

A Low-Complexity and Efficient Encoder Block Mode Decision for Distributed Residual Video Coding

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Abstract

Existing encoder block mode decision (EBMD) algorithms often bring computation load and complexity at the encoder. In the distributed residual video coding (DRVC) system, based on the analysis of the statistical characteristics of the decoder side information (DSI), a simple scheme called EBMD-DRVC is introduced to maintain the low-complexity nature of the encoder. EBMD-DRVC only employs the value of the residual pixel at the encoder to classify the macro blocks into Intra mode, Skip mode and WZ mode. If a Skip mode block cannot be replaced by the co-located block in the DSI because of its unsatisfied quality, the decoder can improve the quality. The simulation results show that EBMD-DRVC is efficient in mode decision and has competitive rate distortion performance when compared with DISCOVER system. Due to having a low-complexity encoder, EBMD-DRVC is promising in practice.

Keywords: *Distributed residual video coding; Encoder block mode decision; low-complexity encoder*

1. Introduction

Distributed Video Coding (DVC) is an alternative video coding scheme, which is famous for its simple encoder architecture and is more suitable for the applications such as wireless digital video cameras, low-power video sensor networks, video surveillance cameras and so on. The theoretical foundations of DVC are the Slepian–Wolf theory which is about the lossless distributed coding and Wyner–Ziv theory which is about the loss distributed coding. These theories suggest that the statistical redundancies in a (video) signal can be exploited at the decoder side with only a limited performance loss with respect to a system that exploits the redundancies at the encoder. This facilitates the design of a simple video encoder at the cost of the increased complexity at the decoder because of the motion-compensated prediction shifting from the encoder to the decoder. The well-known DVC architectures have been developed by researchers in Stanford University, mainly including pixel-domain DVC (PDDVC) [1], transform-domain DVC (TDDVC) [2] and distributed residual video coding (DRVC) [3].

During the past decade, DVC has been popularly studied. The research hotspots mainly focus on improving the coding efficiency, decreasing the system latency and removal of the feedback channel. In order to improve the coding efficiency, well-known strategies including side information refinement [4-5], more accurate correlation noise model [6], more effective reconstruction [7] and block mode decisions (BMD) [8-16] have been proposed. In order to decrease the latency, low-delay DVC systems based on motion-

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compensated extrapolation [17] and DVC systems using entropy coding without iterative channel codes have been introduced in [18]. In order to remove the feedback channel, rate estimations at the encoder have been presented.

We studied the problem of BMD and knew that BMD algorithms can be implemented at the encoder (defined as encoder BMD, EBMD)[8-14], or at the decoder (defined as decoder BMD, DBMD)[15-16]. DBMD is more effective than EBMD because the accurate side information (SI) and correlation noise model can be obtained at the decoder. But DBMD requires a feedback channel to send the mode information to the encoder which brings the latency. On the contrary, EBMD suits for the scenario without the feedback channel and has less latency which is more practical than DBMD. But the existing EBMD often brings computation load and complexity at the encoder.

This paper focuses on EBMD in DRVC system. Since the encoder is limited in power, memory and computational capability, a very simple and efficient scheme called EBMD-DRVC is introduced to maintain the low-complexity nature of the encoder. The proposed EBMD-DRVC has two advantages. One is that the mode decision criterion is very simple which only employs the value of the residual pixel at the encoder to determine the block mode without any heavy computation. The other is that the threshold is fixed.

The remainder of this paper is organized as follows. Section 2 reviews the existing EBMD algorithms. Our EBMD-DRVC scheme is proposed in detail in Section 3. In Section 4, experimental results are shown and discussed. Finally, we conclude the paper in Section 5.

2. Review of the Existing EBMD Algorithms

In the existing EBMD algorithms, Intra mode and WZ mode are often introduced. In literature [8-9], the mode selection depends on the sum of absolute differences (SAD) between the blocks as an indication of the temporal coherence. If the SAD is less than the threshold value, WZ mode is chosen, or else Intra mode is chosen. In [10], both spatial and temporal block characteristics are taken into consideration by calculating the pixel variance of each block and the SAD, respectively. In [12], an iterative algorithm is proposed to dynamically select either Intra mode or WZ mode to encode a DCT block. In order to make more accurate mode decision, SI is required at the encoder. In literature [13], a cost function composed of compression rate and distortion is calculated, and the block mode with the minimum cost is chosen. In addition to Intra mode and WZ mode, skip mode used in [14] is also introduced which can save the transmission data and therefore improve the RD performance.

