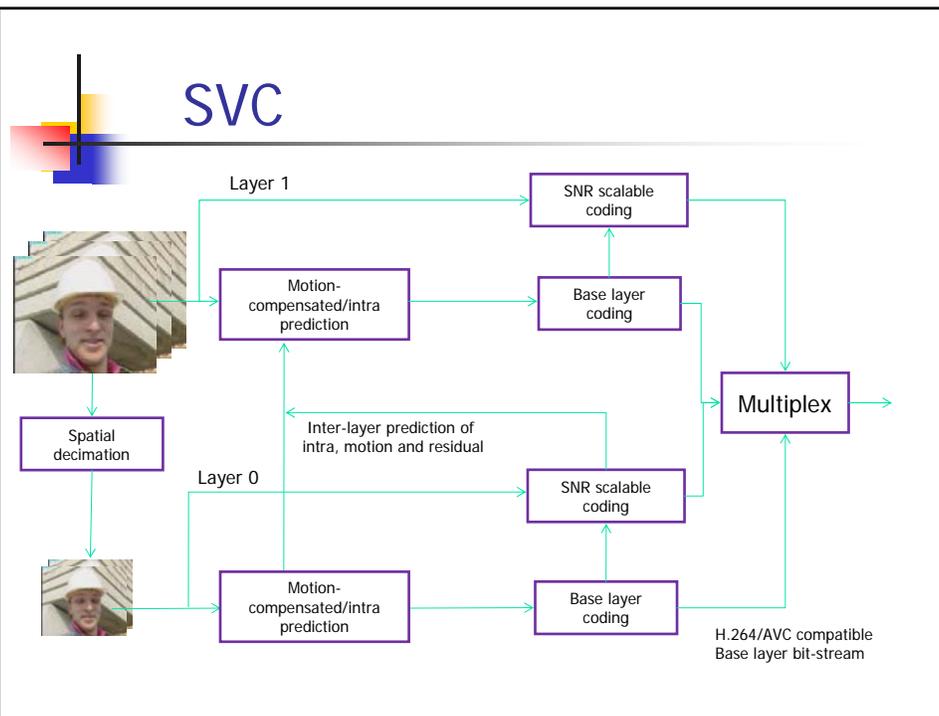


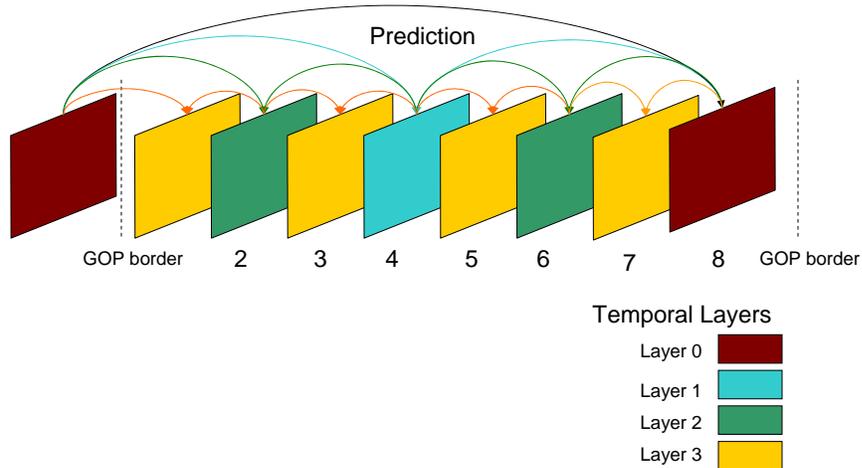
CASE IV

Optimal Rate Extraction and Channel Coding for Scalable Streaming over Packet Lossy Networks



Hierarchical prediction structure

Hierarchical prediction structure in a scalable video encoder

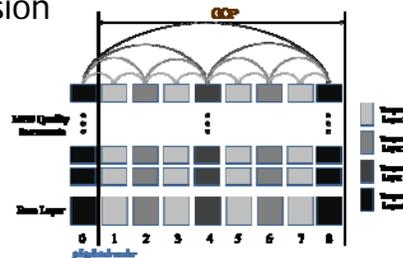


Problem Formulation

- Optimally extract source packets (BL or EL) from an SVC bit stream and allocate channel coding rate for efficient transmission

