

# Distributed Rate Control for Video Streaming with Intersession Network Coding

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# Outline

- Introduction
- General Rate Control over NC
- Video Rate Control over NC
- Performance Evaluation
- Summary

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  - Motivation
  - Problem Statement
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# Motivation

## Video Streaming



**Maximize  
video quality**

- Transmission history
- Packet deadlines
- Distortion values
- Packet dependencies
- Channel state

## Network Coding

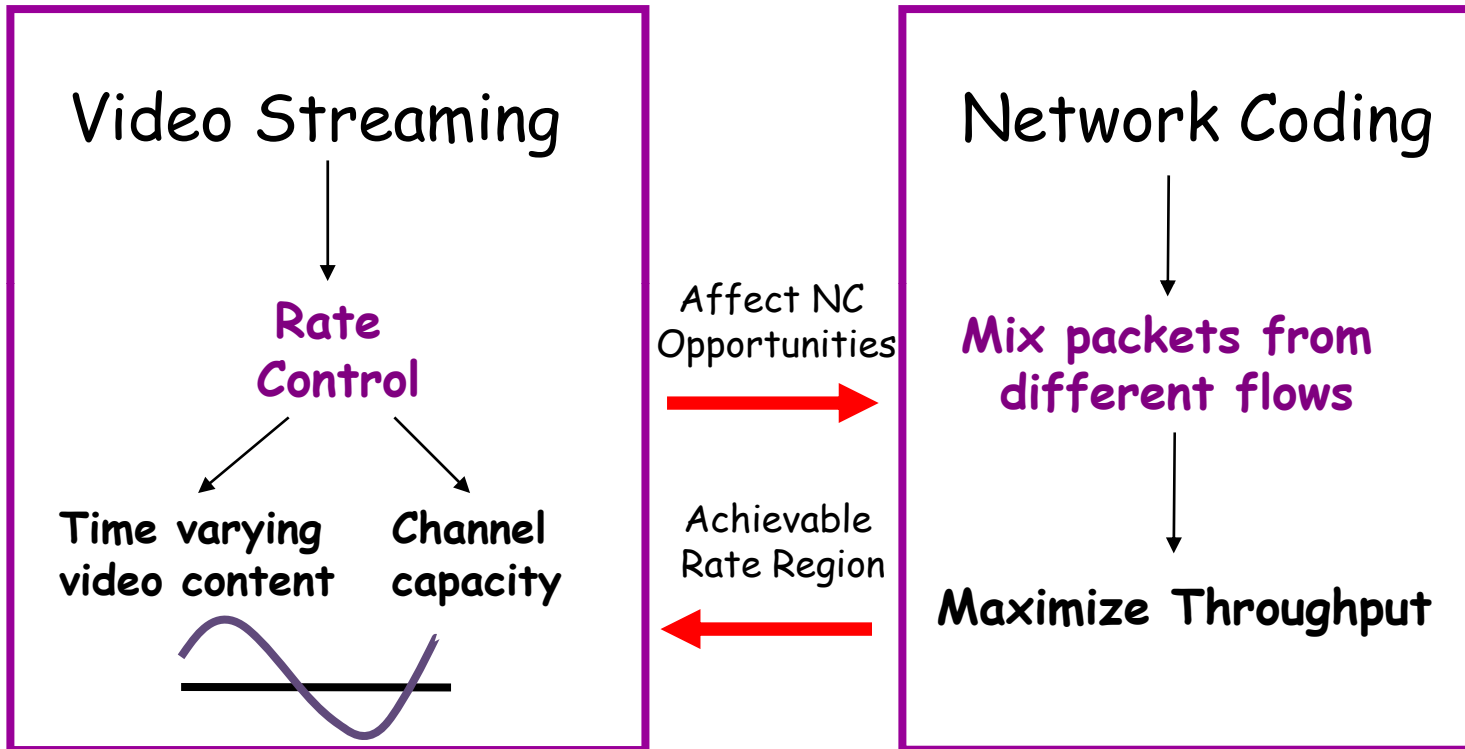


**Mix packets from  
different flows**



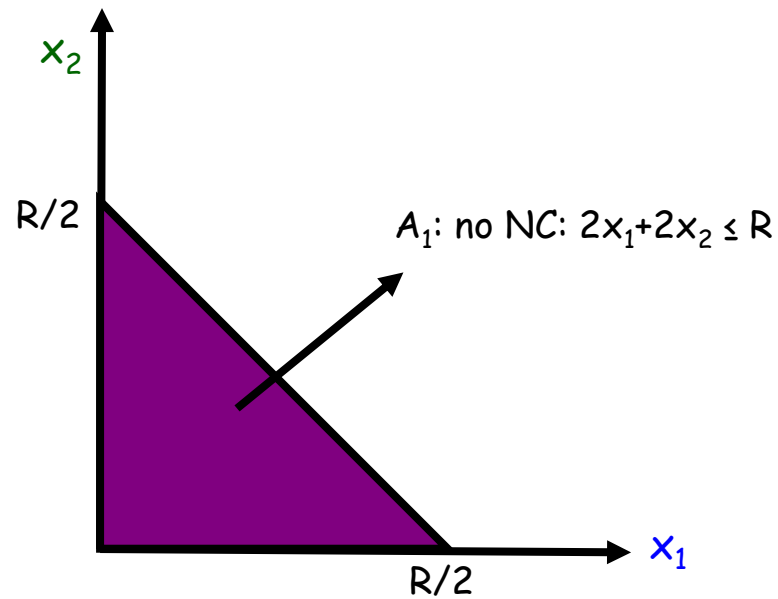
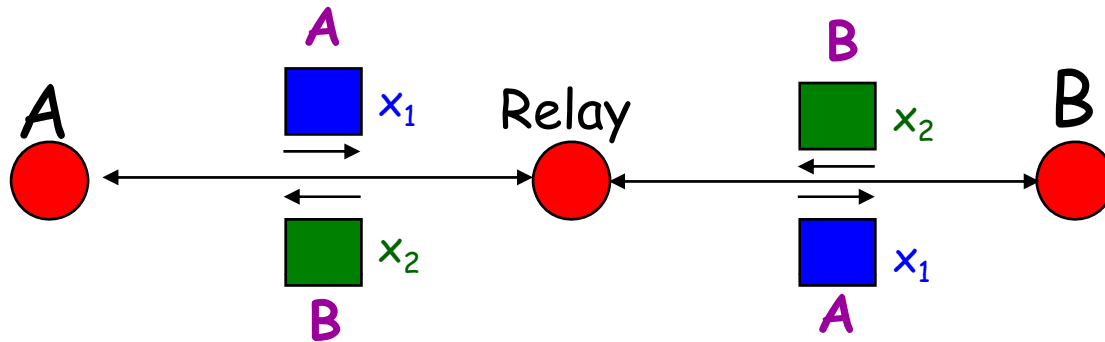
**Maximize Throughput**

