

# Fast Palette Mode Decision Methods for Coding Game Videos With HEVC-SCC

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**Abstract**—The live broadcasting of game playing is becoming more and more popular. The game video is one of the typical video data which should be coded with high efficiency video coding-screen content coding (HEVC-SCC). In HEVC-SCC, the palette mode is an important technique which can effectively enhance the coding performance. However, this technique also demands high-coding computation. In this paper, we propose a fast palette mode pre-decision method based on the analysis of the color complexity of the video data. Considering only the coding computation of palette mode of HEVC-SCC, our algorithm saves about 74.24% computation in the experiments of game videos. Whereas, the BDBR only increases by about 0.36% and the BDPSNR decreases by about 0.03 dB on average.

**Index Terms**—Game videos, palette mode, HEVC-SCC.

## I. INTRODUCTION

IN ORDER to improve the coding efficiency of high definition videos, the ITU-T video coding experts group (VCEG) and ISO/IEC moving picture experts group (MPEG) formed a joint collaborative team (JCTVC) to develop the next generation video coding standard, which was named as “High Efficiency Video Coding” (HEVC) [1]. Though the HEVC standard can obtain good performance in many applications, the video coding tools provided by HEVC are primary suitable for natural video data captured by cameras. However, variable screen contents (SC) are coded and transmitted by different applications nowadays, such as PC desktop operation sharing, video conferencing, and media presentation on smartphones. In order to improve the coding efficiency of SC videos, the HEVC working group issued the special Call for Proposals (CfP) [2] for screen content coding (SCC) in January 2014, and some new coding tools were added into HEVC standards to form an extension: HEVC-SCC [3].

In the HEVC-SCC, a new coding tool named palette (PL) mode coding is very effective for SC videos, and some methods have been proposed to improve the performance of PL techniques. In [4], five techniques including Palette

predictor propagation, Palette predictor stuffing, Palette sharing, Index map transposing, and Removing redundant copy are introduced. In [5], some needless modes and depths are skipped based on Sharp Edge Based Classification (SEBC) and Directional Edge Based Classification (DEBC). In [6], a fast intra prediction method is proposed based on content property analysis for HEVC-based SCC, in which the coding units (CUs) are classified into natural content CUs and screen content CUs. In [7], transition copy and prediction across coding unit boundary are proposed to improve color index map coding. In [8], a new palette copy mode named as COPY\_INTER is proposed and applied to improve the performance of motion compensation.

Recently, many people share live-videos of their game playing online, and this kind of video content is becoming more and more popular. Limited by the power and computation resources of smartphones or laptops, high efficient PL coding methods are desired. However, existing fast HEVC coding algorithms are rarely designed for the game videos. In this paper, we suggest a pre-decision method for the PL mode in HEVC-SCC, and our algorithm can effectively enhance the coding efficiency.

The rest of the paper is organized as follows: Section II briefly reviews the theory and techniques of PL mode. Section III presents the details of our fast PL mode coding methods, and Section IV provides the experimental results of coding game videos and standard SC testing sequences with our proposals. Finally, Section IV concludes the paper.

## II. OVERVIEW OF THE PALETTE MODE

Fig. 1 illustrates the encoding process of the palette-based coding method. In the PL mode coding, one mode flag is signalled at the CU level to indicate whether the palette mode is used. If a CU adopts the palette mode, it will select a set of major colors from the CU to form a palette table, and then a palette index map will be generated based on the palette table and CU data. The palette index map divides the pixels of the CU into major colors and escape colors, which are marked as blank blocks and patterned blocks respectively in Fig. 1. For the pixels whose colors exist in the palette table, only the indices in the palette are coded. Whereas, for the pixels whose colors do not exist in the palette table, their color values are considered as escape colors, and the quantized color values (if lossy coding is used) are directly encoded. Besides, two predictive coding modes: copy-left mode and copy-above

