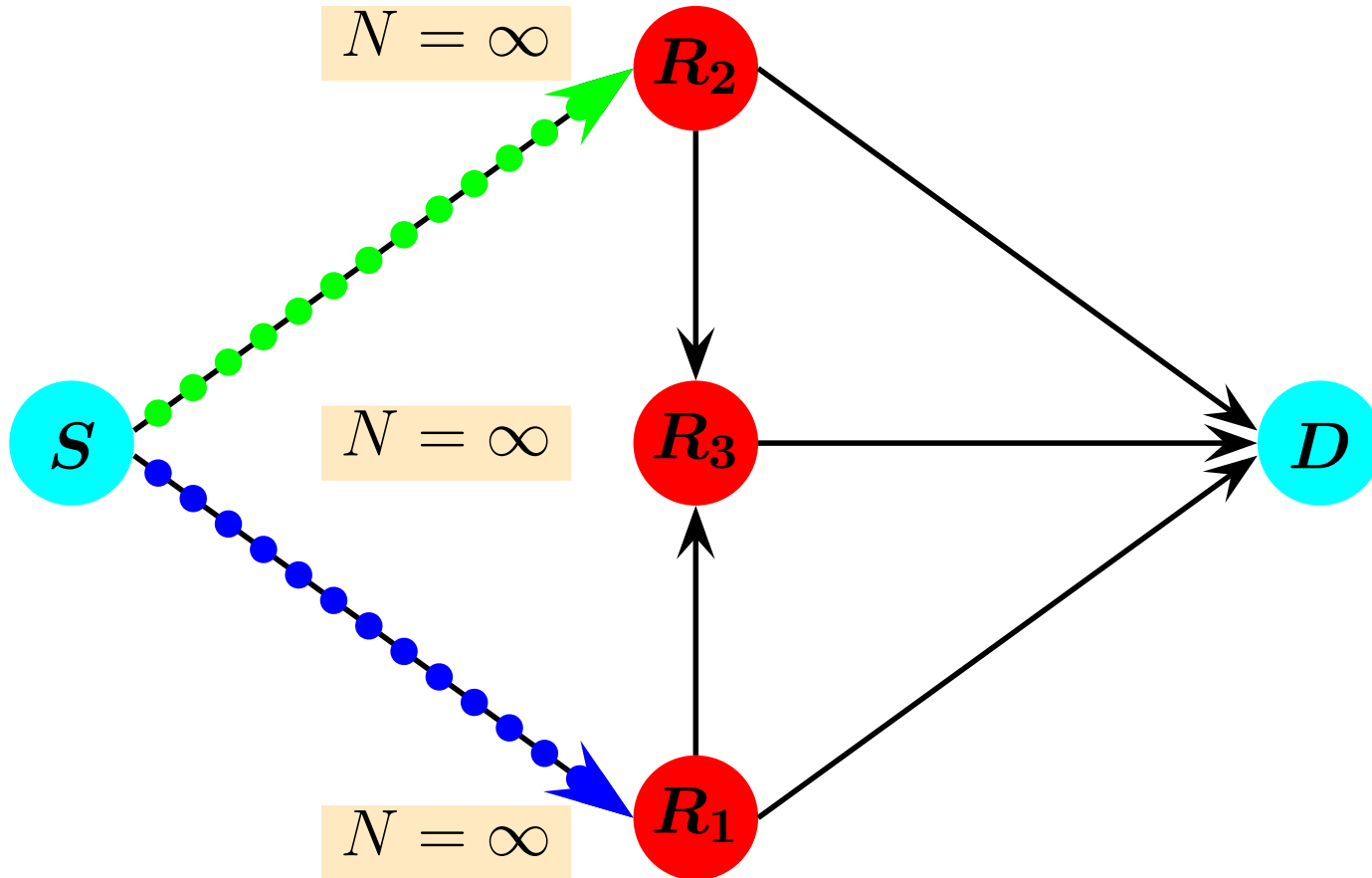


# Example: Unicast (F&T ISIT'05)

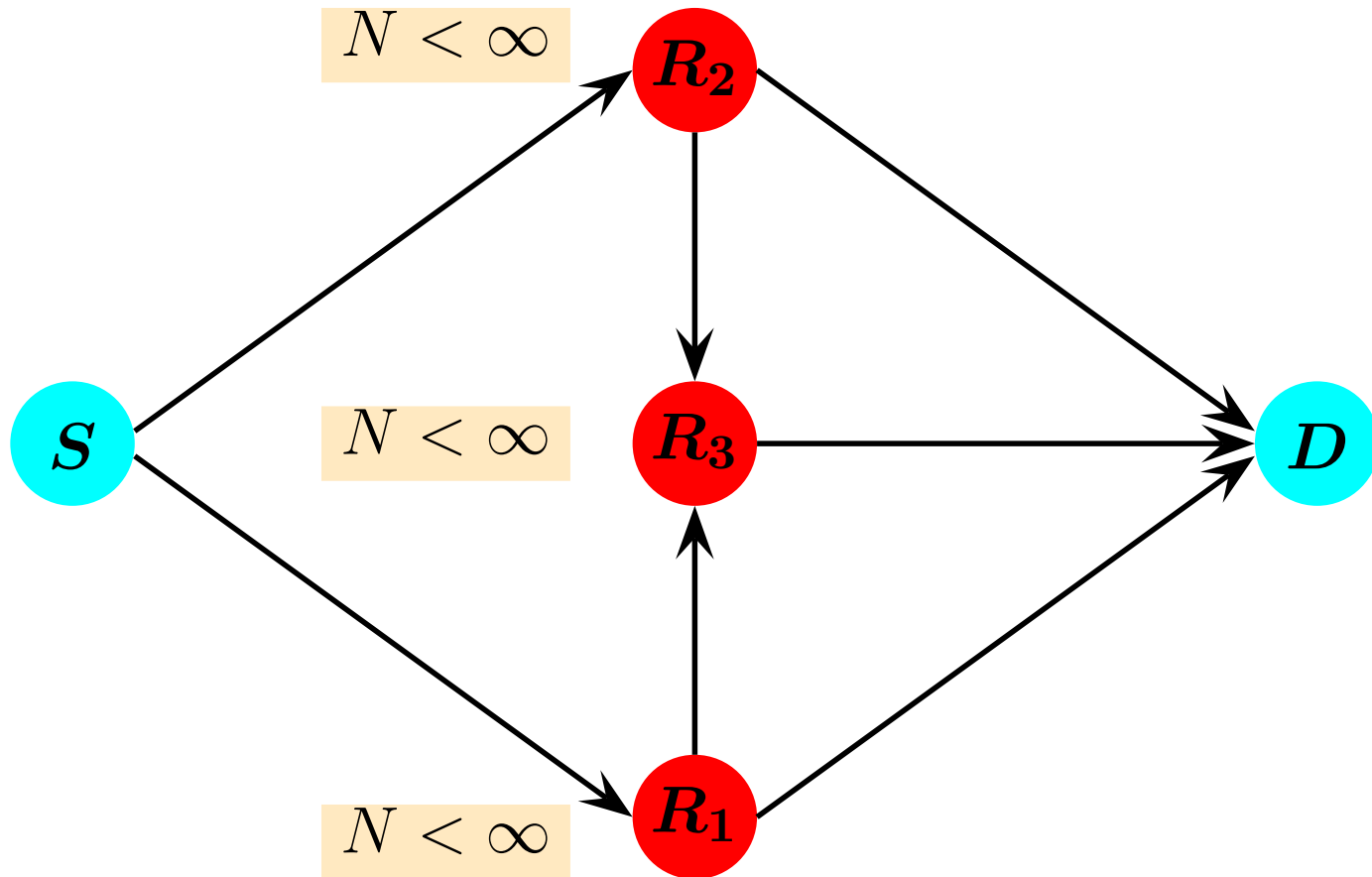
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# Network Model