Although all the above EBMD algorithms can improve the coding efficiency, they undoubtedly bring computation load and complexity at the encoder due to the computation of the metrics such as SAD, compression rate, distortion function and so on. Furthermore, if there are some thresholds which should be pre-defined, the users do not have a clue how to set them. Those disadvantages prevent EBMD from being widely used in real-world applications. In order to make EBMD more practical, we propose the EBMD-DRVC scheme to solve these problems effectively.

3. Proposed EBMD-DRVC Scheme

Based on the analysis of the statistical characteristics of the DSI, a simple scheme called EBMD-DRVC which only employs the value of the residual pixel at the encoder to classify the mode is introduced.

3.2. Analysis of the Decoder SI (DSI) R' and the Quantization Index R'_q

In DRVC system, R' is regarded as the SI of R . We focus on the statistical characteristic of R' . The probability distribution curves of the residual pixels in any R' of Hall Monitor, Foreman, Coastguard, and Soccer videos are illustrated in Figure 2. It shows that each curve is sharp near 0 which means that the pixel value is centered on 0.

It is because we can regard R' as the motion-compensated errors between the adjacent video frames by comparing (1), (3), and (4). Since most backgrounds and foreground in the adjacent frames are changed a little, the motion-compensated errors for these regions are very small and that results in the case $R' = Y_{2k} - X_{re} \approx 0$ being in the majority.

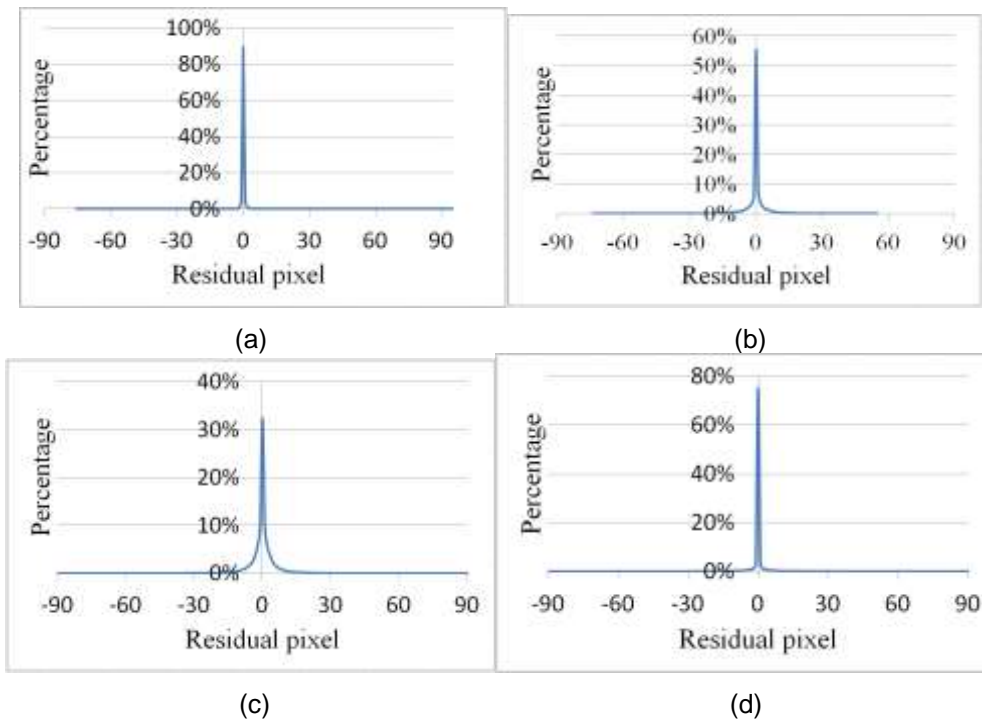


Figure 2. Probability Distribution of (a) the 13th Residual Frame of Hall Monitor, (b) the 32th Residual Frame of Foreman, (c) the 4th Residual Frame of Coastguard, and (d) the 19th Residual Frame of Soccer

Specific to the statistic characteristic of R' , we employ non-uniform quantization. Set that the quantization intervals are $[-255, -31][[-30, 30][31, 255]$ where the threshold 30 is empirically obtained and the corresponding quantization indexes R'_q shall be -1, 0, 1. Table 1 gives the quantization results of R' which is shown in Figure 2 and we can see from it that since the case $R' = Y_{2k} - X_{re} \approx 0$ is in the majority, the residual pixels falling in the interval $R'_q = 0$ account for more than 97%, even up to 99%. Specific to such characteristic, we can assume that $R'_q = 0$ accounts for 100%.