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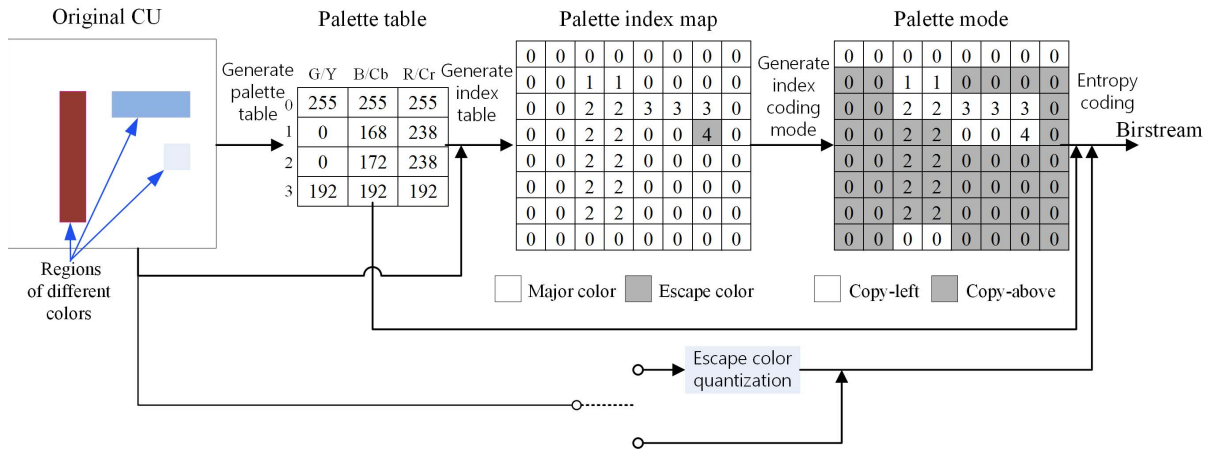


Fig. 1. The palette mode coding process of the HEVC-SCC.

mode are used to improve the coding efficiency of the palette index [9].

The JCTVC have provided techniques description and reference SC encoder in some reports, such as [10]. In the reference SC encoder, the color values of the original CU are clustered into  $k$  sets using modified  $k$ -means method, and each palette color is represented by a palette index (0, 1, 2, etc.). For each CU, the CU data is checked with the color of different palettes, and then the palette index map is formed for each CU (as shown in Fig. 1). In order to decrease the computation complexity of color checking, some methods such as predictive methods are accepted by JCTVC and applied in the reference encoder [11]–[13]. Though these methods can reduce some computations, the computation complexity of the PL mode is still very high.

As the PL techniques of HEVC-SCC can not obviously improve the coding efficiency of natural videos [14], directly applying the PL techniques to game videos coding may not achieve good performance because of the diversity of game contents. The game image can be roughly classified into three types: virtual nature images, animation images and smooth images. For virtual nature images, the PL techniques may not obtain good performance as these images contain many colors and details like natural images. Besides, some image regions only contain pure color blocks (smooth images), and these regions are also not suitable for the PL mode because some traditional coding methods can efficiently code these data [15].

In order to evaluate the coding performance of SC coding methods, JCTVC suggested the testing conditions of SCC in [16]. Besides, some algorithms have been suggested to improve the coding efficiency of SC coding. A fast-deciding CTU partition mode algorithm is proposed in [17] based on entropy and coding bits, and about 32% coding time can be saved. In [18], a fast intra coding method is proposed using smooth block judgments, and the intra coding complexity has been decreased by the fast method.

Most existing fast coding methods of SC video use the standard testing sequences or screen data of PCs. Whereas, most games use the animation to construct the contents, and these game videos always contain many regions with simple colors, which are very suitable for the PL techniques.

Considering the game video coding on smartphones or laptops, methods which can apply the PL techniques according to the features of video contents should be developed, so that good balance between the coding complexity and quality can be achieved.

### III. PROPOSED METHODS

Generally, the PL techniques can enhance the coding efficiency mainly in regions which contain a few colors and a few simple textures. In other words, image regions which are too complex or too simple are not suitable for PL techniques (as discussed in [14] and [15]). In this paper, the regions suitable/unsuitable for PL technique are named as “PLM Regions” and “NPLM Regions” respectively. In order to derive a rough division of “PLM Regions”, we suggest constructing a pre-decision process based on analyzing the color texture of the video data. The “PLM Regions” can be annotated by the pre-decision, and the computation can be decreased in regions which are not belong to the “PLM Regions”.

#### A. DCT Based Color and Texture Analysis

In the color and texture analysis, we only use the luminance (Y) data to decrease the analyzing complexity. For the game videos which are always in 4:2:0 YUV format, the resolution of the Y data is higher than the chroma data (Cb, Cr). For other video frames such as 4:4:4 YUV and 4:4:4 RGB (can be converted into 4:4:4 YUV), the resolution of the Y data is same as the chroma data, thus analyzing Y data can also obtain desired results.

As shown in Fig. 2, the Y data of each video frame is divided into  $8 \times 8$  blocks and transformed into the DCT domain, and  $DCT_{ij}$  represents the DCT coefficients (range between  $\pm 2048$ ) with  $i, j$  representing the row and column number respectively. As the traditional DCT can explore the textures of image data effectively, we adopt the traditional DCT using codes of [19]. Except for  $DCT_{00}$  which is the DC coefficient, other coefficients (AC coefficients) can reflect the variations of image data. Hence, our method uses AC coefficients to derive parameter  $K$  which could be used to evaluate the texture complexity of