# Motivation

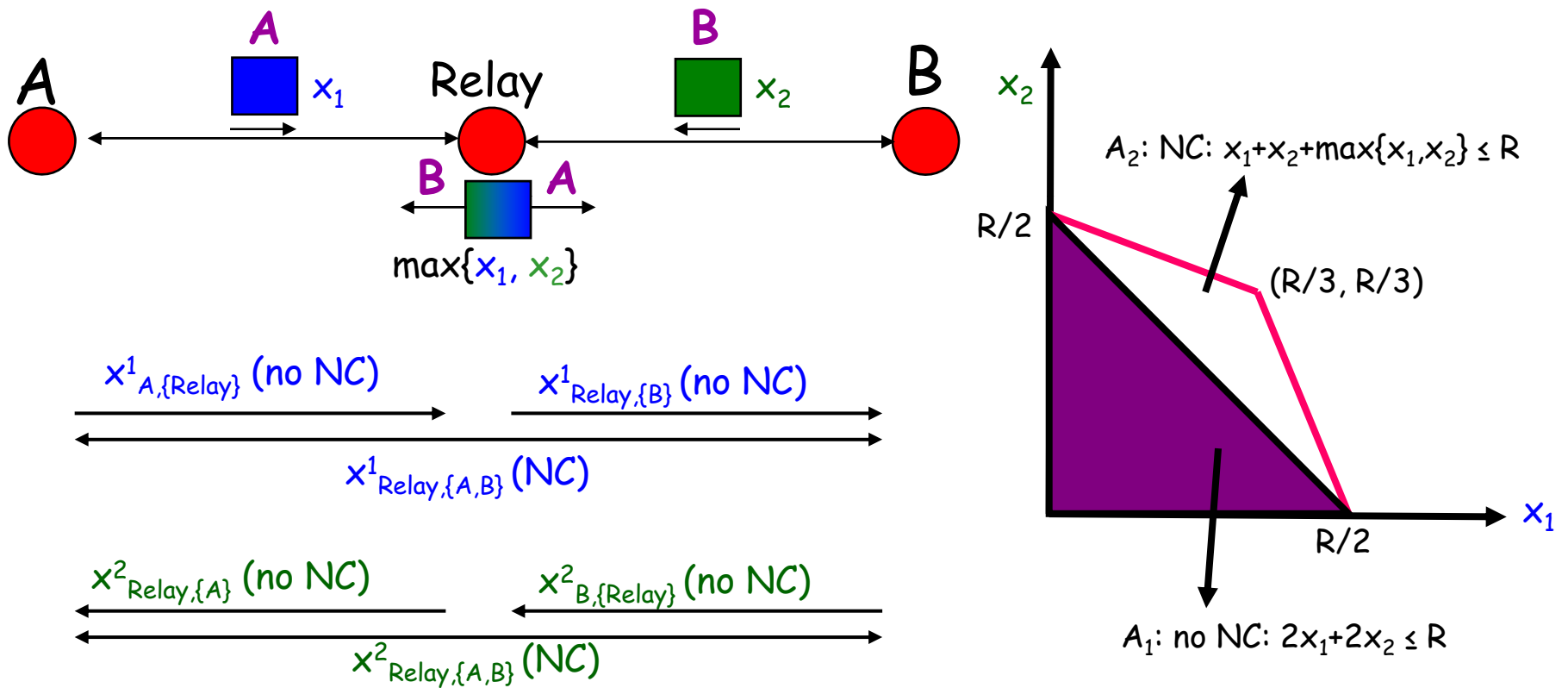


Interaction of rate control and network coding

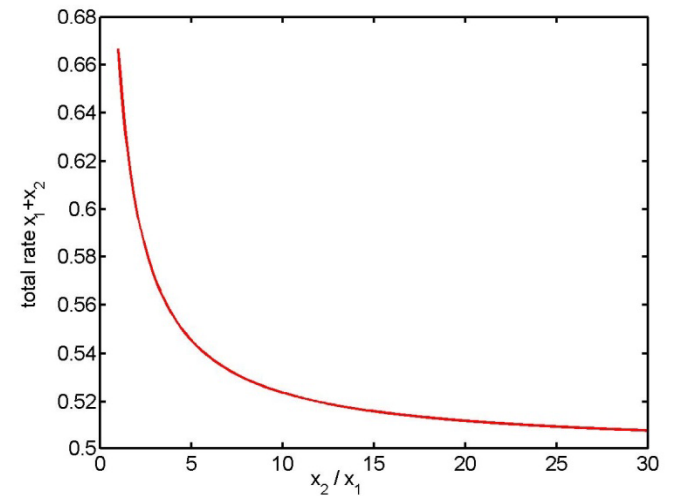
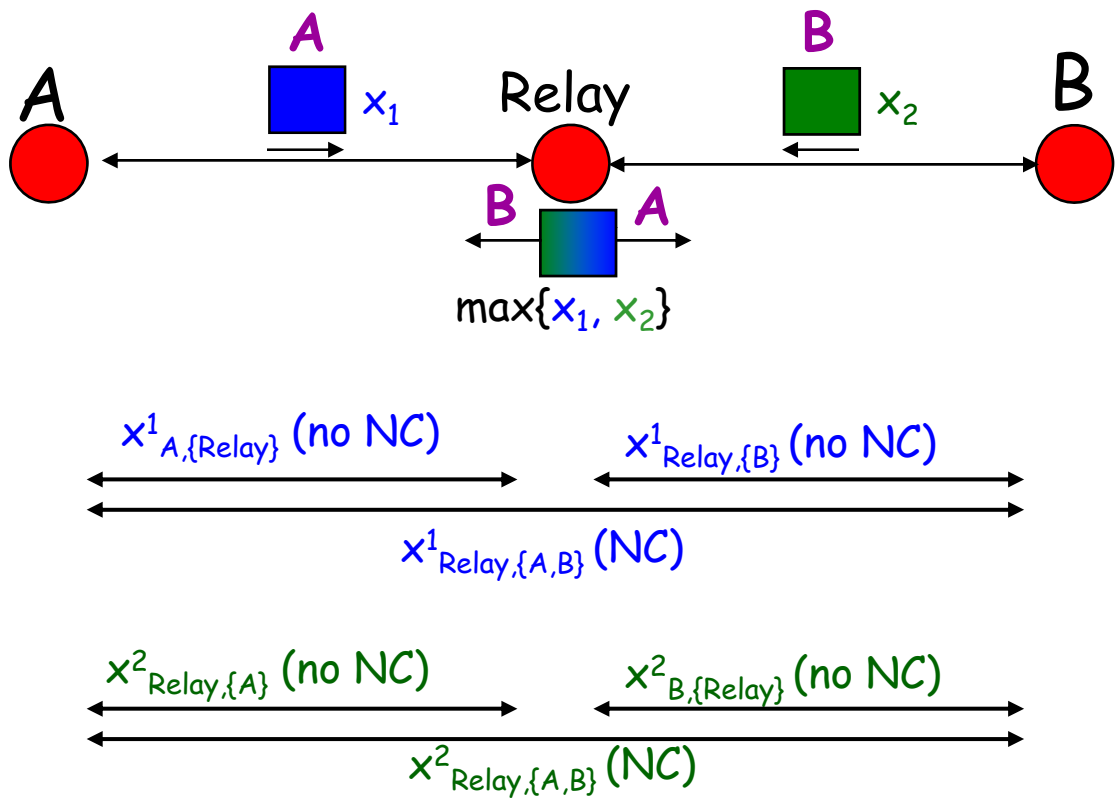
# No Network Coding (achievable region)



# Network Coding