・ロト ・日ト ・ヨト ・ヨト

# Impact of FEC Overhead on Scalable Video Streaming

#### Seong-ryong Kang and Dmitri Loguinov

Department of Computer Science Texas A&M University College Station, TX 77843

June 14, 2005

・ロン ・回 と ・ ヨン・

크



- Motivation
- Background
- Impact of FEC on Scalable Video
- Adaptive FEC Control
- Evaluation
- Conclusion

◆□ > ◆□ > ◆臣 > ◆臣 > ○

크

# Outline

#### Motivation

- Background
- Impact of FEC on Scalable Video
- Adaptive FEC Control
- Evaluation
- Conclusion

#### Motivation

Background Impact of FEC on Scalable Video Adaptive FEC Control Evaluation Conclusion

(ロ) (四) (三) (三) (三) (三)

# Motivation of this work

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 4/30

#### Motivation

Background Impact of FEC on Scalable Video Adaptive FEC Control Evaluation Conclusion

(ロ) (四) (三) (三) (三) (三)

# Motivation of this work

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 4/30

#### Motivation of this work

• Internet streaming is an important part of the Internet

- Internet streaming is an important part of the Internet
- Streaming applications usually require special mechanisms that can overcome packet loss without utilizing retransmission

イロト イヨト イヨト イヨト

- Internet streaming is an important part of the Internet
- Streaming applications usually require special mechanisms that can overcome packet loss without utilizing retransmission
- FEC is often considered for recovering lost data segments

イロト イヨト イヨト イヨト

- Internet streaming is an important part of the Internet
- Streaming applications usually require special mechanisms that can overcome packet loss without utilizing retransmission
- FEC is often considered for recovering lost data segments
- However, studies reported conflicting results on the benefits of FEC

イロト イヨト イヨト イヨト

- Internet streaming is an important part of the Internet
- Streaming applications usually require special mechanisms that can overcome packet loss without utilizing retransmission
- FEC is often considered for recovering lost data segments
- However, studies reported conflicting results on the benefits of FEC
- Our work aims to:
  - address this uncertainty and
  - provide additional insight into understanding how FEC overhead affects the performance of scalable video streaming

◆□ > ◆□ > ◆臣 > ◆臣 > ○

크

# Outline

#### Motivation

#### Background

- Impact of FEC on Scalable Video
- Adaptive FEC Control
- Evaluation
- Conclusion

# Background

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 6/30

イロト イヨト イヨト イヨト

# Background

#### FEC

- FEC schemes require application servers to send extra information along with the original data
- Media independent FEC
  - Based on (N, k) block codes (such as parity or Reed-Solomon codes), where N is the size of an FEC block and k is the number of FEC packets in the block
- All data packets are recovered if the number of lost packets in a block is no more than  $\boldsymbol{k}$
- If more than k packets are lost, none of them can be recovered by the receiver

# Background

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 7/30

イロト イヨト イヨト イヨト

# Background

#### FGS

- Streaming profile of the ISO/IEC MPEG-4 standard
- Method of compressing residual video signal into a single enhancement layer
- Allows application servers to scale the enhancement layer to match variable network capacity during streaming
- The enhancement layer is typically coded at some fixed bitrate and can be rescaled to any desired bitrate

・ロ・・(四・・モ・・モ・・ 油

# Background

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 8/30

イロト イヨト イヨト イヨト

# Background

 Because of dependency in the enhancement layer, higher sections of FGS cannot be used in decoding the frame without the presence of lower sections

# Background

 Because of dependency in the enhancement layer, higher sections of FGS cannot be used in decoding the frame without the presence of lower sections