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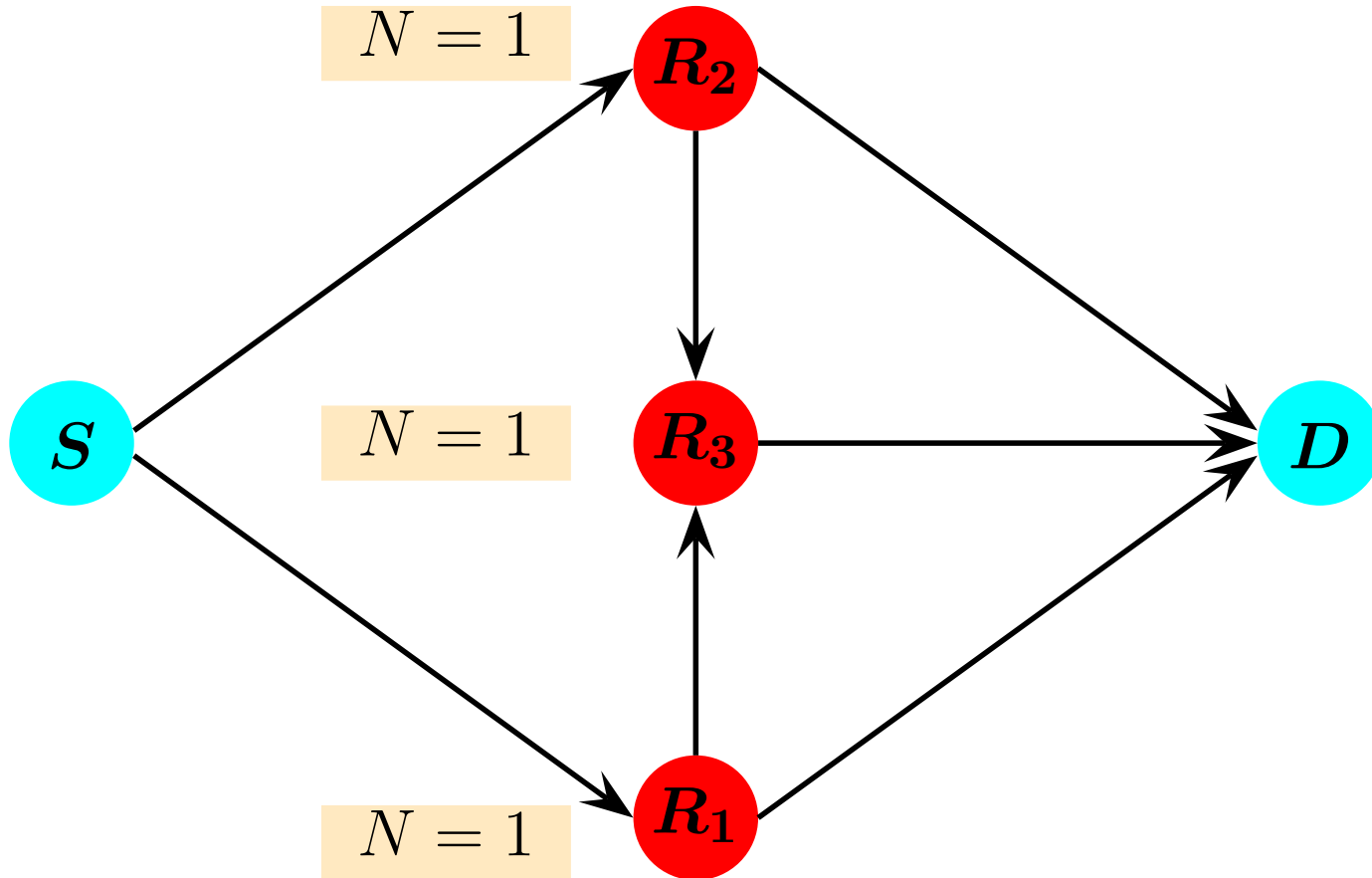
- Hypothesis
  - Network of DMCs
  - Relay nodes can process blocks of **finite length  $N$**  only (well suited for packet oriented networks)
  - Source and Destination can perform coding and decoding of **arbitrary complexity/length**

# Network Model

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- Hypothesis
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  - Relay nodes can process blocks of **finite length  $N$**  only (well suited for packet oriented networks)
  - Source and Destination can perform coding and decoding of **arbitrary complexity/length**
- Goal: Determine the capacity of the network
  - Does finite complexity processing improve over forwarding?
  - Properties of optimal intermediate processing
  - Scalability in large networks
  - Does  $N$  need to scale with the network size in order to achieve the “min-cut” capacity?