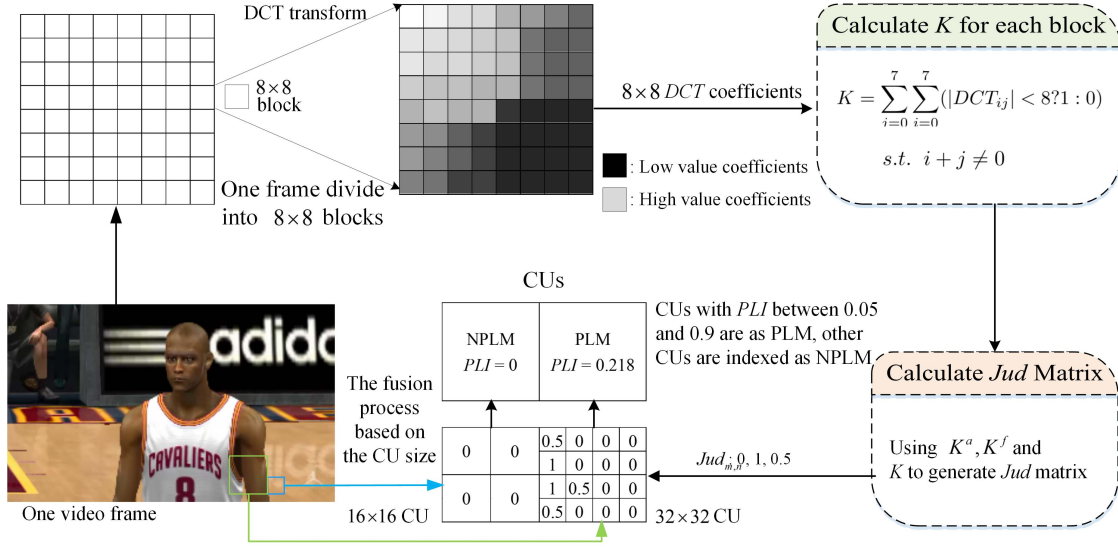


Fig. 2. The flow chart of our algorithm.

image data:

$$K = \sum_{j=0}^7 \sum_{i=0}^7 (|DCT_{ij}| < 8 ? 1 : 0) \quad s.t. \quad i + j \neq 0 \quad (1)$$

The threshold 8 is selected as most AC coefficients with values lower than 8 will be quantized to zero in video coding, and these small coefficients always correspond to relatively pure color textures. Using Eq.(1), the texture features of data blocks could be reflected by  $K$ , and a high  $K$  corresponds to the block which contains smooth textures. Giving one video frame, the average  $K$  of one frame can be derived as:

$$K^f = \sum_{j=0}^{h-1} \sum_{i=0}^{v-1} K_{ij} / ((v) \times (h)) \quad (2)$$

Here,  $h$  and  $v$  are the numbers of the horizontal and vertical  $8 \times 8$  blocks in one frame respectively. We calculate the  $K^f$  of all the standard test sequences of HEVC-SCC in our experiments, and the average value of  $K^f$  of these sequences is denoted as  $K^a$ . Based on the statistic calculation of all test sequences, the  $K^a$  can be set as 55.

As the textures of the “PLM Regions” should not be too simple or too complex ([14], [15]), two thresholds:  $T_h$  and  $T_l$  are used in our method to judge the “PLM Regions”. The high threshold  $T_h$  is used to judge smooth texture blocks which can be efficiently coded with the traditional Intra prediction modes such as the DC\_mode of [15]. While, the low threshold  $T_l$  is used to detect the complex blocks. Generally, as most details might be maintained in the complex parts (corresponding to low  $K$  value) of the reconstructed images,  $T_l$ , which is used to identify the complex blocks, might be relatively stable. However, the simple texture parts (corresponding to high  $K$  value) of the reconstructed image are always smooth like a single color block, and the values of  $K$  may vary between a relatively bigger range. Thus, we adopt  $K^f$  and  $K^a$  together to select the  $T_h$ .

In order to obtain the optimal  $T_h$  and  $T_l$ , we carefully tune different values with all testing sequences, and use the grid-search strategy in a heuristic manner to obtain the best value. After our grid-search experiments, we find  $T_l$  can be set as 10% of the  $K^f$  (Eq.(3)). For  $T_h$ , the optimal value should be set more flexible because of the varying  $K$ , and we find the optimal value of  $T_h$  can be set with two factors (0.7 and 0.75) by  $K^f$  and  $K^a$ , as shown in Eq.(4).

