Error Concealment for INTRA-frame Losses over Packet Loss Channels

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Abstract. In this paper, we propose an *Error Concealment* algorithm for INTRA-frame losses over packet loss channels. The novelty is that not only the INTRA-frame but also the subsequent INTER-frames are error concealed. We use the received INTRA-MBs to refine their neighbors based on the strong correlation between adjacent pixel values. In addition, *Motion Compensation* is used to reconstruct the INTER-pixel which has an INTRA-pixel in its motion trajectory. Both subjective and objective simulation results are given to demonstrate the performance of our proposed algorithm.

Key words: Error Concealment, Error Propagation, Motion Compensation, Spatial Interpolation

1 Introduction

Delivering video of good quality over the Internet or wireless networks is very challenging today, due to the use of predictive coding and Variable Length Coding (VLC) in video compression [1]. In block-based video coding method, if we use INTER-prediction mode, each macroblock (MB) is predicted from a previously decoded frame by *Motion Compensation*. If data loss occurs during the transmission, the corresponding frame will be corrupted, and this error will propagate to the subsequent frames because of INTER-prediction, until the next INTRAcoded frame is correctly received. In addition, a simple bit error in VLC can cause desynchronization; as a result, all the following bits cannot be used until a synchronization code arrives. Due to these facts, it is useful to develop some Error Resilience (ER) or Error Concealment (EC) techniques to control the errors in video transmission. Error resilience is usually applied at the encoder side. The coding efficiency of an ER codec is lower than a normal codec, because the encoder needs to introduce some redundancy to the stream. In the case of error, the decoder would use this additional information to reconstruct the video. On the other hand, error concealment is applied at the decoder side. It requires no change to the encoder and does not increase the bit rate, so it is more preferable for low bit-rate applications [2][3].

2 EC for INTRA-frame Losses over Packet Loss Channels

Lots of EC algorithms have been developed for video communication, such as spatial interpolation using some smoothness measure and temporal compensation based on inter-frame correlation [4][5]. Boundary matching algorithm (BMA) is also developed to estimate the lost motion vectors (MV) [6][7]. Most of current EC methods assume that only a few MBs or slices in a video frame are lost. However, in low bit-rate applications, one frame is usually carried in one data packet in order to save transmission overhead. As a result, the loss of one packet will lead to the loss of one entire frame [3]. When frame loss occurs, we can copy the previous received frame to reconstruct the lose one. More sophisticated methods recover the motion vectors (MVs) in pixel or block level based on the assumption of translational motion, i.e. motion remains constant along motion trajectory [3][8][9].

As in most of the block-based video coding systems all the INTER-frames are encoded based on the preceding INTRA-frame, the protection and restoration of INTRA-frames is especially important for the decoding of subsequent frames. However, as far as we know, most of the EC algorithms in the literature focus on the restoration of INTER-frames, and only a few works deal with the EC of INTRA-frames. In addition, almost all these algorithms assume that only part of the INTRA-frame is corrupted so that the lost MBs can be reconstructed using the information from the neighbors [10][11]. Since in low bit-rate video transmissions the loss of a packet usually results in the loss of a whole frame, an error concealment algorithm for INTRA-frame losses is necessary in reality. In this paper, we will focus on this problem and propose an algorithm to improve the reconstructed video quality when INTRA-frame loss occurs. The novelty is that not only the INTRA-frame but also the subsequent INTER-frames are refined using the received INTRA-MBs.

Random INTRA Refresh (RIR) scheme has been used in both earlier and current standards such as MPEG-4, H.263 and H.264, where INTRA-coded MBs are randomly inserted into the bitstream to remove artifacts caused by error and INTER-prediction drift. Although coding efficiency is reduced a little, RIR with a low INTRA-rate is more practical than inserting periodic INTRA-frames due to the bit-rate constraint [12]. As the RIR scheme is implemented in the encoder and does not introduce any decoding overhead, it is often jointly used with other ER or EC schemes. In our algorithm we assume that the received bitstream contains such INTRA-MBs. When an INTRA-frame is lost, the received INTRA-MBs in the subsequent frames can be used to refine their INTER-neighbors based on the strong correlation between adjacent pixel values. In addition, an INTER-pixel can also be refined by Motion Compensation (MC) if there is an INTRA-pixel in its motion trajectory.