# Example: Network of BSC

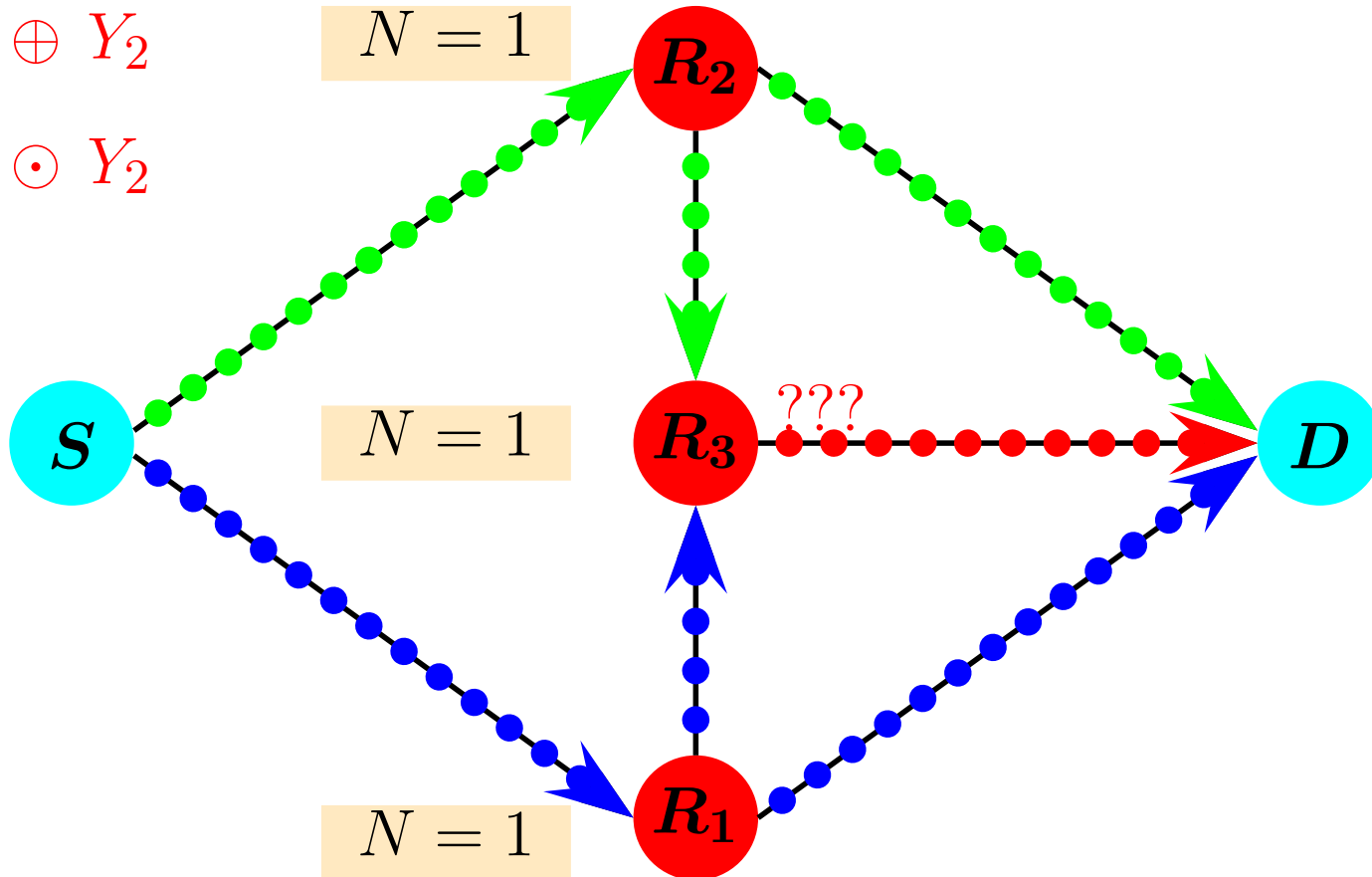


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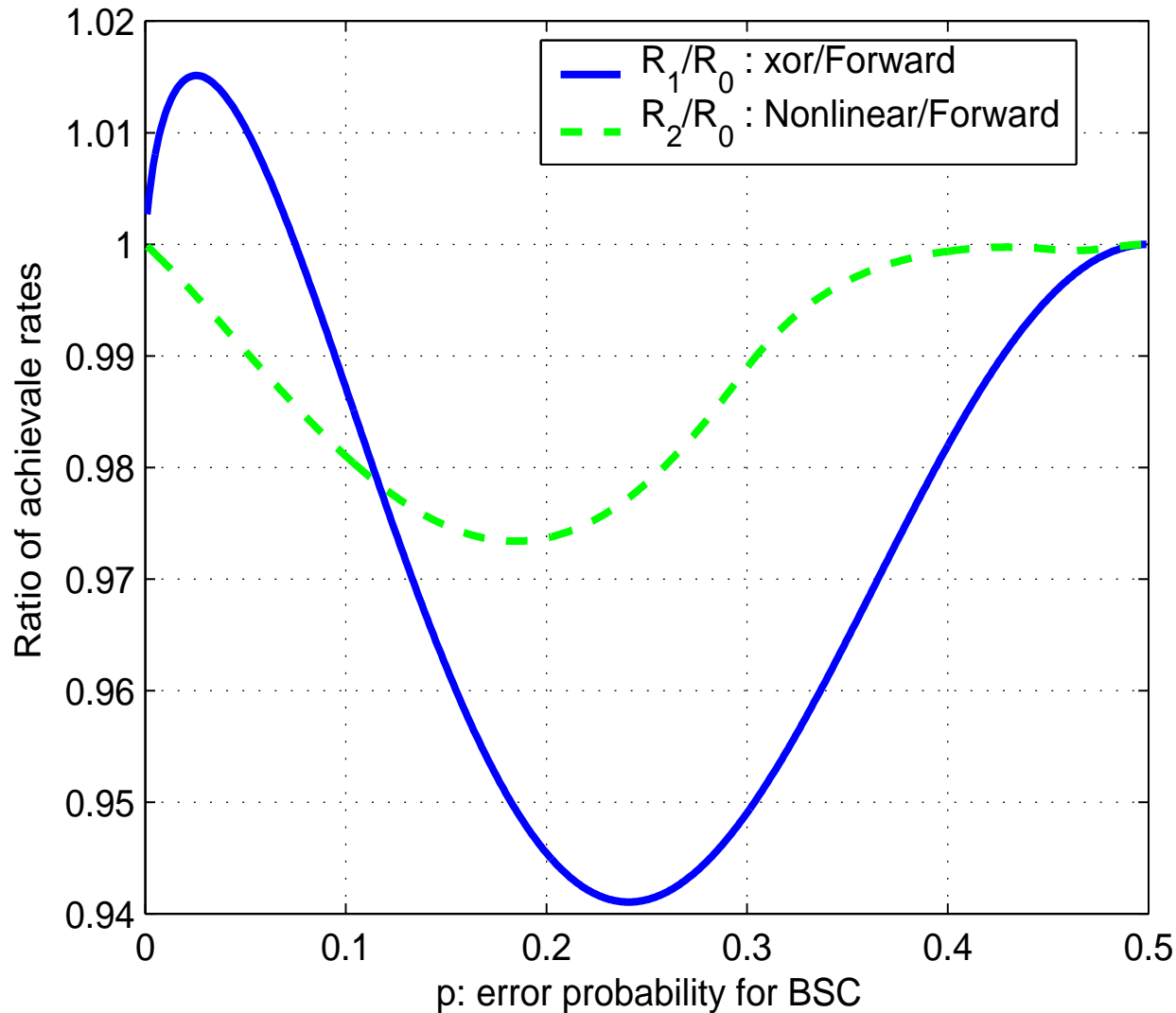
$$??? = Y_1 \text{ (or } Y_2)$$