It should be mentioned, the optimal parameters which can always obtain the best coding performance is hard to be selected, and the optimal value may vary for different SC videos. Thus, we only suggest a set of parameters which can achieve the averagely best performance for all the game videos and other standard testing sequences.

$$T_l = K^f \times 0.1 \quad (3)$$

$$\begin{cases} T_h = K^f \times 0.7 & \text{if } K^f > K^a \\ T_h = K^f \times 0.75 & \text{if } K^f \leq K^a \end{cases} \quad (4)$$

Further,  $K$  of each  $8 \times 8$  block is compared with  $T_h$  and  $T_l$  to generate the normalized complexity parameter for each  $8 \times 8$  block ( $Jud_{mn}$ ):

$$Jud_{mn} = \begin{cases} 0, & K_{mn} > T_h \\ 0.5, & T_l \geq K_{mn} > T_h \\ 1, & K_{mn} \leq T_l \end{cases} \quad (5)$$

Here, the  $m$  and  $n$  represent the row and column number corresponding to the location of the  $8 \times 8$  blocks in one frame, and the color complexity of one video frame can be represented by a matrix constructed by  $Jud_{mn}$ . For each  $8 \times 8$  block,  $Jud_{mn} = 1$  means the color complexity of the block is very high.

#### B. Composition of the PL Index for Different CU Sizes

In HEVC coding, several sizes of CUs are supported, thus the  $Jud_{mn}$  matrix which is based on the  $8 \times 8$  unit can not be directly adopted to judge whether the PL mode should be



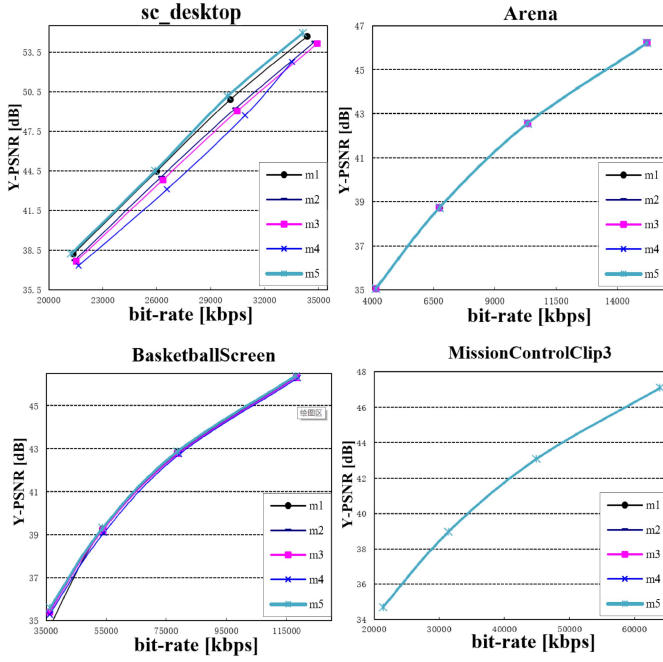


Fig. 3. Coding Results of Different  $PLI$  ranges:  $m1 = 0.15-0.8$ ,  $m2 = 0.25-0.7$ ,  $m3 = 0.3-0.65$ ,  $m4 = 0.4-0.55$ ,  $m5 = 0.05-0.9$ .

used for one CU. In our method, we compose the values of  $Jud_{mn}$  based on the size of CU to generate the PL indexes ( $PLI$ ) for CUs with size of  $H \times V$ :

$$\begin{cases} PLI = \frac{1}{N} \sum_{i=0}^{V/8-1} \sum_{j=0}^{H/8-1} a_{mn} \times Jud_{mn} \\ a_{ij} = |DCT_{00}^{mn}| / (\frac{1}{N} \sum_{i=0}^{V/8-1} \sum_{j=0}^{H/8-1} |DCT_{00}^{mn}|) \end{cases} \quad (6)$$

Here,  $N = H \times V/8 \times 8$  is the number of  $8 \times 8$  blocks in one CU,  $a_{mn}$  is the weight of each  $Jud_{mn}$ , and the  $a_{mn}$  is derived by the  $DCT_{00}$  which could reflect the average color of each  $8 \times 8$  block. Using Eq.(6), a  $PLI$  representing the color complexity of each CU can be derived, and the  $PLI$  values are used to enable/disable the PL mode in the HEVC-SCC process. Take  $16 \times 16$  CU for example, there are four  $8 \times 8$  blocks in the CU, which means there are four corresponding  $Jud_{mn}$  values. The  $PLI$  is the weighted ( $a_{mn}$ ) values of the four  $Jud_{mn}$ , and the value of  $PLI$  is between 0 and 1.