The rest of this paper is organized as follows. In Section 2, we describe the proposed EC algorithm. Its performance is demonstrated in Section 3 by both subjective and objective results. Section 4 is conclusion.



Fig. 1. The flow chart of the proposed EC algorithm for INTRA-frame loss.

2 The proposed EC algorithm

In conventional EC algorithms, only the corrupted (lost) frames are error-concealed. Although the subsequent frames can be decoded as usual, some annoying artifacts will exist due to the drifting errors and the video quality can be even worse in the case of INTRA-frame loss. In this work, we propose to use four ways to reconstruct the subsequent INTER-pixels after a lost INTRA-frame:

- Decoding directly as in the conventional codec;
- Error concealment by motion compensation (MC);
- Error concealment by the DC of INTRA-MB (DC);
- Error concealment by spatial interpolation (SI).

Each INTER-frame is decoded and then error concealed pixel by pixel, using the algorithm in Figure 1. We will describe the three EC ways in the following subsections and then summarize the algorithm. As the INTRA-MBs coded by *Random INTRA Refresh* (RIR) can help to stop the propagated error, for each pixel we use one mark to represent whether it is error-free (*refreshed*) or not. For a lost frame, all the pixels are set to be *non_refreshed*. And when an INTRA-MB is received later, the corresponding pixels are marked *refreshed*. So a status map

3

4 EC for INTRA-frame Losses over Packet Loss Channels

 (M_f) needs to be maintained for each frame in the frame buffers, one bit for one pixel. In addition, we also maintain a small map M_s (size 16×16) for the pixels in an INTER-MB. The initial status of each pixel is *non_filled_mc*. Whenever a pixel is refined by MC, its status in M_s is changed to *filled_mc*.

2.1 EC by MC

Suppose there are L frames in the reference frame buffer. For each INTER-pixel p, we have its motion vector MV_0 and the corresponding reference frame index $k_0, k_0 \in \{1, 2, ..., L\}$. Then p can be refined by motion compensation (MC) if there is a *refreshed* pixel in its motion trajectory. In detail,

- 1. Mark the status of p in M_s as non_filled_mc . Use MV_0 to find the reference pixel of p, i.e. q_0 . If q_0 lies at an integer-pixel position marked as *refreshed*, or if q_0 lies at a sub-pixel position surrounded by *refreshed* pixels, mark p as *refreshed* in M_f and stop. Otherwise, set k = 0 and go to 2).
- 2. Increase k by 1. If k is great than L, i.e. all the reference frames have been checked, stop. Otherwise, go to 3).
- 3. If k equals k_0 , go to 2). Otherwise, estimate the MV of p to the kth reference frame based on the constant velocity model, i.e. $MV_k = MV_0 \times k/k_0$. Then use MV_k to find the corresponding pixel q_k in the kth reference frame. If q_k lies at an integer-pixel position marked as *refreshed*, or if q_k lies at a subpixel position surrounded by *refreshed* pixels, replace p by the pixel value of q_k and set the status of p as *filled_mc* in M_s ; stop. Otherwise, go to 2).

2.2 EC by DC

Divide the video frame into blocks with size $D \times D$, $D \in \{4, 8, 16\}$. Suppose pixel p lies in block B_c . We first check the eight neighbor blocks of B_c . If one neighbor lies in an INTRA-MB, p will be refined by the DC of this block, i.e. DC_{nb} . In other words, the value of p is changed to

$$p = w_{dc} \times DC_{nb} + (1 - w_{dc}) \times p, \tag{1}$$

where w_{dc} is the weighting factor to control the emphasis on DC.