$$??? = Y_1 \oplus Y_2$$

$$??? = Y_1 \odot Y_2$$

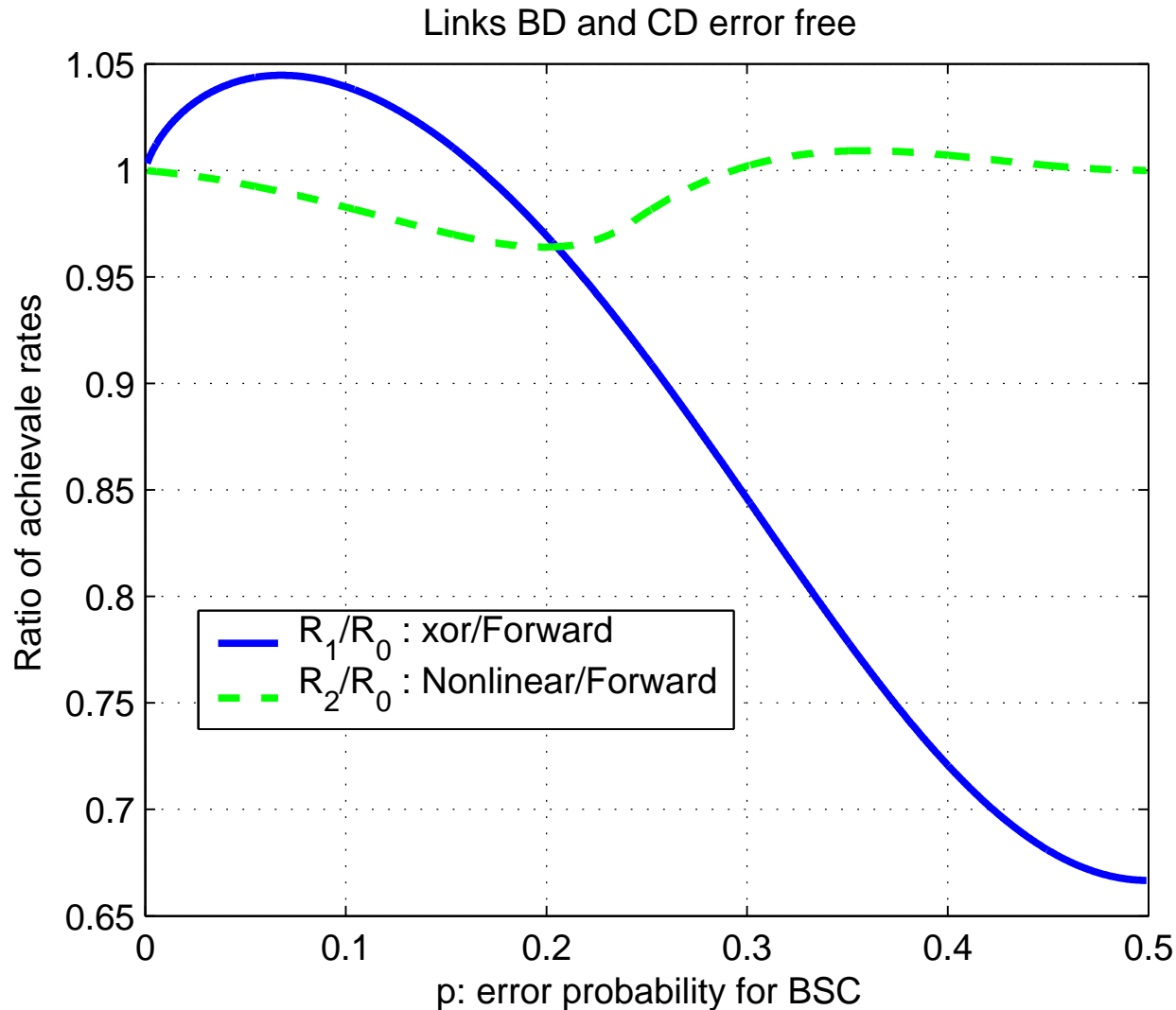


# Example: all links are BSC(p)

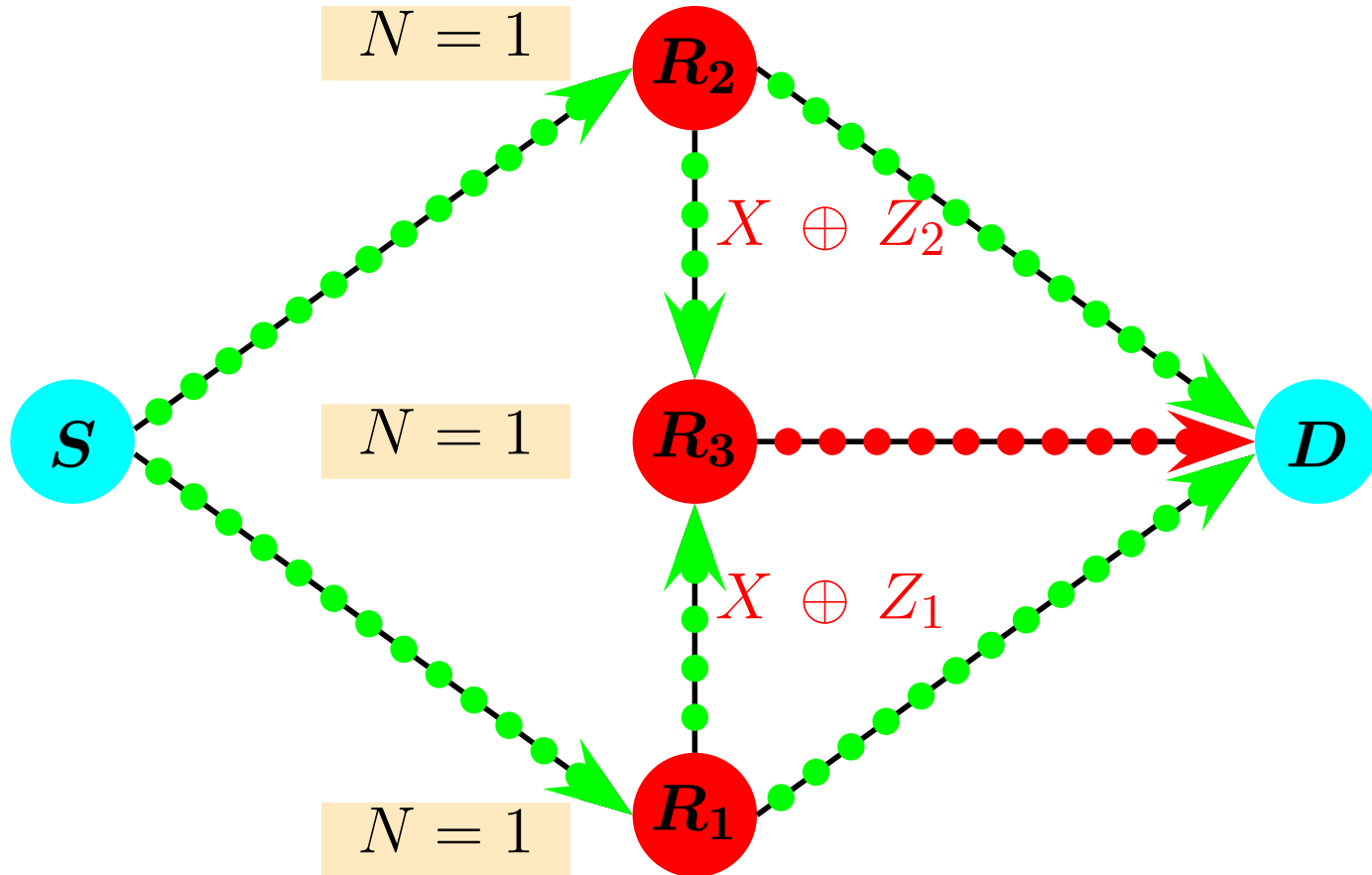




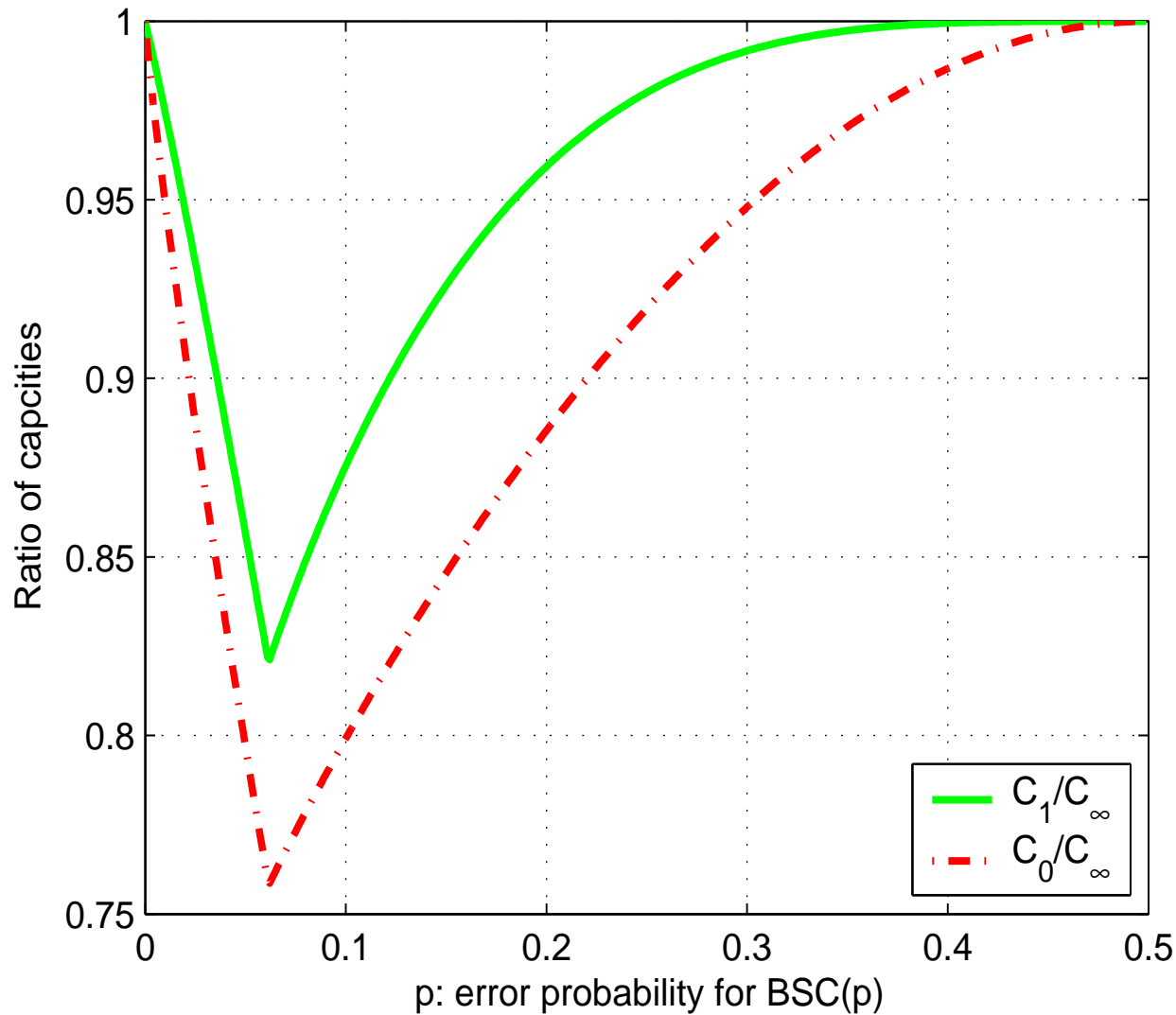