As discussed in [14] and [15], blocks which are too complex or too simple are not suitable for PL techniques. In our proposal, we adopt several ranges for  $PLI$  to find the optimal range which can effectively classify the complexity of blocks. Fig. 3 shows the results of some sequences with different ranges. For some sequences such as Arena and MissionControlClip3, the coding performances between different ranges ( $m1$  to  $m5$ ) are trivial. But in some other cases (such as *sc\_desktop* and *BasketballScreen*), the different ranges obviously impact the coding qualities. Based on the grid-search experiments using all test sequences, the range of  $PLI$  is set as  $m5 = \{0.05, 0.9\}$ . In other words, when  $PLI < 0.05$  or  $PLI > 0.9$ , the PL techniques are not used in our proposed HEVC-SCC encoder. Though the thresholds may

TABLE I  
PARAMETERS OF GAME-VIDEO AND STANDARD TESTING SEQUENCES

Sequence name	Resolution	FPS	YUV	Type
XXL	1920×1080	25	4:2:0	Smartphone
Asphalt8CC	1280×720	25	4:2:0	Smartphone
Arena	1280×720	25	4:2:0	Smartphone
NBA2K17	1280×720	25	4:2:0	PC
ChinaSpeed	1024×768	30	4:2:0	PC
Honkai3	640×480	25	4:2:0	Smartphone
BasketballScreen	2560×1440	60	4:4:4	PC
EBURainFruits	1920×1080	50	4:4:4	PC
Kimono1	1920×1080	24	4:4:4	PC
MissionControlClip2	2560×1440	60	4:4:4	PC
MissionControlClip3	1920×1080	60	4:4:4	PC
<i>sc_desktop</i>	1920×1080	60	4:4:4	PC
<i>sc_flyingGraphics</i>	1920×1080	60	4:4:4	PC
<i>sc_Programming</i>	1280×720	60	4:4:4	PC
<i>sc_Robot</i>	1280×720	30	4:4:4	PC
<i>sc_Slideshow</i>	1280×720	20	4:4:4	PC
<i>sc_Web_Browsing</i>	1280×720	30	4:4:4	PC
<i>sc_Console</i>	1920×1080	60	4:4:4	PC
<i>sc_Map</i>	1280×720	60	4:4:4	PC

not guarantee the best performance for some special videos, these values have achieved the averagely best performance in all the game videos and other standard testing sequences.

In summary, we propose a pre-decision process to enable/disable the PL techniques of HEVC-SCC as shown in Fig. 2. The texture complexity of one  $8 \times 8$  block is estimated by parameter  $K$  (Eq.(1)). Then, two threshold ( $T_h$  and  $T_l$ ) are carefully derived by analyzing  $K$  of many testing sequences, and  $T_h$  and  $T_l$  are further used to generate normalized complex parameter  $Jud$  for each  $8 \times 8$  block. At last,  $PLI$  for each CU is composed by  $Juds$  according to the size of CU. Using  $PLI$  as a index to enable/disable the PL techniques on the CU level, the HEVC-SCC coding complexity can be saved.

#### IV. EXPERIMENTAL RESULTS AND DISCUSSIONS

The experiments of our proposed algorithm are implemented on the HM-16.6+SCM-5.0 (REF encoder), and the hardware platform is Intel Core i7 CPU-2.67GHz, 6G RAM. The coding configuration is set as all Intra coding. We also build a Game-video sequence set as listed in Table I (in [20]), and some contents of these game videos are shown in Fig. 4 (Some areas showing advertisements in Fig. 4(b) are intentionally covered by “Ad Cover” blocks).

Table II shows the experimental results of our proposed algorithm on game videos. In Table II, the REF encoder with PL enabled is denoted as REF\_PL, whereas the REF coder with PL disabled is denoted as REF\_NPL, and the  $TS$  denotes the average encoding time saving:

$$TS = \frac{|T - T_{ori}|}{T_{ori}} \times 100\% \quad (7)$$

Here,  $T_{ori}$  represents the total encoding time of the REF\_PL, and  $T$  means the total encoding time of our method or the REF\_NPL. The  $T_{ori}$  or  $T$  is accounted by all coding process (the pre-processing of our proposal is included). For the DCT