$$(\phi^*, \psi^*) = \min_{\phi \in \Phi, \psi \in \Psi} E\{D(\phi, \psi)\}$$

$$\text{s.t. } R(\phi, \psi) \leq R_T,$$



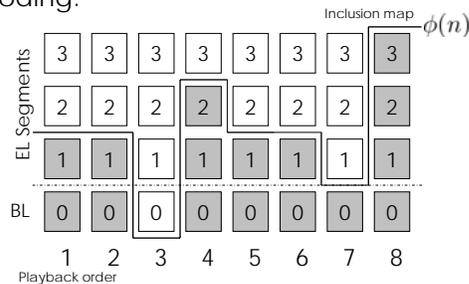
$\phi(n)$ Inclusion map: specifies number of NAL units included for each packet

$\psi(n, q)$ Channel coding map: specifies channel rate of NAL unit

$R(\phi, \psi)$ Total rate of the video stream

Problem Formulation

- The minimization solution, ϕ^* , determines the inclusion map for the group of pictures
- The optimization requires evaluation of the distortion for any ϕ . Since ME/MCP in SVC is conducted using the highest available quality, missing quality increments cause *drift* to propagate to lower temporal levels. Thus, in principle any ϕ requires a decoding.



Distortion Estimation

- Total distortion of a frame originates from two sources:
 - D^d , distortion due to drift, inherited from parent frames
 - D^e , error due to quality increment truncation for the current frame
- Total distortion of frame n , $D_n^t(q)$, is estimated

as

$$\begin{aligned}
 D_n^t(q) &= \|\mathbf{f}_n - \mathbf{f}_n^d + \mathbf{e}_n(q)\|^2 \\
 &= D_n^d + D_n^e(q) + 2(\mathbf{f}_n - \mathbf{f}_n^d)^T \mathbf{e}_n(q) \\
 &\approx D_n^d + D_n^e(q) + 2\kappa \sqrt{D_n^d} \sqrt{D_n^e(q)} \\
 &\leq D_n^d + D_n^e(q) + 2\sqrt{D_n^d} \sqrt{D_n^e(q)}
 \end{aligned}$$

$$0 \leq \kappa \leq 1$$

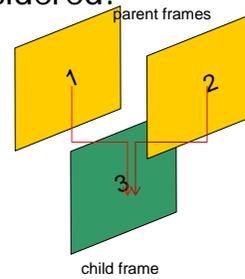
symbol	description
\mathbf{f}_n^d	Reconstructed image when drift exists
$\mathbf{e}_n(q)$	error vector due to inclusion of only q increments
\mathbf{f}_n	fully reconstructed image

Drift Distortion Estimation

■ For any frame n two cases are considered:

- Base layer decodable
 - Find coefficients α_i and β_{ij} from training data and use during optimization

$$D_n^d \approx \sum_{i \in \Lambda_n} \alpha_i D_i^t + \sum_{i \in \Lambda_n} \sum_{j \in \Lambda_n} \beta_{ij} D_i^t D_j^t$$

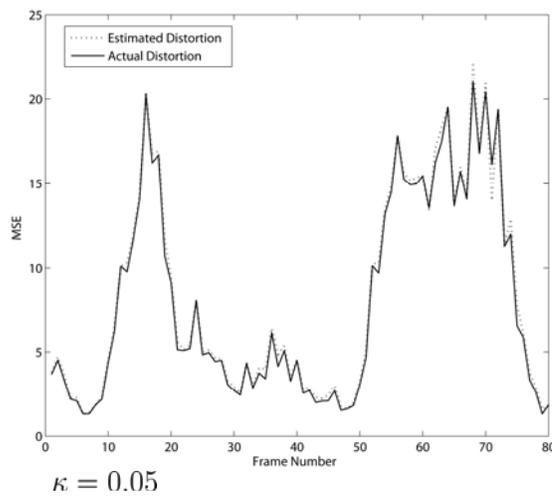


- Base layer missing/undecodable
 - For each concealment option l find μ_i and ν_i from training data and use during the optimization