# Example: noiseless links among relays



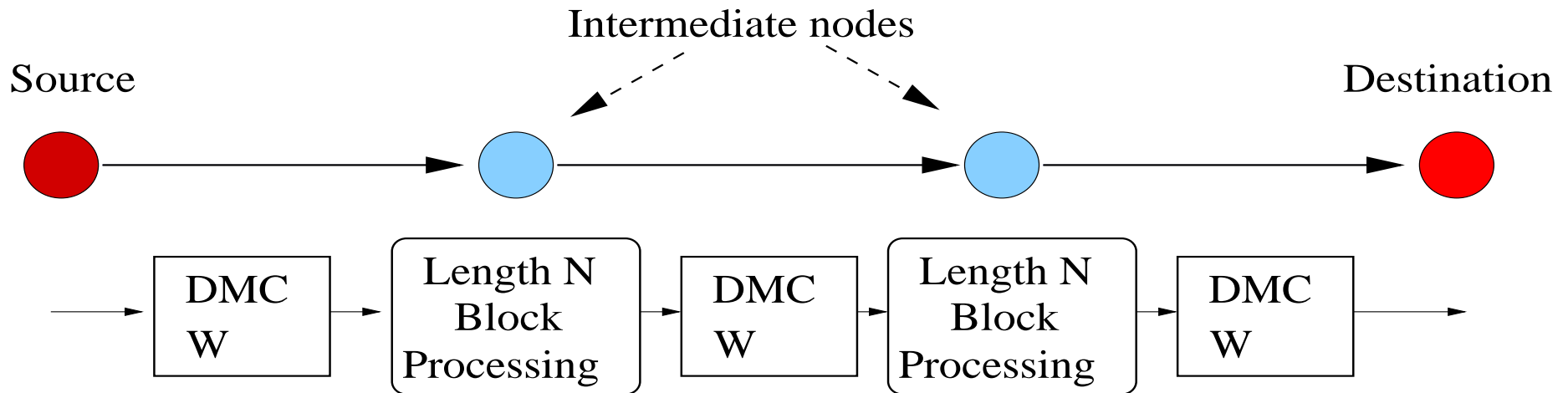
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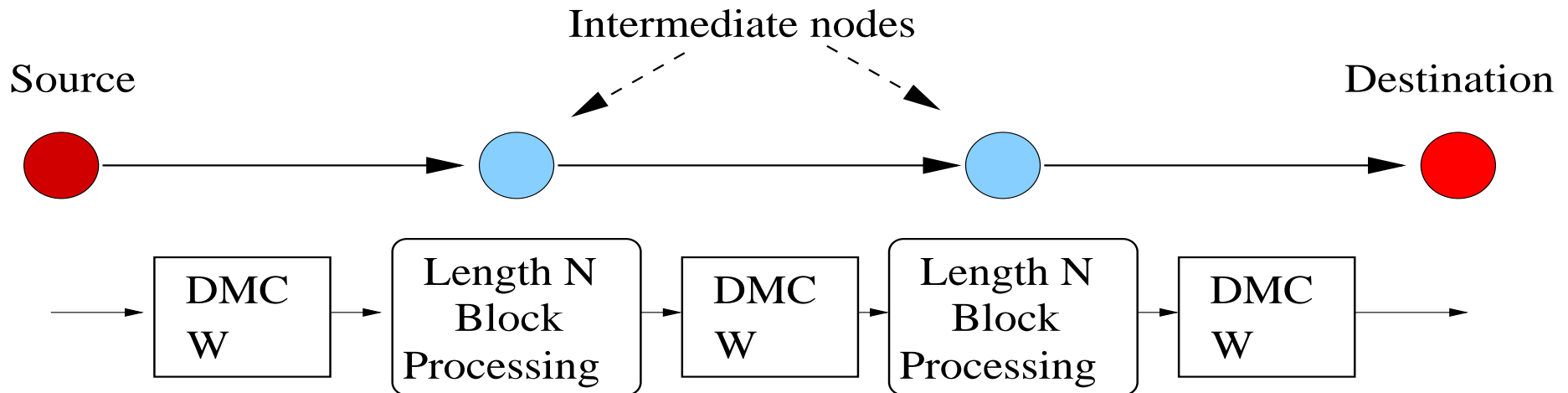
# Example: Network of BSC