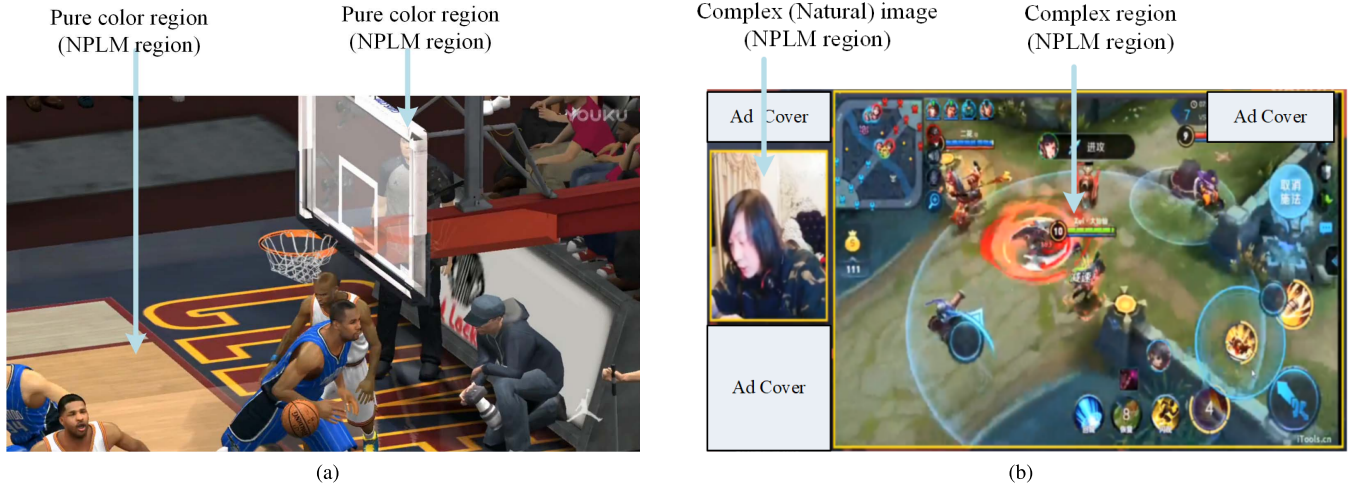


Fig. 4. Two examples of the game test sequences: (a) NBA2K17, and (b) Arena.

TABLE II  
PERFORMANCE OF THE PROPOSED ALGORITHM COMPARED  
WITH THE REF CODER IN GAME VIDEOS

Sequences	Proposed / REF_PL			REF_NPL / REF_PL		
	BDPSNR/dB	BDBR/%	TS/%	BDPSNR/dB	BDBR/%	TS/%
XXL	0	-0.04	22.48	0.01	-0.16	23.41
Asphalt8CC	-0.04	0.55	20.34	-0.08	1.04	26.14
Arena	-0.01	0.13	18.77	-0.14	1.64	25.03
NBA2K17	-0.01	0.11	18.21	-0.02	0.29	19.18
ChinaSpeed	-0.11	1.28	14.81	-0.68	8.12	28.59
Honkai3	-0.01	0.14	17.49	-0.02	0.27	28.58
<b>Average</b>	<b>-0.03</b>	<b>0.36</b>	<b>18.68</b>	<b>-0.15</b>	<b>1.87</b>	<b>25.16</b>

processing, which consumes the main computation of the pre-processing in our proposal, it only accounts for less than 1% of  $T$  (rough analysis using the profiling tools of VS 2013). As shown in Table II, averagely, the proposed algorithm obtains about 18.68% time saving (compared using the total coding time) when applied to game video sequences, whereas the BDBR increases about 0.36% and the BDPSNR decreases about 0.03 dB. Concerning the processing of the PL techniques in REF\_PL, our proposal can save about 74.24% PL coding complexity.

It can be noticed that for some games like the “NBA2K17”, which is shown in Fig. 4(a), the coding performance difference between REF\_NPL and REF\_PL is not obvious as this sequence contains many pure color regions. According to our method, most  $PLI$  of these regions are smaller than 0.05, so our proposed algorithm can effectively decrease the coding complexity. For videos which contain natural images and complex color regions (such as 4(b)), our method can also disable the palette mode as the most  $PLI$  of these regions are bigger than 0.9.

Table III also presents the performance of our algorithm on standard sequences recommended by the JCTVC [16]. The results show that the proposed algorithm achieves about 6.93% time saving in the total coding process, whereas the BDBR increases by about 1.38% and the BDPSNR decreases by about 0.26 dB. Compared with the REF PL, our proposals also can save 71% coding complexity of PL techniques.

TABLE III  
PERFORMANCE OF THE PROPOSED ALGORITHM COMPARED  
WITH THE REF CODER IN STANDARD VIDEOS

Sequences	Proposed / REF_PL			REF_NPL / REF_PL		
	BDPSNR/dB	BDBR/%	TS/%	BDPSNR/dB	BDBR/%	TS/%
BasketballScreen	-0.07	0.73	7.38	-1.03	11.77	12.28
EBURainFruits	0.00	0.00	8.42	0.00	-0.07	10.7
MissionCtrlClip2	-0.03	0.29	7.69	-1.27	12.65	12.21
MissionCtrlClip3	-0.05	0.45	6.58	-1.22	11.23	10.21
Kimono1	0.00	0.03	11.21	0.00	-0.05	13.02
sc_Robot	0.00	-0.09	15.93	0.01	-0.27	16.52
sc_Programming	-0.07	0.55	6.12	-1.90	17.80	8.64
sc_SlideShow	-0.12	1.68	12.49	-1.13	15.92	16.78
sc_flyingGraphics	-0.24	1.64	0.13	-2.07	15.54	2.81
sc_desktop	-0.50	1.40	2.24	-9.13	38.59	2.30
sc_Web_Browsing	-0.13	0.88	3.56	-3.21	29.59	5.59
sc_Console	-1.93	7.20	1.30	-0.80	39.51	5.46
sc_Map	-0.26	3.15	6.96	-0.85	11.70	10.00
<b>Average</b>	<b>-0.26</b>	<b>1.38</b>	<b>6.93</b>	<b>-1.68</b>	<b>15.68</b>	<b>9.73</b>