for Wireless (achievable region)



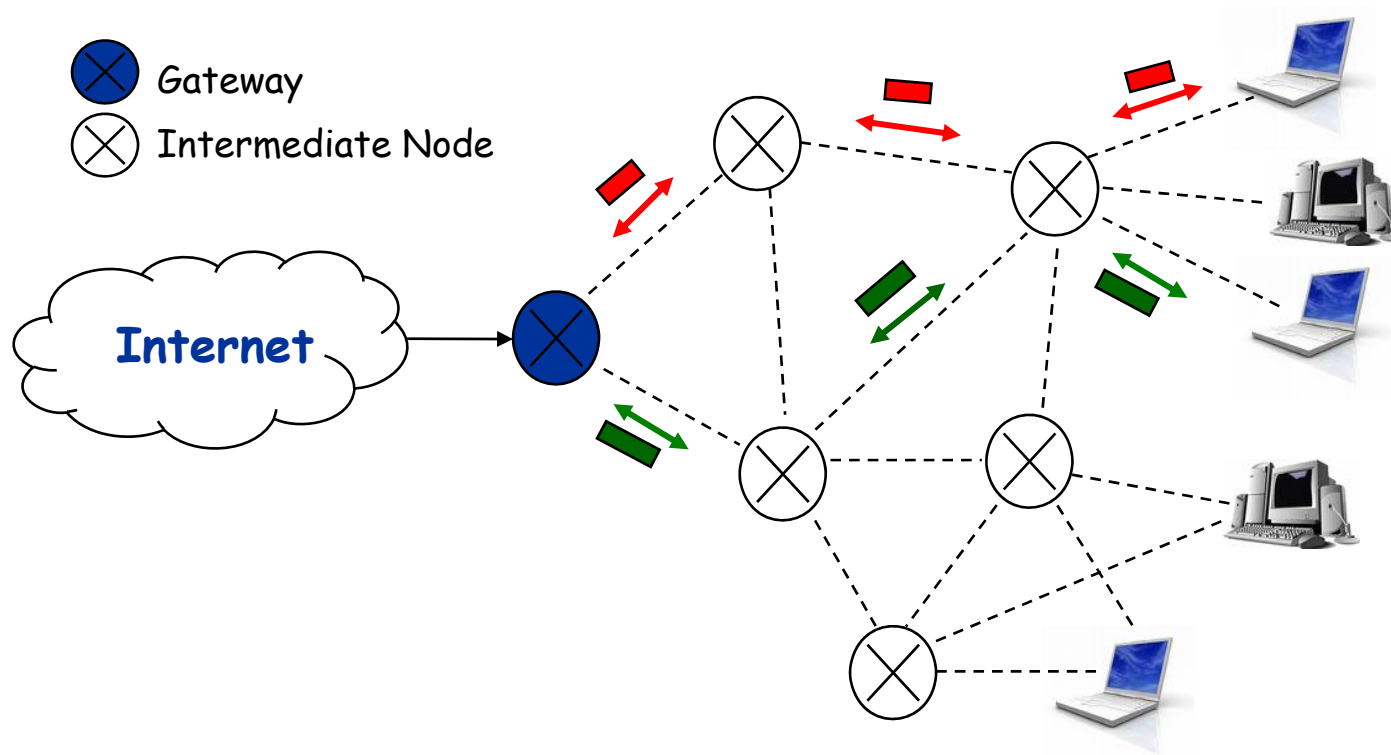
# Network Coding for Wireless (achievable region)





# Problem Statement:

Rate control for video with network coding



Optimal e2e rate and network coding in the core !