2.3 EC by SI

For an INTER-pixel p, two nearest *refreshed* pixels are searched within a window, which is centered at p with size $(2S + 1) \times (2S + 1)$. If there is no or just one such pixel, the condition of *EC by SI* is not satisfied. Otherwise, suppose the two pixels found are p_1 and p_2 , with distance d_1 and d_2 from p, respectively. Then an interpolated value for p from its spatial neighbors can be

$$\hat{p} = \frac{p_1 \times d_2 + p_2 \times d_1}{d_1 + d_2}.$$
(2)

Using weight w_{si} to control the strength of spatial interpolation, we obtain the final value of p:

$$p = w_{si} \times \hat{p} + (1 - w_{si}) \times p. \tag{3}$$

2.4 Summary for the EC algorithm

If an INTRA-frame (I_0) is lost, all the pixels inside are filled by grey color, i.e. 128 for all the YUV components. Each of the subsequent N frames is decoded and then error concealed as follows until an INTER-frame is lost. Here N is an integer to control the number of frames for EC.

- For the first INTER-frame (P_1) , compute the DC of the INTRA-MBs within this frame, i.e. DC_{intra} . Fill the reference frame of P_1 (the buffer for I_0) and all the INTER-pixels of P_1 by DC_{intra} . Then for each INTRA-MB in P_1 , use its DC to fill the eight neighboring INTER-MBs.
- For the subsequent frames, the INTER-pixels are error concealed as in Figure 1.

If an INTER-frame is lost, it is reconstructed by copying the previous frame (*copy-previous*).

3 Simulation Results

We use the JVT reference software version 11.0 (baseline profile) for the simulations [13]. The first 300 frames of video sequences *Foreman* and *News* (QCIF) are encoded at 7.5 fps, and only the first frame is I frame. Two reference frames are used for INTER-prediction. Parameter *UseConstrainedIntraPred* is set to be 1 in the reference software, i.e. INTER pixels are not used for the prediction of INTRA-MB. And the INTRA-rate for RIR is 3%. The compressed video is supposed to be transmitted though a packet loss channel, and one packet contains the information of one frame. So the loss of one packet will lead to the loss of one entire frame. The simulated packet loss patterns are obtained from [14], with loss rate P = 3%, 5%, 10%, or 20%. Decoder PSNR is used as the objective measurement, which is computed using the the original uncompressed video as reference. Given a packet loss rate P, the video sequence is transmitted 40 times, and the average PSNR for the 40 transmissions is calculated at the decoder side. Three EC algorithms are evaluated, which will act as follows in the case of INTRA-frame loss:

- EC_F0_128: The lost INTRA-frame is filled by grey color, i.e. 128 for all the YUV components. And the subsequent frames are decoded directly.
- EC_F01_DC: The EC approach is the same as EC_MV_DC_SI. However, only the lost INTRA-frame and the first INTER-frame are error concealed.
- $EC_MV_DC_SI$: The proposed algorithm in section 2.4, with parameter $w_{dc} = 1/2$, $w_{si} = 1/3$ and S = 16. Suppose the video frames are I_0 , P_1 , P_2 , P_3 , P_4 We use D = 16 for P_1 , P_2 and D = 4 for P_i , $i \ge 3$.¹

The lost INTER-frame is error concealed by *copy-previous* for all these three algorithms.

¹ Note that when *EC by SI* is applied in *EC_MV_DC_SI*, with $w_{dc} = 1/2$ in Eqn. (1) and $w_{si} = 1/3$ in Eqn. (3), an INTER-pixel *p* is reconstructed by the average of the *DC*_{nb}, the interpolated pixel and the decoded one.



Fig. 2. The decoder PSNR of different EC algorithms for INTRA-frame loss.



Fig. 3. The 30th INTER-frame of *Foreman* in different EC algorithms for INTRA-frame loss.