# Line Networks

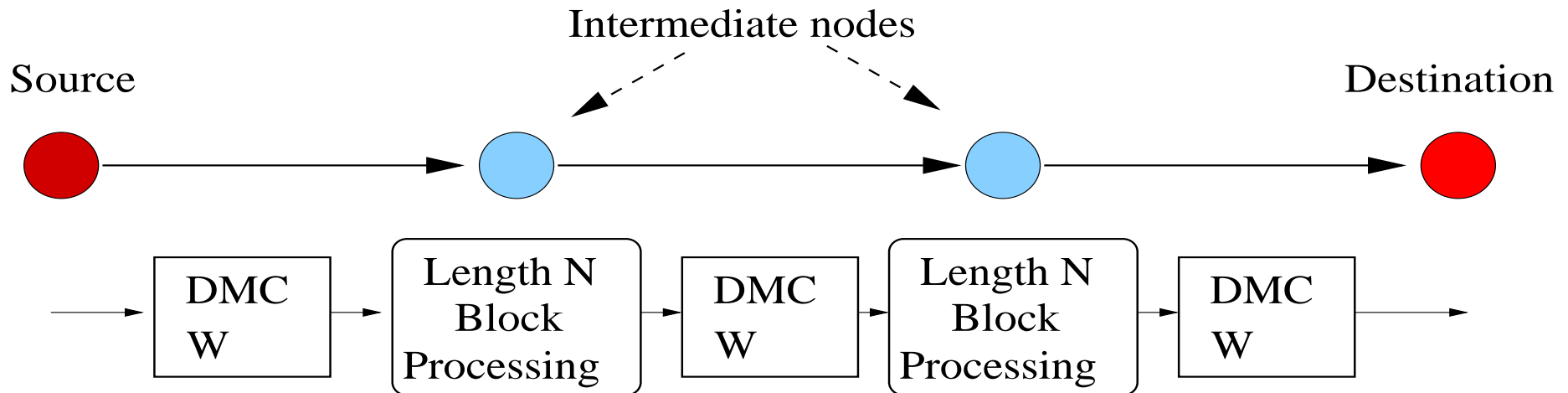


# Line Networks



$$\mathbf{W}_{\text{eq}} \triangleq \mathbf{W}^{\otimes N} \prod_{\ell=1}^{L-1} (\mathbf{M}_{\ell} \mathbf{W}^{\otimes N}) = \mathbf{W}_{\text{eq}}(\mathbf{M}_1, \dots, \mathbf{M}_{L-1})$$

# Line Networks



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$$C_{N,L}(\mathbf{W}) \triangleq \max_{\{M_{\ell}\}_{\ell=1}^{L-1}} \max_{\mathbf{p}} \frac{1}{N} I(\mathbf{p}, \mathbf{W}_{\text{eq}})$$

# Line Networks: Main Results

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- In general

$$\underbrace{\frac{1}{N} \log M_0(\mathbf{W}^{\otimes N})}_{\text{zero-error achievable rate}} \leq C_{N,L}(\mathbf{W}) \leq \underbrace{C(\mathbf{W})}_{\text{min-cut capacity}}$$

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- Finite  $N$  &  $L \rightarrow \infty$  (Allerton 2005)

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# Line Networks: Main Results - cont.

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• For  $N = \Theta(\log L)$  &  $L \rightarrow \infty$

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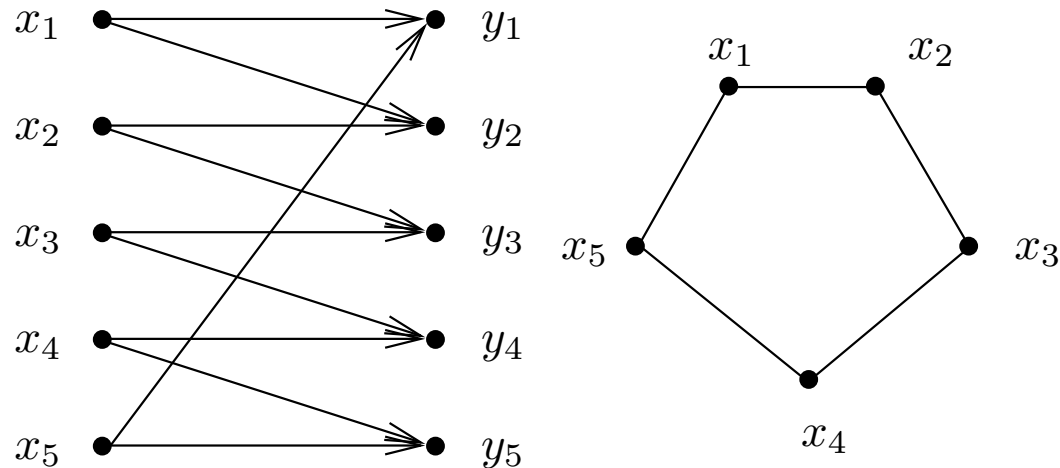
- $N = \Theta(\log L)$  *sufficient* for all  $\alpha \in [0, 1]$  (ISITA 2004)

- $N = \Theta(\log L)$  *necessary* for all  $\alpha \in [\beta, 1]$  (ISIT 2006)

$$\beta = \frac{\lim_{m \rightarrow \infty} \frac{1}{m} \log \text{rank}(\mathbf{A}_m) - C_0(\mathbf{W})}{C(\mathbf{W}) - C_0(\mathbf{W})} \geq 0,$$

but we conjecture  $\beta = 0$ .