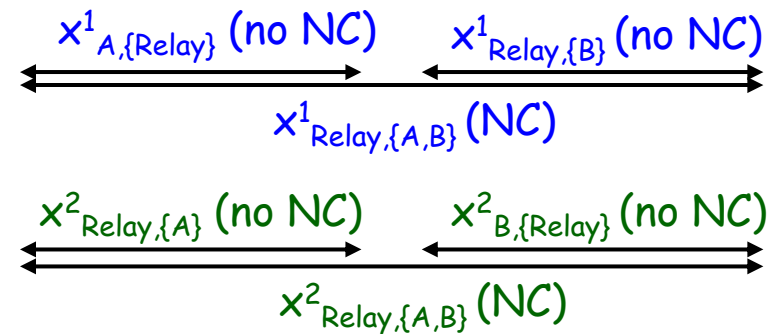
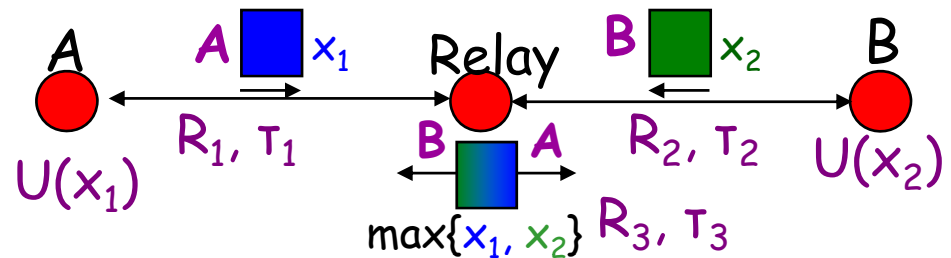
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  - Formulation
  - Distributed Solution
  - Convergence
- Video Rate Control over NC
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# General Rate Control over NC

## Formulation

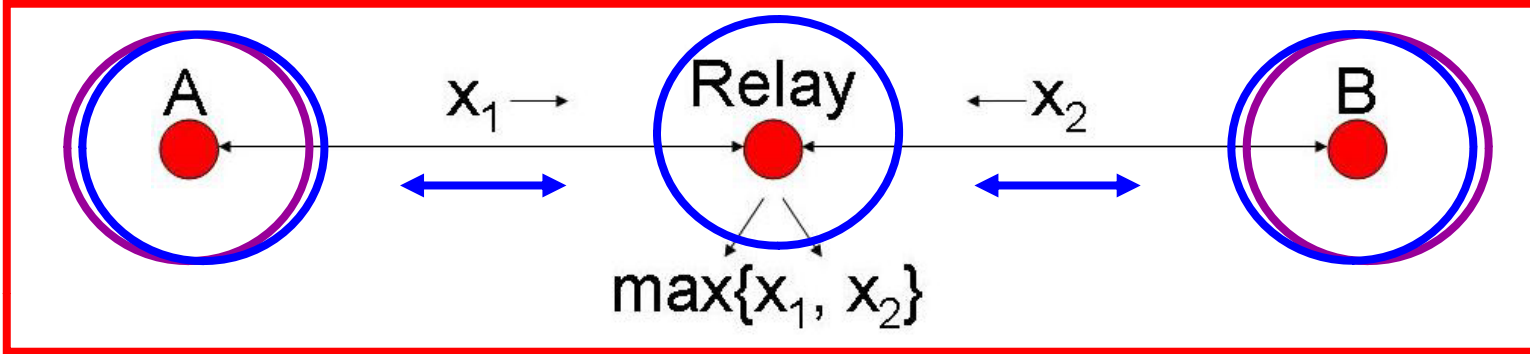
$$\begin{aligned} \max_{x, \tau} \quad & \sum_{s \in S} U_s(x_s) && \text{Optimize total utility} \\ \text{s.t.} \quad & x_s = \sum_{\{J|(i,J) \in A, i \in I_s\}} x_{i,J}^s && \text{Flow Conservation} \\ & z_{i,J}^k = R_{i,J} \tau_{i,J}^k && \text{Available Capacity} \\ & \sum_{(i,J) \in A_c^q} \sum_{k \in K} \tau_{i,J}^k \leq \gamma && \text{Interference} \\ & H_{i,J}^s x_{i,J}^s \leq z_{i,J}^k \xi_{i,J}^s && \text{Capacity constraint} \end{aligned}$$



$$\begin{aligned} \max \quad & U(x_1) + U(x_2) \\ x_1 = x_{A,\{Relay\}}^1 &= x_{Relay,\{B\}}^1 + x_{Relay,\{A,B\}}^1 \\ x_2 = x_{B,\{Relay\}}^2 &= x_{Relay,\{A\}}^2 + x_{Relay,\{A,B\}}^2 \end{aligned}$$

# General Rate Control over NC

## Distributed solution



### Rate Control

$$\begin{aligned} \max_{x_s} \quad & U_s(x_s) - \sum_{i \in I_s} \sum_{\{J|(i,J) \in A, i \in I_s\}} q_{i,J}^{\eta_{i,J}(s),s} H_{i,J}^s x_{i,J}^s \\ \text{s.t.} \quad & x_s = \sum_{\{J|(i,J) \in A, i \in I_s\}} x_{i,J}^s, \quad \forall s \in S \\ & x_s, x_{i,J}^s \geq 0, \quad \forall (i,J) \in A \end{aligned}$$

