



## QuickETC2-HQ: Improved ETC2 encoding techniques for real-time, high-quality texture compression

Jae-Ho Nah<sup>a,\*</sup>

<sup>a</sup> Department of Computer Science, Sangmyung University, 20 Hongjimun 2-gil, Jongno-gu, Seoul, South Korea

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### ABSTRACT

ETC2 is a widely-used texture compression format in Android devices and applications, so efficient ETC2 encoding can reduce application development time. We present QuickETC2-HQ, a set of improved ETC2 encoding techniques for real-time, high-quality texture compression. Our modifications to the luma-based approximations used in etcpak 1.0, the state-of-the-art encoder which integrated the QuickETC2 method, allow the execution of additional compression modes and more accurate error comparisons. As a result, the image quality of QuickETC2-HQ is improved compared to that of etcpak 1.0 and is comparable to that of the reference encoder, ETCPACK 2.74, with the fast mode. In terms of performance, QuickETC2-HQ is orders of magnitude faster than ETCPACK, making it practical for real-time application execution and offline production builds of applications.

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### 1. Introduction

Texture mapping is one of the fundamental techniques in computer graphics. To create realistic and stunning visual effects, many games and graphics applications include various types of high-resolution textures. As a result, the number and size of textures have been continuously increasing. Since textures are typically stored in a compressed format to reduce memory bandwidth requirements and storage usage, texture encoding time has also been increasing proportionally.

Texture encoding is often utilized in real-time applications. It is considered an alternative option to standard video coding in latency-critical applications like cloud gaming, extended reality, or machine vision [1]. Some other applications, such as 3D reconstruction [2], web-browsing [3], texture resizing [4], and view synthesis [5],

demand the real-time compression of on-the-fly generated textures. In such cases, encoding speed is as important as encoding quality due to the limited time budget.

There are several industry-standard texture compression formats: BC series [6], ETC1/2 [7, 8], ASTC [9], and PVRTC [10]. Among them, ETC1/2 is the most widely used format in the Android platform. According to Google's analysis in September 2020 [11], 99% and 87% of Android devices support ETC1 and ETC2, respectively. Therefore, efficient ETC1/2 encoders can be useful for developing or running Android apps.

The Unity game engine [12] employs three different ETC1/2 encoders to provide flexible speed-quality trade-offs: etcpak [13], ETCPACK [14], and Etc2Comp [15]. etcpak is a fast encoder, but it results in lower compression quality than the other slower encoders (ETCPACK and Etc2Comp). The reason for this is that its high speed is not only due to highly optimized parallel programming, but also because it restricts encoding modes (up to and including version 0.7) and trials. Nah [16] reported that

\*Corresponding author

e-mail: [jaeho.nah@smu.ac.kr](mailto:jaeho.nah@smu.ac.kr) (Jae-Ho Nah)

1 etcpak 0.7 was two to three orders of magnitude faster than  
 2 ETCPACK and Etc2Comp with their fastest settings, re-  
 3 spectively, and the PSNR differences between etcpak 0.7  
 4 and the others were approximately one to two dB. To in-  
 5 crease the compression quality, QuickETC2 [17, 16] adds  
 6 high-speed ETC2 T/H-mode encoding logic to etcpak 0.7.  
 7 Using these additional modes can increase encoding time,  
 8 but the heuristic selector of QuickETC2, which is based on  
 9 the early compression-mode decision scheme, compensates  
 10 for this additional encoding cost. As a result, the Quick-  
 11 ETC2 technique improves the quality, speed, or both of  
 12 etcpak 0.7 and has finally been integrated into etcpak 1.0.

13 However, etcpak 1.0 sometimes produces compression  
 14 artifacts, such as block artifacts. One of the main rea-  
 15 sons for these artifacts is the luma-based approximations  
 16 used by etcpak. When calculating and comparing block  
 17 errors, etcpak uses the luma values of candidate colors in-  
 18 stead of the separated RGB values. Furthermore, the early  
 19 compression-mode decision scheme in QuickETC2 also re-  
 20 lies on the luma differences of each block to determine  
 21 further processing modes. Although these approximations  
 22 can reduce compression costs, they can also lead to incor-  
 23 rect decisions.

24 To address the above issues, we propose a set of improve-  
 25 ments to etcpak 1.0. Firstly, we calculate RGB weights for  
 26 a block with a dominant color channel and partially use  
 27 modified luma values to enhance error calculations, mode  
 28 selections, and clustering. Secondly, we perform compres-  
 29 sion in the ETC2 modes (T, H, and Planar) additionally  
 30 for blocks compressed with the ETC1 individual mode,  
 31 and we standardize the error metrics between the modes.  
 32 This additional calculation reduces block artifacts caused  
 33 by 4x2 or 2x4 subblocks. Finally, we make minor modifi-  
 34 cations to the T/H compression logic in QuickETC2 and  
 35 the solid-color check function in etcpak to minimize quan-  
 36 tization artifacts.