$$D_{n,i}^{con} \approx \mu_i + \nu_i D_i^t$$

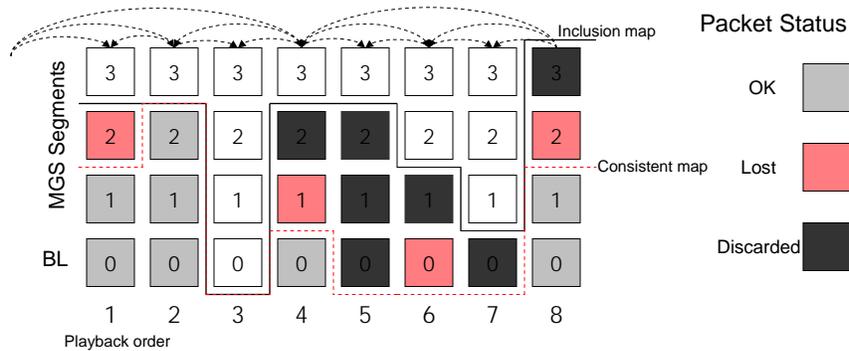
Estimated Distortion

- Estimated vs. actual distortion for a random inclusion path (foreman sequence)



Expected Distortion

Since a packet is not decodable unless all lower level packets (in both temporal and MGS directions) are received intact, any consistent received map that falls below the inclusion map is probable and has to be taken into account for expected distortion

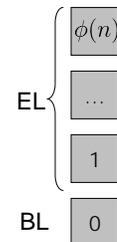


Expected Distortion

- Expected distortion is calculated in two steps. First, the conditional expected distortion given the base layer received is evaluated

$D_n(q)$ The n^{th} frame decoded using q enhancement segments

p_n^q Loss probability of the q^{th} segment of the n^{th} frame EL (BL: $q=0$)



- The conditional ED can be expressed as

$$E\{\tilde{D}_n|BL\} = \sum_{q=1}^{\phi(n)} p_n^q D_n(q-1) \prod_{i=0}^{q-1} (1 - p_n^i) + D_n(\phi(n)) \prod_{i=0}^{\phi(n)} (1 - p_n^i)$$



Expected Distortion

- In case that a base layer is lost, it is concealed using the nearest available (decodable) frame. Using this concealment strategy, the expected frame value is calculated according to

$$E\{\tilde{D}_n\} = \sum_{i \in \Delta_n} p_i^0 D_{n,k}^{con} \prod_{\substack{j \in \Delta_n \\ j < i}} (1 - p_j^0) + E\{\tilde{D}_n|BL\} \prod_{j \in \Delta_n} (1 - p_j^0)$$

Where "k" indicates the nearest temporal ancestor frame

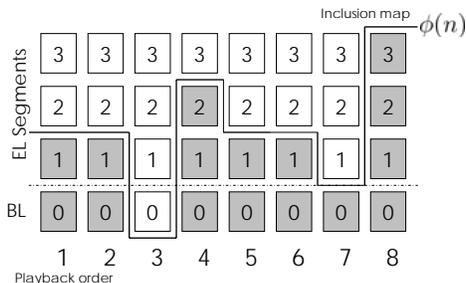
$E\{\tilde{D}_n BL\}$	The n^{th} frame conditional expected value
p_n^0	Loss probability of the of the base layer



Source Optimization

- The base layer of the key picture is given the highest priority and is the first packet to be added. Then, packets are added one at a time based on their global distortion gradient, i.e., at time step i the next quality increment of frame n_i^* is included to the queue:

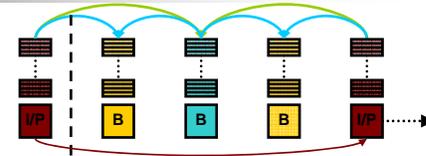
$$n_i^* = \arg \max_n \left| \frac{\partial D(\phi) / \partial \phi(n)}{\partial R_s(\phi) / \partial \phi(n)} \right|$$



Packet Ordering Methods

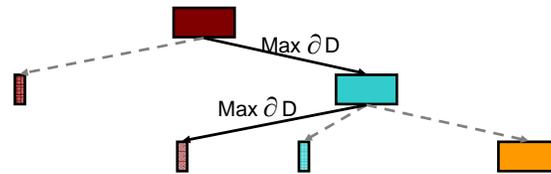
- Basic Extractor

- Base first



- Optimized Extractor

- Maximum D gradient



Joint Source-Channel Optimization

- Similarly to source optimization, inclusion function $\phi(n)$ initially only includes the base layer of the key pictures with an initial channel coding rate less than 1, then