### Scheduling

$$\begin{aligned} \max_{\tau} \quad & \sum_{(i,J) \in A} \sum_{k \in K} R_{i,J} \tau_{i,J}^k Q_{i,J}^k \\ \text{s.t.} \quad & \sum_{(i,J) \in A_c^q} \sum_{k \in K} \tau_{i,J}^k \leq \gamma, \quad \forall A_c^q \in A_c \\ & \tau_{i,J}^k \geq 0, \quad \forall k \in K, \forall (i,J) \in A. \end{aligned}$$

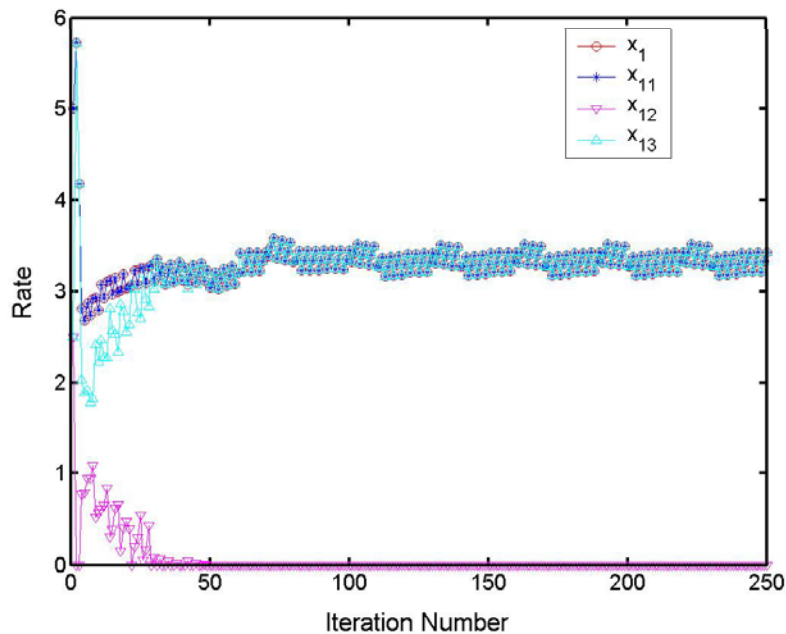
### Parameter Update

$$q_{i,J}^{k,s}(t+1) = \left\{ q_{i,J}^{k,s}(t) + \beta_t \left[ H_{i,J}^s x_{i,J}^s - z_{i,J}^k \xi_{i,J}^s \right] \right\}^+$$