・ロト ・日ト ・ヨト ・ヨト

◆□ > ◆□ > ◆臣 > ◆臣 > ○

크

# Outline

#### Motivation

Background

#### • Impact of FEC on Scalable Video

- Adaptive FEC Control
- Evaluation
- Conclusion

◆□> ◆□> ◆臣> ◆臣> ─ 臣

# Analysis of video streaming

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 10/30

・ロン ・回 と ・ ヨ と ・ ヨ と

르

### Analysis of video streaming

• We investigate the performance of FEC-based streaming considering Markov and renewal patterns of packet loss

イロト イヨト イヨト イヨト

### Analysis of video streaming

- We investigate the performance of FEC-based streaming considering Markov and renewal patterns of packet loss
  - We use MPEG-4 FGS as an example and only examine the enhancement layer

# Analysis of video streaming

- We investigate the performance of FEC-based streaming considering Markov and renewal patterns of packet loss
  - We use MPEG-4 FGS as an example and only examine the enhancement layer
- Note that many studies show that Internet packet loss can be captured by Markov models
  - Alternating ON/OFF renewal process can model more general distribution of packet loss and allows heavy-tailed burst lengths

(a)

# Analysis of video streaming

- We investigate the performance of FEC-based streaming considering Markov and renewal patterns of packet loss
  - We use MPEG-4 FGS as an example and only examine the enhancement layer
- Note that many studies show that Internet packet loss can be captured by Markov models
  - Alternating ON/OFF renewal process can model more general distribution of packet loss and allows heavy-tailed burst lengths
- In what follows, we derive the expected amount of *useful* data  $E[Z_j]$  recovered from each frame
  - $Z_j$  is the number of consecutively received packets in a frame j

◆□> ◆□> ◆臣> ◆臣> ─ 臣

# Analysis of video streaming

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 11/30

・ロン ・回 と ・ヨン ・ヨン

3

### Analysis of video streaming

 $\bullet$  Assume that long-term network packet loss is given by p

・ロン ・回 と ・ ヨ と ・ ヨ と

크

### Analysis of video streaming

- Assume that long-term network packet loss is given by p
- Loss process can be modeled by a two-state Markov chain:

(a)

### Analysis of video streaming

- Assume that long-term network packet loss is given by p
- Loss process can be modeled by a two-state Markov chain:



### Analysis of video streaming

- Assume that long-term network packet loss is given by p
- Loss process can be modeled by a two-state Markov chain:



- $\alpha$  and  $\beta$  are transition probabilities
- In the stationary state, probabilities π<sub>0</sub> and π<sub>1</sub> to find the process in each of its two states are given by:

$$\pi_0 = \frac{\beta}{\alpha + \beta}, \ \pi_1 = p = \frac{\alpha}{\alpha + \beta}.$$
 (1)

・ロト ・同ト ・ヨト ・ヨト

◆□> ◆□> ◆臣> ◆臣> ─ 臣

# Analysis of video streaming

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 12/30

◆□ > ◆□ > ◆ □ > ◆ □ >

3

### Analysis of video streaming

• To derive  $E[Z_j]$ , we define:

イロト イヨト イヨト イヨト

#### Analysis of video streaming

- To derive  $E[Z_j]$ , we define:
  - $\bullet \ L$  to be the number of packets lost in an FEC block
  - $\bar{Q} = E[Z_j|L > k]$  to be the expected number of useful video packets recovered from the front of an FEC block when L > k

イロト イヨト イヨト イヨト

### Analysis of video streaming

- To derive  $E[Z_j]$ , we define:
  - $\bullet \ L$  to be the number of packets lost in an FEC block
  - $\bar{Q} = E[Z_j | L > k]$  to be the expected number of useful video packets recovered from the front of an FEC block when L > k
- Then, we have the following result:

### Analysis of video streaming

- To derive  $E[Z_j]$ , we define:
  - $\bullet \ L$  to be the number of packets lost in an FEC block
  - $\bar{Q} = E[Z_j | L > k]$  to be the expected number of useful video packets recovered from the front of an FEC block when L > k
- Then, we have the following result:

#### Lemma 1

Assuming a two-state Markov packet loss and L > k, the expected number of useful video packets recovered per frame is:

$$\bar{Q} = E[Z_j|L > k] = \frac{1-p}{\alpha} \left(1 - (1-\alpha)^H\right),$$
 (2)

where H = N - k is the number of video packets in an FEC block

◆□> ◆□> ◆臣> ◆臣> ─ 臣

# Analysis of video streaming

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 13/30

크

# Analysis of video streaming

#### Theorem 1

Assuming two-state Markov packet loss with average loss probability p, the expected number of useful packets recovered per FEC block of size N is:

$$E[Z_j] = \sum_{i=0}^k P(N,i)H \qquad (3)$$
$$+ \left(\sum_{i=k+1}^N P(N,i)\right) \left(\frac{1-p}{\alpha} \left(1 - (1-\alpha)^H\right)\right),$$

where P(N, i) is the probability of losing exactly i packets out of N transmitted packets.
# Simulation results

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 14/30

◆□> ◆□> ◆豆> ◆豆> ・豆

## Simulation results

 $\bullet\,$  Define  $\psi$  to be the fraction of FEC packets in a block

・ロン ・回 と ・ ヨ と ・ ヨ と …

크

- Define  $\psi$  to be the fraction of FEC packets in a block
- $\bullet\,$  To verify the model, we simulate Markov loss process with two different values of  $\psi\,$

- Define  $\psi$  to be the fraction of FEC packets in a block
- To verify the model, we simulate Markov loss process with two different values of  $\psi$



# Simulation results

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 15/30

・ロン ・回 と ・ ヨ と ・ ヨ と …

3

## Simulation results

- Note that the behavior of expected decoding rate changes for different  $\psi$ 

・ロン ・回 と ・ ヨ と ・ ヨ と …

크

- $\bullet$  Note that the behavior of expected decoding rate changes for different  $\psi$
- The amount of overhead in FEC-based streaming plays a significant role in determining video quality

イロト イヨト イヨト イヨト

- $\bullet$  Note that the behavior of expected decoding rate changes for different  $\psi$
- The amount of overhead in FEC-based streaming plays a significant role in determining video quality
- Next, we derive the utility of received video and examine how FEC overhead affects the quality of video

イロト イヨト イヨト イヨト

- $\bullet$  Note that the behavior of expected decoding rate changes for different  $\psi$
- The amount of overhead in FEC-based streaming plays a significant role in determining video quality
- Next, we derive the utility of received video and examine how FEC overhead affects the quality of video
- $\bullet\,$  Define the utility U as the fraction of received data that is useful for decoding

## Analysis of video streaming

#### Theorem 2

Assuming Bernoulli packet loss in an FEC block of size N, average loss probability p, and FEC overhead rate  $\psi = \eta p$ ,  $(0 < \psi < 1)$ , the utility of received video for each FEC block converges to the following as  $H \to \infty$ :

$$\lim_{H \to \infty} U = \begin{cases} 0 & 0 < \eta < 1\\ 0.5 & \eta = 1\\ \frac{1-\psi}{1-p} & 1 < \eta < 1/p \end{cases}$$
(4)

where  $\eta$  is constant.

(a)

# Simulation results

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 17/30

(ロ) (四) (三) (三) (三) (三)

## Simulation results

• Simulation results under Bernoulli loss

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 17/30

◆□ ▶ ◆□ ▶ ◆ □ ▶ ◆ □ ▶

3

#### Simulation results

Simulation results under Bernoulli loss



イロト イヨト イヨト イヨト

크

#### Simulation results

Simulation results under Bernoulli loss



Note that U indeed converges to 0,0.5 or  $(1 - \psi)/(1 - p)$  depending on the value of  $\psi$  as the streaming rate becomes large

# Simulation results

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 18/30

・ロン ・回 と ・ ヨ と ・ ヨ と …

크

#### Simulation results

• Note that the asymptotic behavior of U in Theorem 2 holds for Markov and renewal patterns of packet loss