# Example: The Pentagon Channel



$$M_0(\mathbf{W}) = 2, \quad M_0(\mathbf{W}^{\otimes 2}) = 5$$

$$C_0(\mathbf{W}) = \frac{1}{2} \log 5 \quad \text{achieved by} \quad N = 2$$

# Example: The Pentagon Channel

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- For an infinite cascade of “pentagon” channels

$$\lim_{L \rightarrow \infty} C_{1,L}(\mathbf{W}) = \log 2, \quad \lim_{L \rightarrow \infty} C_{2,L}(\mathbf{W}) = \frac{1}{2} \log 5$$

i.e.,  $N = 2$  is optimal if  $N$  is restricted to be finite.

- With forwarding

$$\lim_{L \rightarrow \infty} C(\mathbf{W}^L) = \log 1 = 0,$$

and this limit is approached exponentially fast.

- Intermediate processing, as simple as one-symbol processing, is *necessary* if a non-vanishing throughput is to be achieved in a long line network.

# Example: The Pentagon Channel

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About

$$\mathbf{W}^{\otimes m} = \delta_m \mathbf{A}_m + (1 - \delta_m) \mathbf{B}_m$$

we can find

$$\text{rank}(\mathbf{A}_1) = 3$$

$$\text{rank}(\mathbf{A}_2) = 8 < \text{rank}(\mathbf{A}_1)^2 = 9$$

$$\beta \leq \frac{\frac{1}{2} \log 8 - \frac{1}{2} \log 5}{C(\mathbf{W}) - \frac{1}{2} \log 5}$$

Is logarithmic growth is necessary for  $0 < \alpha < \beta$ ?



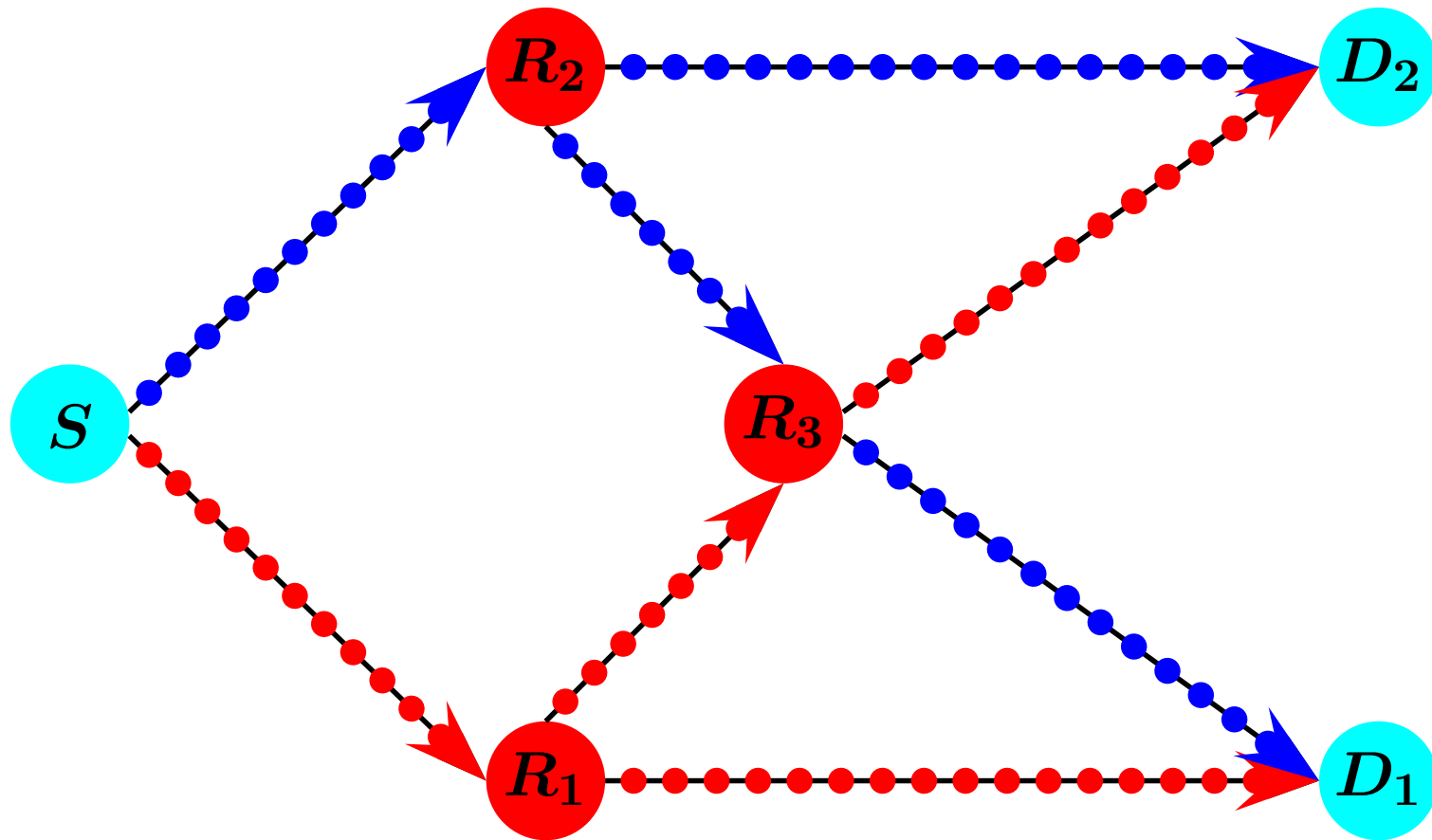
# General Networks?

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... work in progress ...