- At each step find

$$\delta ED^* = \max_n \max_{q < \phi(n)} \left| \frac{\partial ED(\phi, \psi) / \partial \psi(n, q)}{\partial R_t(\phi, \psi) / \partial \psi(n, q)} \right|$$

$$\delta ED^* = \max_n \max_{\psi(n, q) \in \Psi} \left| \frac{\partial^2 ED(\phi, \psi) / \partial \phi(n) \partial \psi(n, q)}{\partial^2 R_t(\phi, \psi) / \partial \phi(n) \partial \psi(n, q)} \right|, \quad q = \phi(n)$$

- | | | |
|---|-----------------------------|---|
| { | $\delta ED^* > \delta ED^*$ | channel protection rate of the already included Packet $\pi(n^*, q^*)$ is incremented to the next level by padding additional parity bits |
| | $\delta ED^* < \delta ED^*$ | the source packet $\pi(n^*, q^*)$ is included in the transmission queue with a channel coding rate of $\pi(n^*, q^*)$ |



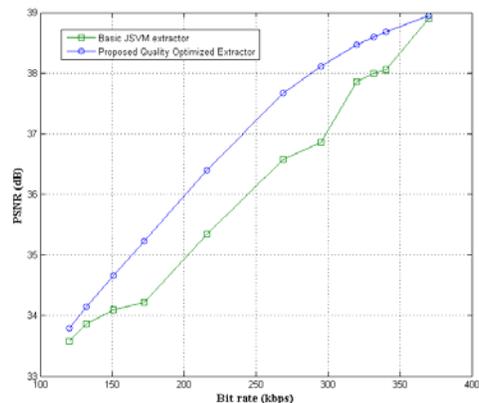
Experimental Results

- Sequences are encoded using the scalable extension of the H.264/AVC (JSVM) reference software
- The GOP size is set to 8 and the base layer is encoded with quantization parameter $QP = 36$. Moreover, one enhancement layer ($QP = 25$) is considered
- The EL is then divided into 5 MGS layers
- For channel coding RS codes with symbol length of 5 are considered
- Bernoulli channel model



Source Optimized Extraction

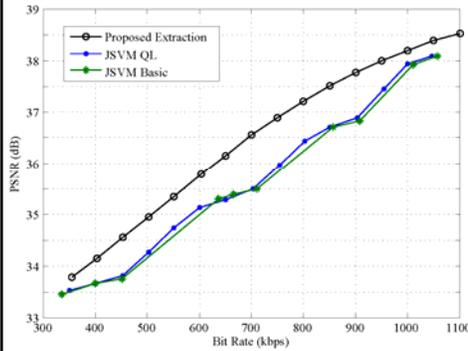
- Foreman QCIF



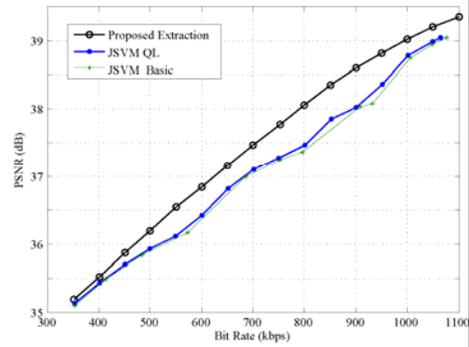


Source Optimized Extraction

City CIF



Foreman CIF



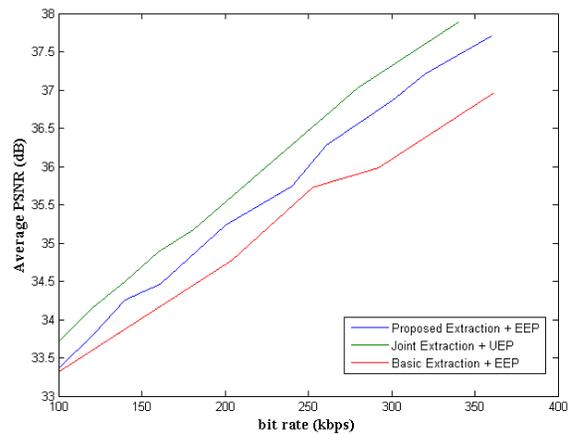
Source and Channel Encoding

Average decoded PSNR for FOREMAN QCIF :

(green) Joint Source Extraction and Channel Coding

(blue) Proposed Optimized Extraction with fixed channel coding (average rate of UEP system used)

(red) Basic extraction with a fixed channel coding rate (average rate of UEP system used)



Packet loss rate before channel coding is 0.10.