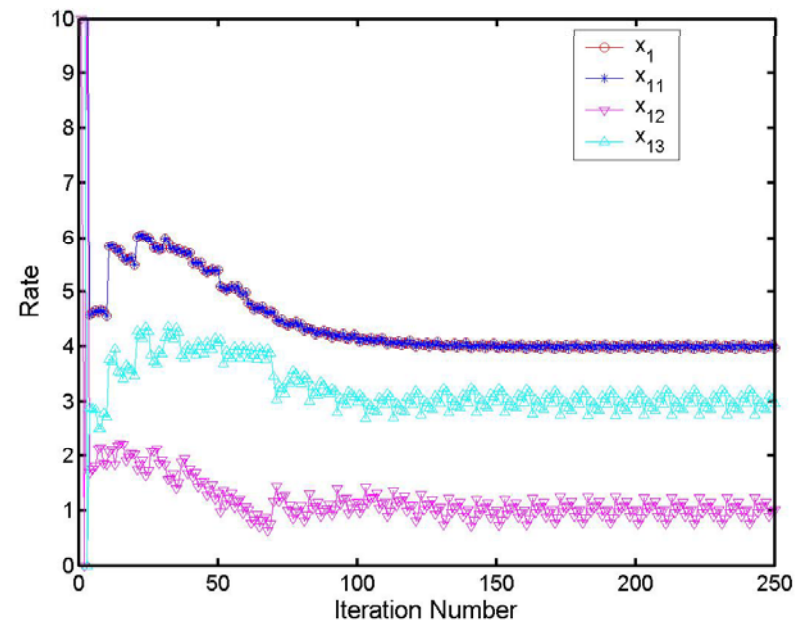
# General Rate Control over NC

## Convergence

**Case I:**  $U_1(x_1) = \log(x_1)$ ,  
 $U_2(x_2) = \log(x_2)$



**Case II:**  $U_1(x_1) = 4\log(x_1)$ ,  
 $U_2(x_2) = \log(x_2)$



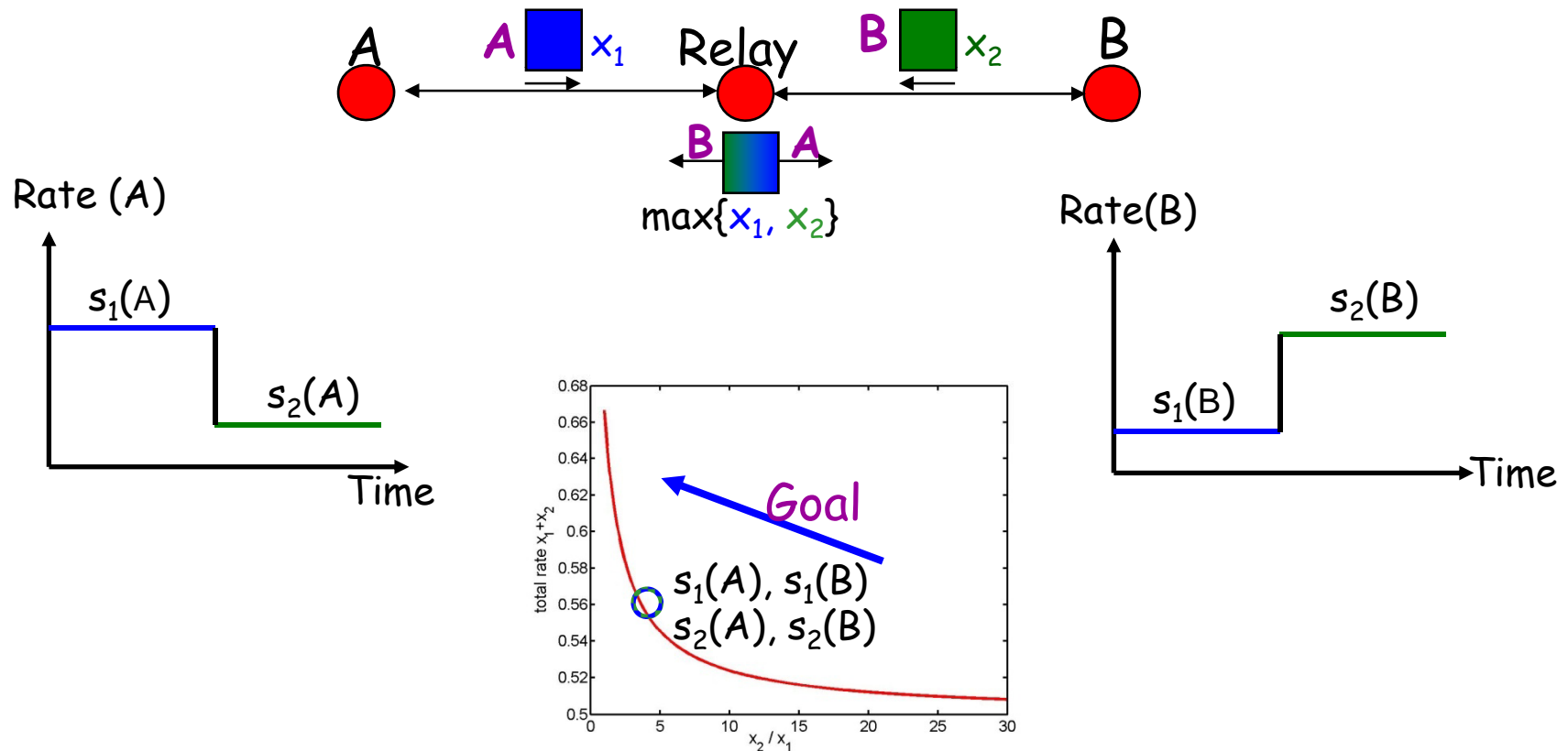
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  - Key Observations
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# Video Rate Control over NC

## Key observations

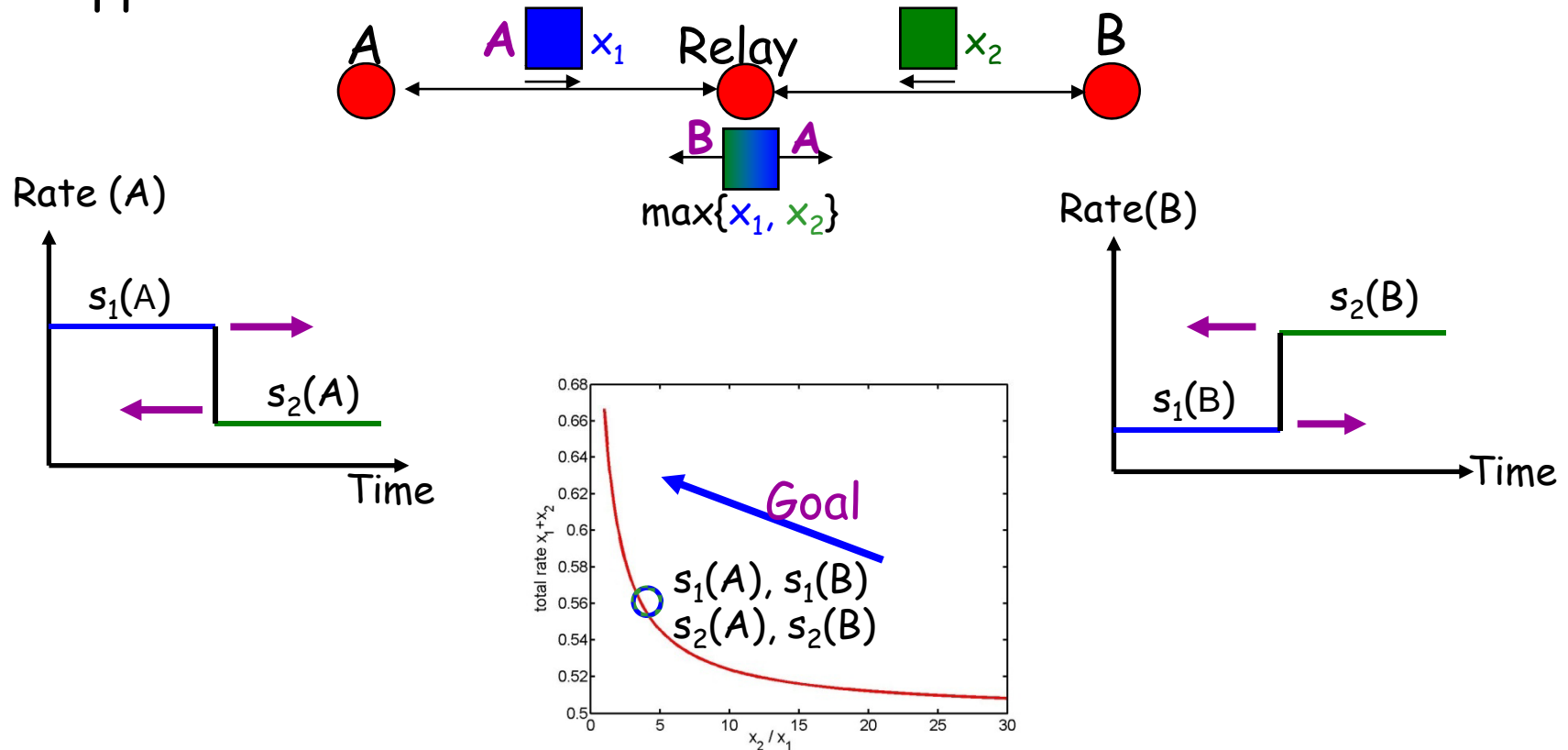
- o **Key observation I:** Video rate requirements affect the underlying network coding opportunities.