Table 1. Percentage of Each R'_q in R'

quantization interval	[-255,-31]	[-30,30]	[31,255]
quantization index R'_q	-1	0	1
Hall Monitor (the 13th residual frame)	0.295928%	99.45155%	0.252525%
Foreman(the 32th residual frame)	0.323548%	99.08854%	0.58791%
Coastguard(the 4th residual frame)	0.591856%	98.78078%	0.627367%
Soccer(the 19th residual frame)	0.994318%	97.16304%	1.842645%

Here the statistic characteristic of DSI R' can be summarized as follows. The value of the residual pixel concentrates near 0 and after implementing non-uniform quantization, we assume that $R'_q = 0$ accounts for 100%.

3.3. Proposed Block Mode Decision Criterion

Based on the hypothesis that $R'_q = 0$ accounts for 100%, a simple and effective block mode decision criterion is proposed. The definitions and decision criterion are:

- The size of macro block is 4×4 and there are altogether 16 residual pixels.
- The macro blocks in R and R' are represented as R_{block} and R'_{block} respectively. $PSNR(R_{block}, R'_{block})$ is the peak signal to noise ratio (PSNR) of the macro block.
- p_i and p'_i denote the residual pixel in R_{block} and R'_{block} respectively, where $p_i, p'_i \in [-255, 255]$ $i = 1, 2, 3, \dots, 16$.
- Intra block: It refers to the block whose correlation with the co-located block in DSI is weak. For this kind of block, using Intra codec is more effective than Wyner-Ziv codec. Given the specific hypothesis of $R'_q = 0$, the case $|R'_q| = 1$ means that the correlation is weak. Therefore, A block with at least six p_i satisfying $|p_i| > 30$ is decided as Intra block.
- Skip block: It refers to the block whose correlation with the co-located block in DSI is strong. It can replace by the side information block. Given the specific hypothesis of $R'_q = 0$, the case $R'_q = 0$ means the strong correlation. In order to obtain higher $PSNR(R_{block}, R'_{block})$, A block with all the p_i satisfying $|p_i| \leq 10$ is decided as Skip block.
- WZ block: A block which is neither a Intra block nor a skip block is decided as WZ block.

It can be seen that EBMD-DRVC is very simple which just depends on the value of the residual pixel at the encoder to decide the block mode without any computation of the metrics such as SAD, compression rate, distortion function and so on which are mentioned in the existing EBMD algorithms. Figure 3(a) and 3(b) show the 1th residual frame of Foreman and the three kinds of blocks in it, respectively.

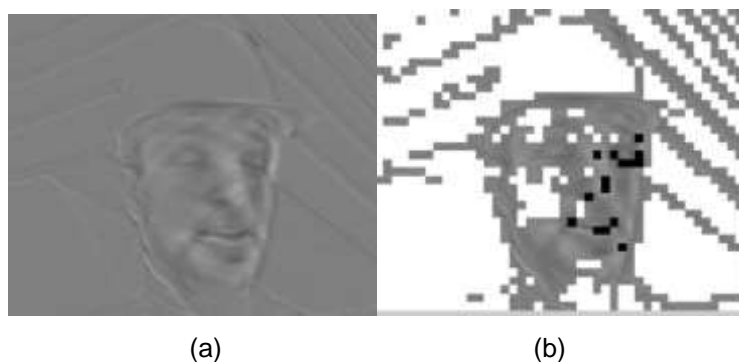


Figure 3. Display of (a) The 1th Residual Frame of Foreman, (b) The Three Kinds of Blocks which Use White, Black, and Gray to Represent Skip Blocks, Intra Blocks, and WZ Blocks, Respectively