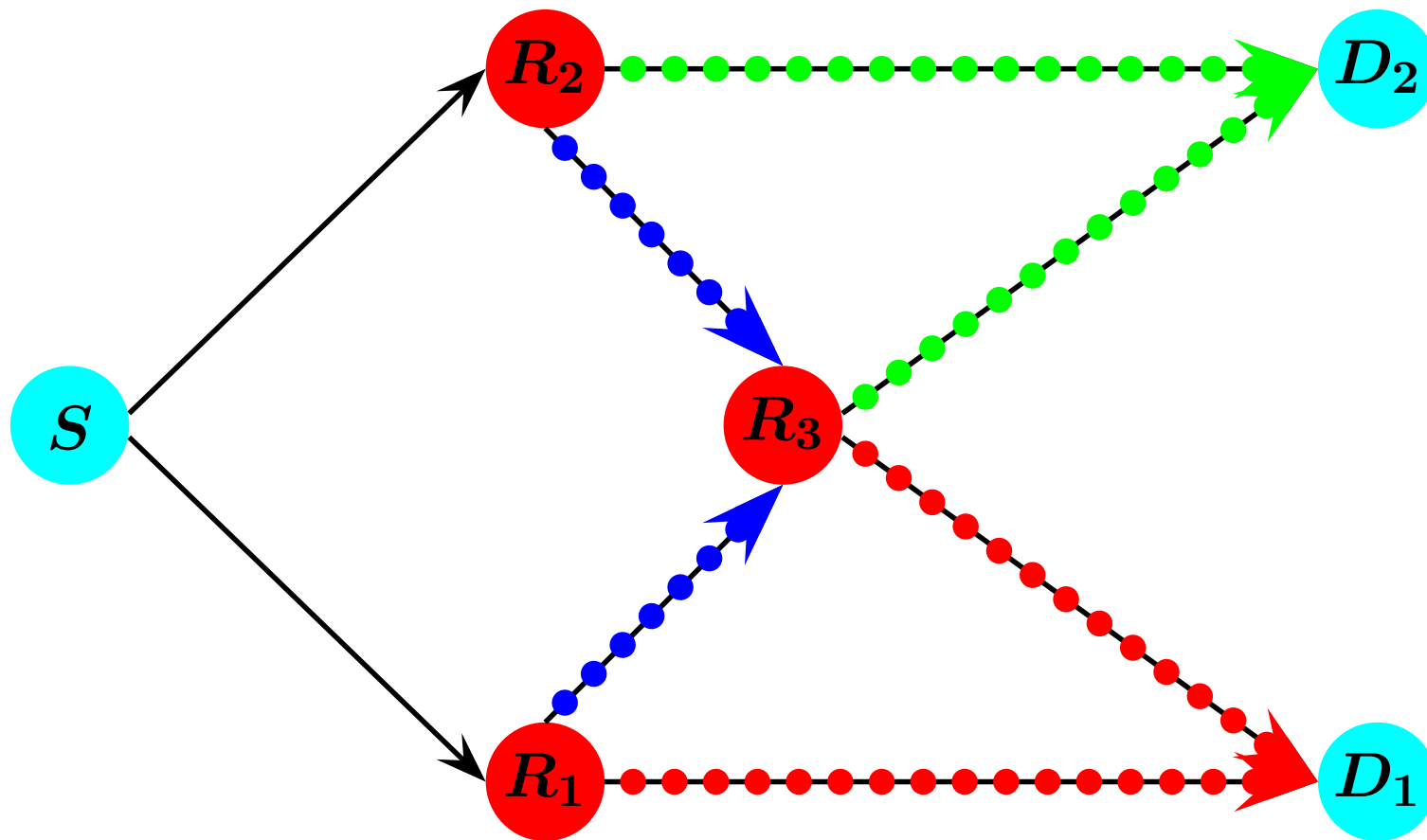
# Networks of Interfering Links

Non-interfering links

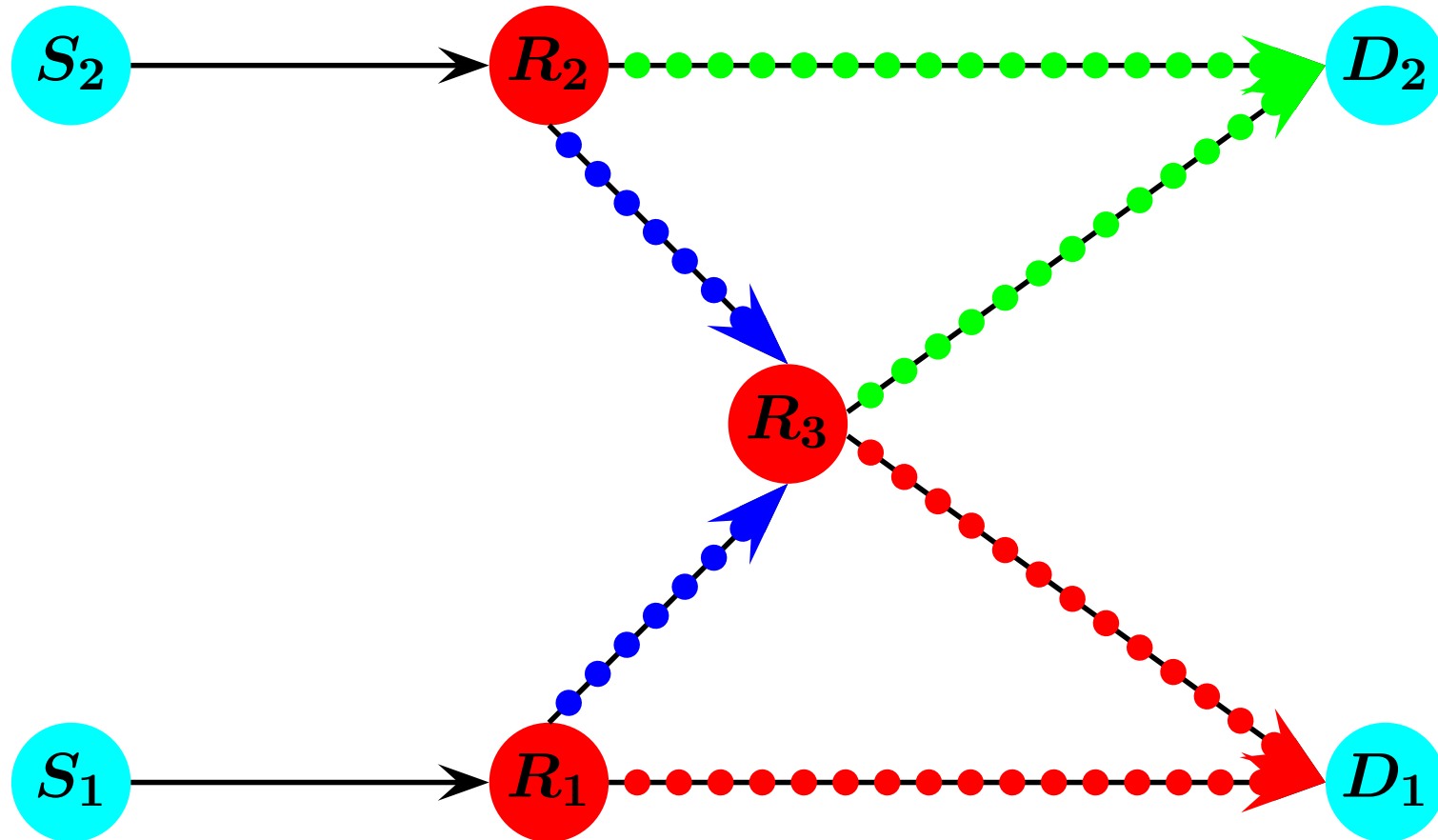


# Networks of Interfering Links

Interfering links



# The bow-tie example



# Conclusions

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- The “classical” Network Coding model implicitly assumes channel orthogonalization at MAC, the use of capacity achieving codes at PHY.  
Goal: “smartly” route information at NET.
- Including noise & link interactions makes the model more general :-)
- ... however more difficult :-)
- We tried to capture in our model some “practical” constraints ...
- ... at least we continue to have fun!