# Video Rate Control over NC

## Key observations

- o **Key observation II:** Delaying some scenes and optimizing the rate allocation create more network coding opportunities.

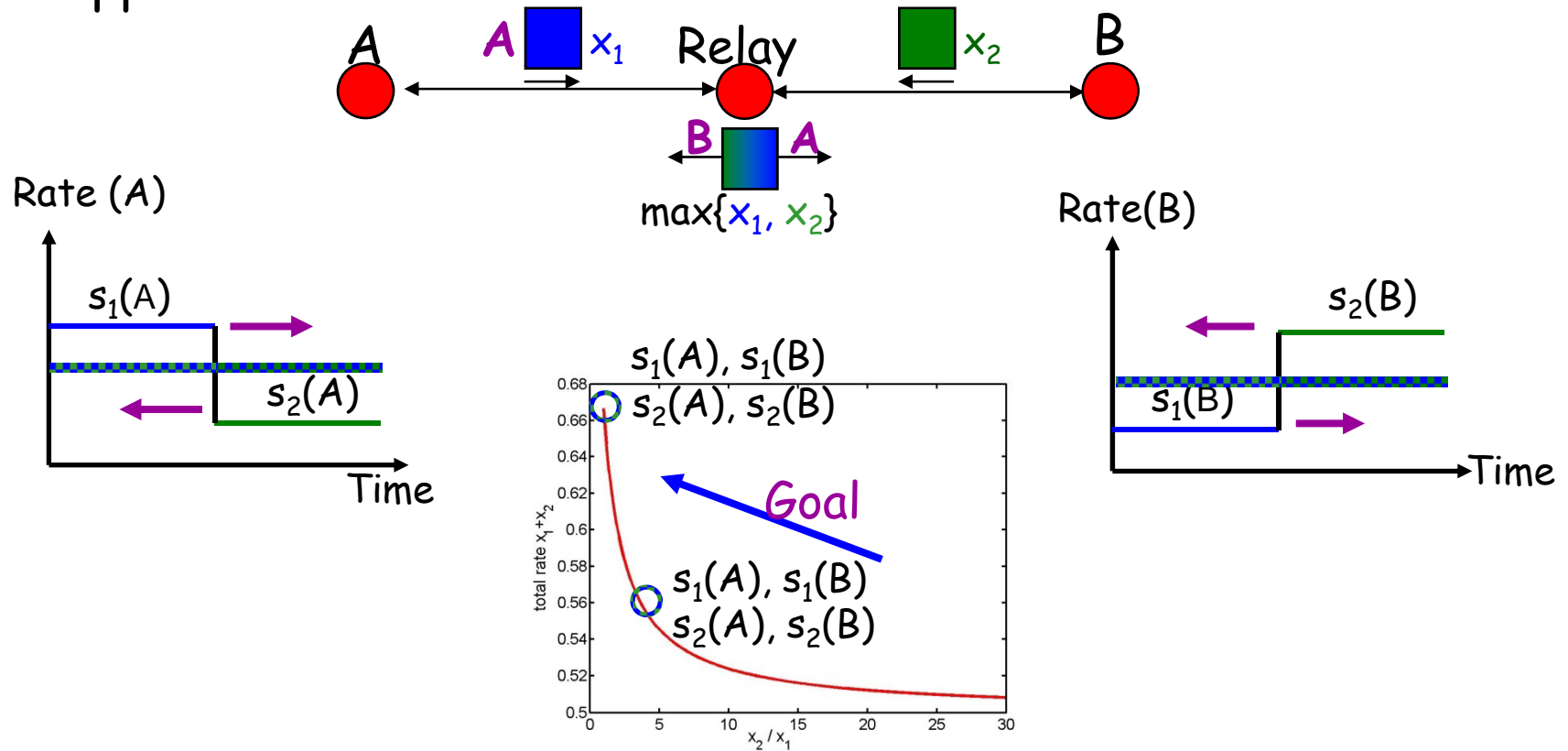




# Video Rate Control over NC

## Key observations

- o **Key observation II:** Delaying some scenes and optimizing the rate allocation create more network coding opportunities.



# Video Rate Control over NC

## Formulation

$$\max_{x, \tau} \sum_{s \in \mathcal{S}} \sum_{f \in F_s} U_s(x_s(f)) \delta(f)$$