3.4. Improve the Quality of R'_{block} for Skip Block

EBMD-DRVC is based on the hypothesis that $R'_q = 0$ accounts for 100% which is not always true. In reality the case $R'_q \neq 0$ seldom occurs, but when it occurs that may result in wrong decisions. If a R_{block} is wrongly classified as an Intra block, it will be reconstructed correctly after Intra decoding. If a R_{block} is wrongly classified as a Skip block, it will be unable to be replaced by the co-located R'_{block} . Because in that case, $R_q = 0$ while $R'_q \neq 0$, the correlation of the R_{block} and R'_{block} is not good enough. To solve this problem, (5) can be used to improve the quality of the side information block R'_{block} . The improved R'_{block} satisfies that all the p'_i in R'_{block} are less than or equals 10.

$$p'_i = \begin{cases} 10 & p'_i > 10 \\ -10 & p'_i < -10 \\ p'_i & |p'_i| \leq 10 \end{cases} \quad p'_i \in R'_{block} \quad (5)$$

4. Experimental Results and Analysis

Four test video sequences namely Hall Monitor, Foreman, Coastguard and Soccer with QCIF resolution at 15Hz are used for the experiments. The GOP is 2. Odd frame is the KEY frame encoded with H.264/AVC Intra codec for the QP parameter equal to 16, 18, 20, 24, 27, 30, 32 and 34 respectively. Even frame is the WZ frame. The reference frame and residual frame are the same as those described in the introduction section of the EBMD-DRVC architecture. For WZ blocks, the non-uniform quantization mentioned in Section 3.2 is used and the code length of LDPC is 396.

4.1. Efficiency of EBMD

Figure 4 shows the percentage of each mode in four test sequences where the QP is 24. It shows Skip blocks in Hall Monitor account for the largest proportion, reaching 93.66%. Intra blocks in Soccer accounting for 12.73% are more than those in other three videos.

That means the lower the motion is, the more percentage the skip blocks account for and the higher the motion is, the more percentage the Intra blocks account for. Figure 5 shows the average PSNR (APSNR) for each kind of block which is shown in Figure 4. It can be seen that for Intra blocks, the APSNR is mainly 14dB-17dB that means the correlation between the Intra blocks and their side information blocks is weak and the Intra codec is appropriate. For WZ blocks, the APSNR is mainly 29 dB that means the quality of their side information blocks is medium and WZ codec is appropriate. For Skip blocks, the APSNR is as high as 43.19 dB, usually over 39 dB, which means that the correlation between Skip blocks and their side information blocks is strong and the Skip blocks can be replaced by the side information blocks. There is an exceptional case for Intra blocks and WZ blocks in Coastguard. As we can see, the APSNRs of Intra blocks and WZ blocks in Coastguard are higher than those of other videos. It is because the quality of SI is not bad due to Coastguard with well behaved motion.