For the accuracy of the PL coding mode pre-decision, we can only take the mode decision of REF\_PL as the ground truth. In the coding process of REF\_PL, coding of current blocks always use the surrounding reconstructed data as reference, and the mode decision is related with many factors such as the modes of surrounding blocks. Hence, giving one block with different reference data, the mode decision may be different, and the differences will drift in the following coding blocks. Thus, the ground truth of PL mode in REF\_PL can not be mapped accurately to the modes of our proposals, and we can only use the data of Table II and Table III to evaluate our proposals.

Besides, Table IV shows the comparison between our proposal and some prominent fast coding methods of HEVC (Ref. [6], [17], [18]). Though the coding methods of [17] and [18] are not designed for the PL techniques, the  $TS$  and coding performance of these fast algorithms can be used as references of single coding tool optimization, such as the fast intra coding methods of [18]. We believe our methods can be integrated with other algorithms to obtain better performance. Besides, though some of the references use different HM coder

TABLE IV  
PERFORMANCE OF THE PROPOSED ALGORITHM IN [6], [17], AND [18] METHODS

Sequences	Proposed algorithm			Ref. [6]			Ref. [17]			Ref. [18]		
	BDPSNR/dB	BDBR/%	TS/%	BDPSNR/dB	BDBR/%	TS/%	BDPSNR/dB	BDBR/%	TS/%	BDPSNR/dB	BDBR/%	TS/%
BasketballScreen	-0.07	0.73	7.38	-0.15	1.61	37.21	-0.16	1.71	22.79	-0.02	2.64	6.33
EBURainFruits	0.00	0.00	8.42	-0.09	1.72	48.05	-0.01	0.15	13.92	0.00	0.01	0.39
MissionControlClip2	-0.03	0.29	7.69	-0.11	1.30	40.72	-0.06	0.74	27.42	-0.03	0.35	4.99
MissionControlClip3	-0.05	0.45	6.58	-0.09	0.82	31.51	-0.02	0.18	16.78	-0.04	0.33	2.60
Kimono1	0.00	0.03	11.21	-0.04	1.80	78.91	-0.01	0.28	22.88	0.00	0.02	1.00
sc_Robot	0.00	-0.09	15.93	-0.23	5.98	53.30	-0.01	0.34	14.37	-0.02	0.21	5.00
sc_Programming	-0.07	0.55	6.12	-0.13	1.16	35.87	-0.30	2.68	25.80	-0.03	0.28	5.72
sc_SlideShow	-0.12	1.68	12.49	-0.22	3.00	62.30	-0.07	0.95	47.02	-0.03	0.38	26.30
sc_flyingGraphics	-0.24	1.64	0.13	-0.15	1.03	31.12	-0.39	2.26	17.85	-0.25	1.67	4.20
sc_desktop	-0.50	1.40	2.24	-0.37	1.10	36.10	-0.86	2.58	20.45	-0.74	2.24	7.90
sc_Web_Browsing	-0.13	0.88	3.56	-0.40	2.63	39.00	-0.19	1.19	23.84	-0.34	2.15	12.96
<b>Average</b>	<b>-0.11</b>	<b>0.69</b>	<b>7.44</b>	<b>-0.18</b>	<b>2.01</b>	<b>44.91</b>	<b>-0.19</b>	<b>1.19</b>	<b>23.01</b>	<b>-0.14</b>	<b>0.93</b>	<b>7.04</b>

TABLE V  
RESULTS OF IMAGE QUALITY SUBJECTIVE ASSESSMENT

Sequence name	Source	REF_PL	REF_NPL	Proposed
XXL	4.06	3.93	3.87	4.00
Asphalt8CC	4.33	3.73	3.67	3.07
Arena	4.13	3.20	3.20	3.07
NBA2K17	4.33	3.60	3.47	2.80
Honkai3	4.73	3.67	3.33	3.40
BasketballScreen	3.73	3.67	3.40	3.47
MissionControlClip2	4.87	3.53	3.73	4.00
MissionControlClip3	4.13	4.07	4.00	4.00
sc_desktop	5.00	5.00	5.00	5.00
sc_flyingGraphics	4.60	4.67	4.67	4.67
sc_Programming	3.73	3.87	3.26	4.67
sc_Robot	4.60	3.27	3.80	3.80
sc_Slideshow	4.93	4.93	4.93	4.93
sc_Web_Browsing	4.20	3.67	3.20	3.40
sc_Console	4.80	4.75	4.19	4.71
sc_Map	4.93	4.88	4.50	4.50
<b>Average</b>	<b>4.44</b>	<b>4.02</b>	<b>3.88</b>	<b>3.97</b>

(HM-15.0+SCM-2.0), the SCC coding parts of these coders are same as our REF encoder (HM-16.6+SCM-5.0).