(a)

#### Simulation results

• Note that the asymptotic behavior of U in Theorem 2 holds for Markov and renewal patterns of packet loss



・ロト ・回ト ・ヨト ・ヨト

18/30

3

#### Simulation results

• Note that the asymptotic behavior of U in Theorem 2 holds for Markov and renewal patterns of packet loss



Again, U exhibits percolation and converges to 0,0.5 or  $(1-\psi)/(1-p)$  depending on  $\psi$ 

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming

Motivation Impact of FEC on Scalable Video Adaptive FEC Control Evaluation

# Discussion

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming

19/30

イロト イヨト イヨト イヨト

# Discussion

- Effectiveness of FEC depends on how the server uses redundant packets based on packet-loss dynamics
- Using fixed amount of overhead may cause significant quality degradation when packet loss fluctuates

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 19/30

# Discussion

- Effectiveness of FEC depends on how the server uses redundant packets based on packet-loss dynamics
- Using fixed amount of overhead may cause significant quality degradation when packet loss fluctuates

 Simulation results of U for different packet loss p under improper amount of FEC overhead



(a)

◆□ > ◆□ > ◆臣 > ◆臣 > ○

크

# Outline

- Motivation
- Background
- Impact of FEC on Scalable Video
- Adaptive FEC Control
- Evaluation
- Conclusion

◆□ > ◆□ > ◆臣 > ◆臣 > ─ 臣

## Adaptive FEC control

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 21/30

# Adaptive FEC control

#### Needs for adaptive control

- In a practical network environment, packet loss changes dynamically, depending on
  - cross-traffic
  - link quality
  - routing updates, etc
- The amount of FEC needs to be adjusted according to changing packet loss to maintain high end-user utility

(a)

◆□ > ◆□ > ◆臣 > ◆臣 > ─ 臣

## Adaptive FEC control

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 22/30

・ロン ・回 と ・ヨン ・ヨン

3

## Adaptive FEC control

• For adaptive FEC rate control, we use a simple proportional controller:

イロト イヨト イヨト イヨト

## Adaptive FEC control

 For adaptive FEC rate control, we use a simple proportional controller:

$$\psi_i(n) = \psi_i(n - D_i) + \tau \left(\eta p_i(n - D_i) - \psi_i(n - D_i)\right), \quad (5)$$

where index *i* represents flow number,  $p_i(n)$  is the measured average packet loss in the FGS layer for flow *i* during interval *n*,  $\tau$  is the controller's gain parameter,  $D_i$  is the round-trip delay for flow *i*.

・ロト ・回ト ・ヨト ・ヨト

2

# Adaptive FEC control

• For adaptive FEC rate control, we use a simple proportional controller:

$$\psi_i(n) = \psi_i(n - D_i) + \tau \left(\eta p_i(n - D_i) - \psi_i(n - D_i)\right), \quad (5)$$

where index *i* represents flow number,  $p_i(n)$  is the measured average packet loss in the FGS layer for flow *i* during interval  $n, \tau$  is the controller's gain parameter,  $D_i$  is the round-trip delay for flow *i*.

#### Lemma 2

Controller (5) is stable if and only if  $0 < \tau < 2$ .

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 22/30

◆□ > ◆□ > ◆臣 > ◆臣 > ○

크

# Outline

- Motivation
- Background
- Impact of FEC on Scalable Video
- Adaptive FEC Control
- Evaluation
- Conclusion

◆□> ◆□> ◆臣> ◆臣> ─ 臣

#### Packet loss pattern

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 24/30

・ロン ・回 と ・ヨン ・ヨン

3

#### Packet loss pattern

• We simulate a streaming session with a hypothetical packet loss pattern

・ロト ・回ト ・ヨト

3

#### Packet loss pattern

 We simulate a streaming session with a hypothetical packet loss pattern



Motivation Impact of FEC on Scalable Video Adaptive FEC Control Evaluation

# Achieved utility

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming

25/30

(ロ) (四) (三) (三) (三)