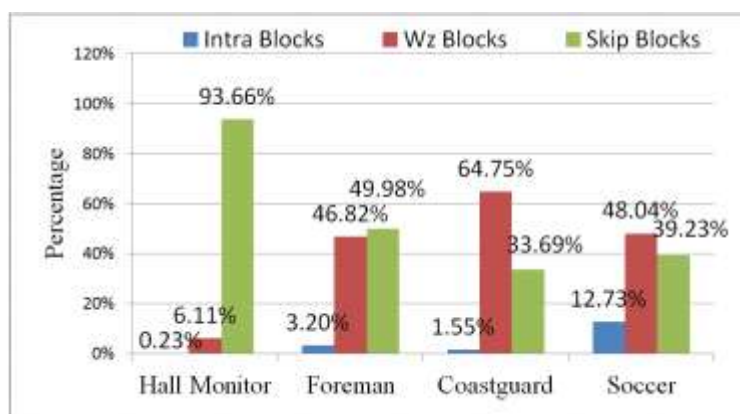


Figure 4. The Percentage of Each Mode in Test Videos

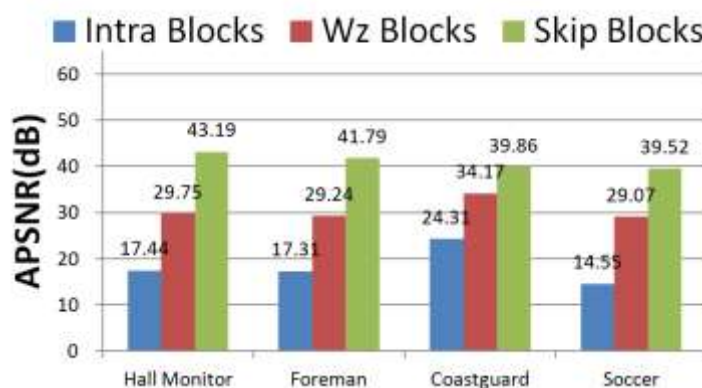


Figure 5. The APSNR of Each Kind of Block in Test Videos

Figure 6 shows the APSNR comparison of the Skip blocks with unsatisfactory side information blocks before and after using (5). It can be seen that the gains are up to about 2.8dB, 2.1 dB, 1.2dB, and 1.4dB in Hall Monitor, Foreman, Coastguard, and Soccer, respectively. The results show (5) is simple and helpful.

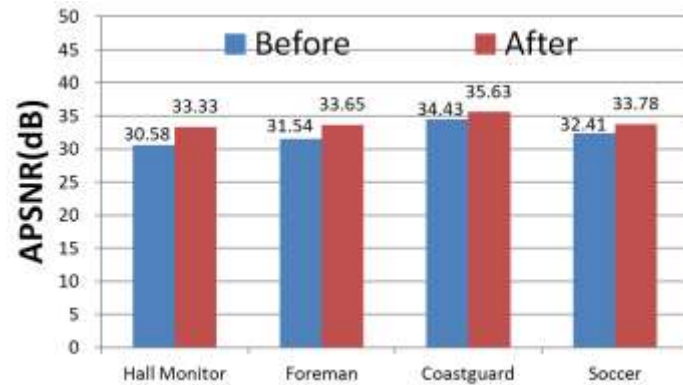


Figure 6. APSNR Comparison of Skip Blocks with Unsatisfactory SI Blocks Before and After Using (5)

In short, as we can see from the results of Figures 4-6, the proposed EBMD is very simple and effective in mode decision for the video with any degree of motion. Since the proposed EBMD is based on the hypothesis that $R'_q = 0$ accounts for 100%, the satisfactory results also justify the hypothesis.

4.2. RD Performance Comparisons

Figure 7 shows the RD performance of the proposed EBMD-DRVC scheme for all the test videos, compared with DISCOVER [20] system and EFMD [9] system. DISCOVER is taken as the benchmark and the simulation results of DISCOVER come from [20]. EFMD is an encoder mode decision scheme which is implemented in WZ frame, while our EBMD-DRVC is implemented in residual frame. For convenience, only luminance components of these sequences are tested.

1. Compared with DISCOVER. DISCOVER is currently considered one of the best performing DVC systems which has been optimized in aspects *e.g.* the code rate control, correlation noise model, side information refinement and so on. The framework of DISCOVER is relatively complex. While the framework of EBMD-DRVC shown in Figure 1 is very simple. Though the EBMD module is added at the encoder, it's very simple. Figure 7 shows that EBMD-DRVC performs better (the gain up to 1.4dB on average) for Hall Monitor video which is explained that the Skip blocks are in the majority and help to improve the RD performance. For Coastguard, EBMD-DRVC provides a RD performance quite close to the one obtained by DISCOVER which is explained that WZ codec works well in Coastguard. As we can see from Figure 4 and Figure5 that the percentage and APSNR of WZ blocks in Coastguard are 64.75% and 34.17dB respectively which mean WZ blocks are not only in the majority but also with satisfied SI, so the parity bits needed to correct the SI errors are not much which help to achieve good performance. For Foreman and Soccer video with high and complex motion, EBMD-DRVC presents a small RD performance gap (up to 0.4-1 dB) duo to the poor quality of SI. If the quality of SI can be improved by the side information refinement which is used in DISCOVER, the performance of EBMD-DRVC will be better but at the cost of increasing the complexity of the decoder. The simulation results show EBMD-DRVC can achieve good performances with simple framework, so it has a good practical use.
2. Compared with EFMD[9]. In [9], the paper proposes a simple encoder mode decision algorithm which depends on comparing both the temporal and the spatial SAD value. The temporal SAD is calculated between the co-located blocks in the adjacent frames and the spatial SAD is calculated between a block and its