6

Foreman (QP=30)								
	Decoder PSNR				Delta-PSNR			
P	3%	5%	10%	20%	3%	5%	10%	20%
EC_F0_128	29.41	26.52	23.82	20.24	0.00	0.00	0.00	0.00
EC_F01_DC	29.47	26.59	23.94	20.51	0.06	0.07	0.12	0.27
EC_MV_DC_SI	29.54	26.70	24.02	20.60	0.13	0.18	0.20	0.36
News (QP=30)								
	Decoder PSNR				Delta-PSNR			
P	3%	5%	10%	20%	3%	5%	10%	20%
EC_F0_128	32.37	30.61	28.28	24.08	0.00	0.00	0.00	0.00
EC_F01_DC	32.40	30.64	28.36	24.38	0.03	0.03	0.08	0.30
EC_MV_DC_SI	32.58	30.86	28.52	24.50	0.21	0.25	0.24	0.42

Table 1. The average decoder PSNRs for different loss rate P.

We first simulate the case of INTRA-frame loss, and all the subsequent frames are assumed to be received. Parameter N of $EC_MV_DC_SI$, i.e. the number of frames for EC, is selected to be N = 75 for a better illustration. Constant QP (QP=30) is used to encode both *Foreman* and *News*. The decoder PSNR is plotted in Figure 2. As shown in the figure, the video quality can be improved by just error concealing the first two frames, i.e. filling with the DC of received INTRA-MBs. However, with the proposed $EC_MV_DC_SI$ algorithm, much more improvement can be obtained. The reconstructed 30th INTER-frames of *Foreman* by different algorithms are shown in Figure 3. We can see from the figure that $EC_MV_DC_SI$ can suppress the propagated error more efficiently than the other two algorithms.

The performances of the EC algorithms under random packet loss conditions are given in Table 1 and Figure 4, with parameter N = 30 for $EC_MV_DC_SI$. Both INTRA-frames and INTER-frames can be lost according to the packet loss rate (P). Table 1 shows the average decoder PSNRs for different P. To give a clearer illustration, we also present the difference between $EC_F01_DC/EC_MV_DC_SI$ and EC_FO_{-128} for the same loss rate, as shown in the column named Delta-PSNR. From the table we can see that both EC_F01_DC and $EC_MV_DC_S1$ can obtain a higher PSNR than $EC_{-}FO_{-}128$, and the difference increases with increasing P. Figure 4 compares the RD curves of the three EC algorithms for a given packet loss rate P. From the figure we can see that by using EC_MV_DC_SI at P = 5%, we can gain about 0.19dB for *Foreman* and about 0.26dB for *News*. compared to using EC_F0_{-128} . For P = 20%, about 0.4dB can be obtained for both Foreman and News. In addition, for a small loss rate P, i.e. P = 3% or 5%, the performance (decoder PSNR) of $EC_{-}F01_{-}DC$ is closer to $EC_{-}F0_{-}128$ than to $EC_MV_DC_SI$. And when P increases, the performance of EC_F01_DC gets closer to EC_MV_DC_SI. This can be observed from both Table 1 and Figure 4.

Not that in Table 1 and Figure 4, the gap between $EC_MV_DC_SI$ and EC_F0_{128} is smaller than that in Figure 2. As in the case of INTER-frame



Fig. 4. The RD curves of different EC algorithms with loss rate P = 5% and P = 20%.

losses, the two algorithms have the same action, i.e. copy-previous, and the advantage of $EC_MV_DC_SI$ over EC_F0_128 is not obvious. Actually in such conditions, the received INTRA-MBs can also be used to refine the subsequent INTER-frames. We will take this as a future work.

4 Conclusion

In this paper, we propose an EC algorithm for INTRA-frame losses over packet loss channels. Both motion compensation and spatial interpolation are used to refine the INTER-pixels in the subsequent frames. As a result, the propagated error can decrease much faster than just error-concealing the lost INTRA-frame.

Acknowledgments. This work has been supported by the Innovation and Technology Commission of the Hong Kong Special Administrative Region, China (project no. GHP/033/05).

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