Maximize total scene utilization

$$s.t. \quad x_s(f) = \sum_{\{J | (i, J) \in A, i \in I_s\}} x_{i, J}^s(f)$$

Scene duration

$$z_{i, J}^k = R_{i, J} \tau_{i, J}^k$$

$$\sum_{(i, J) \in A_c^q} \sum_{k \in K} \tau_{i, J}^k \leq \gamma$$

$$\sum_{f \in F_s} H_{i, J}^s x_{i, J}^s(f) \leq z_{i, J}^k \xi_{i, J}^s$$

Multiple scenes from a source

$$x_s(f) \geq x_s^{\min}(f)$$

Satisfy minimum rate requirement of each scene

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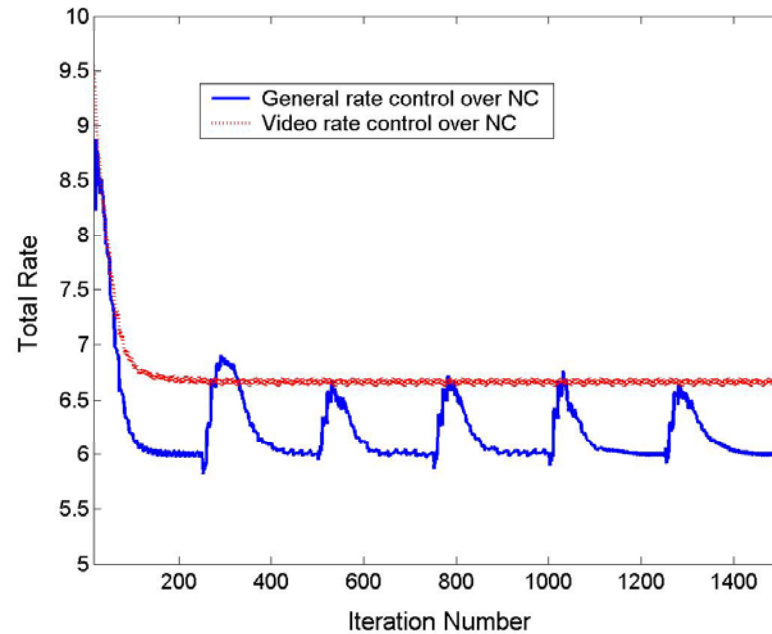
# Performance Evaluation

## Log utilities - setup

- o A and B example
- o Two sequences with six scenes
- o Scenes consist of 250 packets
- o Utility function of each stream;
  - o  $U_1 = [4\log x_1(1), \log x_1(2), 4\log x_1(3), \log x_1(4), 4\log x_1(4), \log x_1(4)]$
  - o  $U_2 = [\log x_2(1), 4\log x_2(2), \log x_2(3), 4\log x_2(4), \log x_2(4), 4\log x_2(4)]$
- o Channel capacity of each link is considered as 10 packets/transmission

# Performance Evaluation

## Log utilities - results



Scene Number	1	2	3	4	5	6
General Rate Control over NC	4.53	2.01	4.23	2.00	4.23	2.00
Video Rate Control over NC	4.98	2.04	4.66	2.00	4.66	2.00

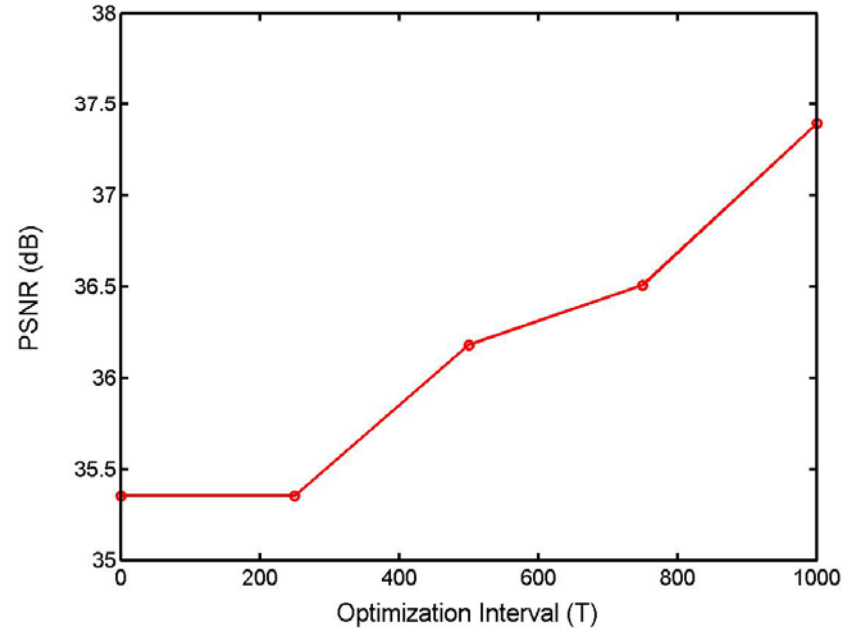
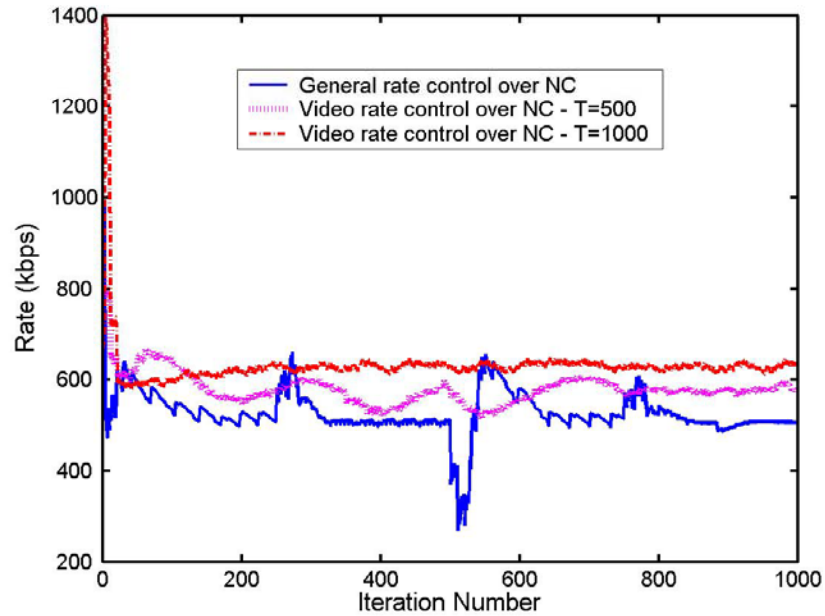
# Performance Evaluation

## Real video - setup

- o A and B example
- o Two sequences with six scenes
- o Scenes consist of QCIF size video sequences; Carphone, Foreman, Grandma, Mother & Daughter. 30 fps, IPP.. structure, average packet size is 1000B.
- o Utility function of each stream determined according to DR curve and weighted according to content;
  - o  $w_1=[0.19, 4.45, 0.18, 3.57]$
  - o  $w_2=[2.56, 0.19, 2.56, 0.14]$
- o Channel capacity of each link is considered as 1Mbps.

# Performance Evaluation

## Real video - results



# Summary

- Proposed distributed rate control schemes for video streaming over wireless networks with intersession network coding.
- Improved total rate and video quality.
- Ongoing work...