<<u>
し
、
<

</>

</u>

3

## Achieved utility

• We investigate adaptive FEC overhead controller (5) with the behavior of achieved utility

・ロン ・回 と ・ ヨ と ・ ヨ と …

크

# Achieved utility

- We investigate adaptive FEC overhead controller (5) with the behavior of achieved utility
  - To illustrate the adaptivity of the controller, we use target utility  $U_T=0.8$

・ロト ・回ト ・ヨト ・ヨト

# Achieved utility

- We investigate adaptive FEC overhead controller (5) with the behavior of achieved utility
  - To illustrate the adaptivity of the controller, we use target utility  $U_T=0.8$
- For comparison, we apply two different scenarios that use fixed amount of overhead
◆□ ▶ ◆□ ▶ ◆ □ ▶ ◆ □ ▶

### Achieved utility

- We investigate adaptive FEC overhead controller (5) with the behavior of achieved utility
  - To illustrate the adaptivity of the controller, we use target utility  $U_T = 0.8$
- For comparison, we apply two different scenarios that use fixed amount of overhead
  - $\bullet\,$  The fixed-overhead amount is driven by the lower and upper bounds on packet loss  $\tilde{p}\,$

• The evolution of achieved utility U

▲口→ ▲圖→ ▲温→ ▲温→

3

#### • The evolution of achieved utility U



ヘロン 人間と 人間と 人間と

#### • The evolution of achieved utility U



- Our adaptive controller maintains the target utility  $U_T$  very well along the entire streaming session
- However, fixed-overhead schemes cannot maintain high utility as packet loss varies

# PSNR quality

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming 27/30

◆□> ◆□> ◆臣> ◆臣> ─ 臣

## **PSNR** quality

 PSNR of CIF Foreman reconstructed with different FEC overhead control

・ロト ・同ト ・ヨト ・ヨト

3

# **PSNR** quality

- PSNR of CIF Foreman reconstructed with different FEC overhead control
- $M_1$  and  $M_2$  use fixed amount of overhead driven by  $\tilde{p}=0.1$  and  $\tilde{p}=0.4$ , respectively

イロト イヨト イヨト イヨト

2

## **PSNR** quality

- PSNR of CIF Foreman reconstructed with different FEC overhead control
- $M_1$  and  $M_2$  use fixed amount of overhead driven by  $\tilde{p}=0.1$  and  $\tilde{p}=0.4$ , respectively



## **PSNR** quality

- PSNR of CIF Foreman reconstructed with different FEC overhead control
- $M_1$  and  $M_2$  use fixed amount of overhead driven by  $\tilde{p} = 0.1$  and  $\tilde{p} = 0.4$ , respectively



- The adaptive method offers as much as 2.5 dB higher PSNR than M<sub>2</sub> for the first 60 frames
- Also, outperforms  $M_1$  by almost 10 dB for the last 40 frames

◆□ ▶ ◆□ ▶ ◆ □ ▶ ◆ □ ▶

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming

27/30

3

◆□ > ◆□ > ◆臣 > ◆臣 > ○

크

#### Outline

- Motivation
- Background
- Impact of FEC on Scalable Video
- Adaptive FEC Control
- Evaluation
- Conclusion

イロト イヨト イヨト イヨト



- FEC has conflicting effects on video quality depending on the amount of overhead used
- Adaptive FEC overhead control can provide a high quality of video to end-users
- Proper control of FEC overhead can significantly improve the utility of received video over lossy channels

Motivation Impact of FEC on Scalable Video Adaptive FEC Control Conclusion

#### Thank you!

Any questions?

S. Kang and D. Loguinov Impact of FEC Overhead on Scalable Video Streaming

30/30

-2

◆□ → ◆□ → ◆三 → ◆三 →