It can be noticed that [6] obtains the highest  $TS$  performance as it adopts several fast algorithms apart from the PL techniques. Whereas, our method is only designed for fast PL pre-decision, and the  $TS$  of our method only can reflect the computation decreasing in the PL mode coding. Generally speaking, though our proposed algorithm can not achieve more  $TS$  than some existing methods, our method outperforms all the references in terms of the BDPSNR. Theoretically, the  $TS$  of our method should be lower than the  $TS$  of REF\_NPL, as our method is specially designed for the PL techniques.

Though our proposal has not improved the coding efficiency and quality significantly in the standard SC testing sequences, our methods obtained good performance in game videos. As other existing methods (such as [6], [17], and [18]) have not provided open-access coding software, it is very hard for us to complete fair comparing experiments between these methods and our approach, and we believe our methods can be integrated with other algorithms to obtain better performance in SC coding of game videos.

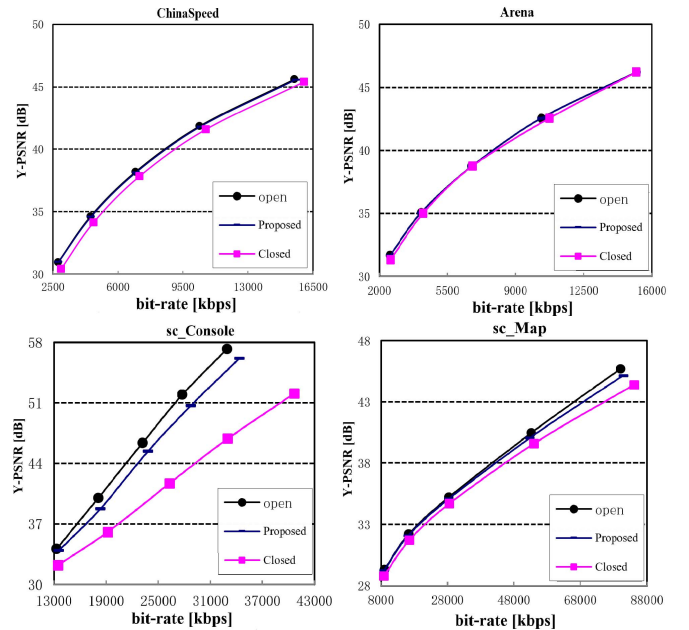


Fig. 5. R-D Curves of some testing sequences.

Considering the game videos as typical data of HEVC-SCC, REF\_NPL obtains about 25.16% time saving when it is compared with REF\_PL, as shown in Table II. In other words, the PL mode selecting process accounts for about 25.16% coding complexity of the whole coding processes. Using our proposal, the PL mode selection can be early decided, and our methods can save about 18.68% coding time when it is compared with REF\_PL (Table II). Thus, our proposal saves about 74.24% PL coding complexity, and the BDPSNR only decreases about 0.03 dB. Whereas, the REF\_NPL results in 0.15 dB (Table II) BDPSNR degradation. In summary, the proposed method is very suitable for coding game videos with HEVC-SCC, especially in the case of broadcasting game playing with smartphones which are limited by power and computation resources.

As the subjective quality is also very important for screen content video coding, we also complete experiment for the subjective quality assessments. Images of the source sequences, reconstructed image of our proposal,



REF\_PL, and REF\_NPL are used as testing samples. Each image sample is displayed for 5 seconds on a 4K display, and a 3-seconds black image is used as the interval for each sample. 15 volunteers are invited to assess the sample images with MOS scores from 1-5. As shown by the MOS scores of Table V, the reconstructed images of our proposals also achieve high quality in the subjective assessment. Besides, some bit-streams and images used in the subjective assessment are also shared in [21].

## V. CONCLUSION

In this paper, we propose a pre-decision method for HEVC-SCC based on analysis of color complexity of video data. First,  $8 \times 8$  DCT transform is applied to image blocks, and the color complexity is evaluated by the DCT coefficients. Then, judge matrices are derived to make the pre-decision for the palette mode of HEVC-SCC. In order to evaluate the performance of our method, test sequences of typical game videos are built as Open-Access. According to the experimental results on these game videos, the proposed method can obtain about 74.24% computation saving, whereas the BDBR (+0.36%) and BDPSNR (-0.03 dB) are nearly not changed.

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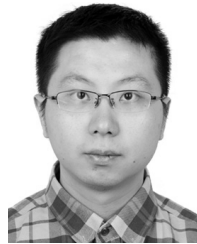
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