neighboring blocks using one of three equations. The best equation is chosen by heuristics. Fig. 7 shows that EBMD-DRVC outperforms EFMD with gains up to 2-6dB in Hall Monitor video, 1-1.5dB in Foreman video, about 1dB in Coastguard video and about 2dB in Soccer video. There are two reasons for such outcomes. One is that the absence of SI at the encoder in EFMD scheme causes inaccurate correlation estimation, so the mode decision in EFMD is not always effective. While in EBMD-DRVC scheme, the mode decision is based on the statistical characteristic of the decoder SI (seen in Section 3.2), even though there is no SI generated at the encoder, the mode decision is still effective. The other is Skip mode is introduced in EBMD-DRVC to save the transmitting data and the quality of co-located blocks in DSI can be improved by (5) which help to improve RD performance. Comparing the two, we can conclude that EBMD-DRVC and EFMD all belong to simple encoder mode decisions but EBMD-DRVC is more effective than EFMD.

3. Compared with H.264/AVC Intra. H.264/AVC Intra is the standard Intra coding solution. Figure 7 shows that EBMD-DRVC performs better for video sequences with low or well behaved motion, such as Hall Monitor and Coastguard. For Foreman and Soccer video sequences with high and complex motion, the RD performances of EBMD-DRVC are lower than that of H.264/AVC Intra codec which reveal if the percentage of Intra blocks in such videos account for more, the RD performance will be better.

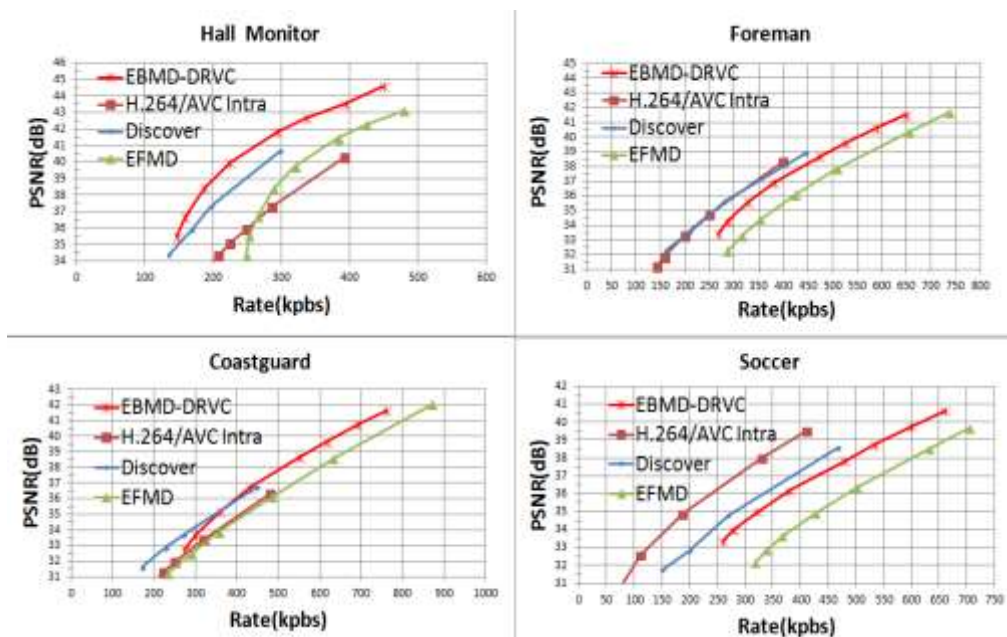


Figure 7. The RD Performance of EBMD-DRVC, DISCOVER and EFMD

5. Conclusions

The existing EBMD algorithms are unpractical in DVC system since they bring the computation load and complexity at the encoder. Aim to maintain the low-complexity nature of the encoder, we propose a simple and efficient EBMD-DRVC which only employs the value of the residual pixel at the encoder to decide the macro blocks into Intra mode, Skip mode and WZ mode. If the quality of the co-located blocks in DSI is unsatisfactory, the decoder can improve the quality of the reconstructed Skip blocks. Our metrics is very simple without any heavy computation and the threshold is fixed. These advantages guarantee a low-complexity encoder. The experiment results show EBMD-

DRVC is efficient in mode decision and obtains good and better RD performance when compared with DISCOVER and EFMD, respectively. Due to having the low-complexity encoder, EBMD-DRVC is promising in practice. In the future work, we will study how to modify the mode decision criterion to increase the percentage of the Intra blocks in the videos with high and complex motion.

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