37 We performed experiments with the 93 test images in  
 38 different categories (Figures 1, 2, and 3) and compared  
 39 QuickETC-HQ with other encoders (etcpak 1.0 and ETC-  
 40 PACK 2.74). RGBA images in the test set were compres-  
 41 sessed using both ETC2 RGB and EAC. The results ex-  
 42 hibit that our approach still keep real-time rates of etcpak  
 43 and improves the compression quality to a level compar-  
 44 able to ETCPACK’s fast mode.

45 The structure and organization of the remainder of this  
 46 paper are as follows. Section 2 will summarize related pa-  
 47 pers and open-source projects, including ETC1 [7], ETC2  
 48 [8], etcpak [13], and QuickETC2 [17, 16]. Section 3 will  
 49 describe the new techniques proposed in this paper, along  
 50 with their implementation details. In Section 4, we will  
 51 present quantitative and qualitative analyses of our exper-  
 52 imental results. Finally, in Section 5, we will conclude this  
 53 paper.

## 54 2. Background

55 The ETC1 codec began with PACKMAN [18], which  
 56 compresses a 2x4 block by combining a base color per

57 block and a luminance modifier per pixel. Later, iPACK-  
 58 MAN [7] extended PACKMAN in several ways to improve  
 59 image quality. The main difference between PACKMAN  
 60 and iPACKMAN is the block size. Instead of the 2x4  
 61 block used in PACKMAN, iPACKMAN uses a 4x4 block  
 62 that consists of two 2x4 (vertical) or 4x2 (horizontal) sub-  
 63 blocks. The base colors of the two sub-blocks can be coded  
 64 either individually (two RGB444 colors) or differentially  
 65 (RGB555 base color + RGB333 offset). The intensity (lu-  
 66 minance) modifier table of iPACKMAN is also different  
 67 from that of PACKMAN due to their different block sizes.

68 Ericsson contributed the iPACKMAN codec to the  
 69 Khronos group under the name ETC1, which has become  
 70 the most widely used format for mobile platforms support-  
 71 ing OpenGL ES [20] and Vulkan [21]. ETC2 [8] further  
 72 improves image quality by adding three new modes: T,  
 73 H, and Planar. T- and H-modes are suitable for blocks  
 74 with distinct luma and/or chroma variance, and two base  
 75 colors are calculated, and two more colors are obtained by  
 76 modulating them. The number of colors per block is lim-  
 77 ited to four, but the T- or H-modes can represent different  
 78 partition patterns, similar to BC7 [6] or ASTC [9]. The  
 79 Planar mode aims to remove banding artifacts caused by  
 80 the color quantization of ETC1 by storing three edge col-  
 81 ors of a block and interpolating them for the remaining  
 82 pixels. This mode is best suited for blocks where colors  
 83 change smoothly.

84 ETCPACK [14] is the reference encoder for ETC1/2.  
 85 When compressing an ETC2 block, this encoder gener-  
 86 ates blocks compressed with all the ETC1/2 modes and  
 87 selects the best block among them by comparing the errors

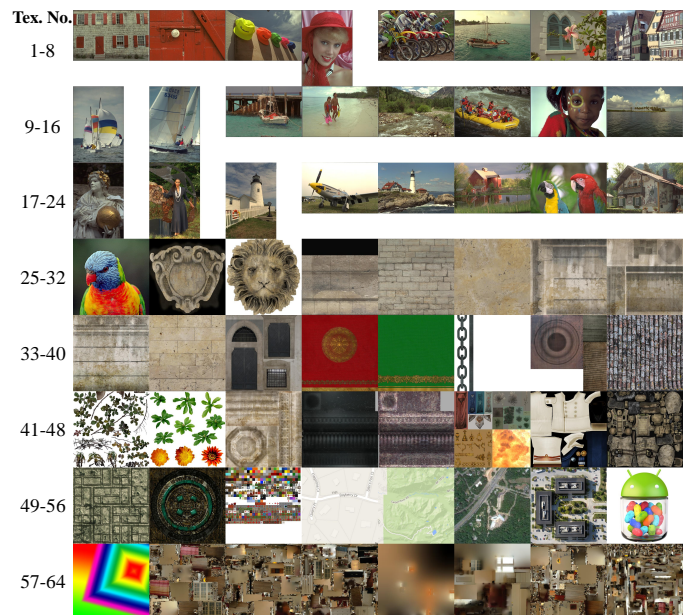


Fig. 1. 64 test images used in both QuickETC2 and our experiments. This set includes various types of textures: photos (No. 1-25), game textures (No. 26-51), GIS map data (No. 52-55), synthesized images (No. 56-57), and captured images from the real world (No. 58-64). If you need detailed descriptions of the images, please refer to the supplemental document of QuickETC2 [16].

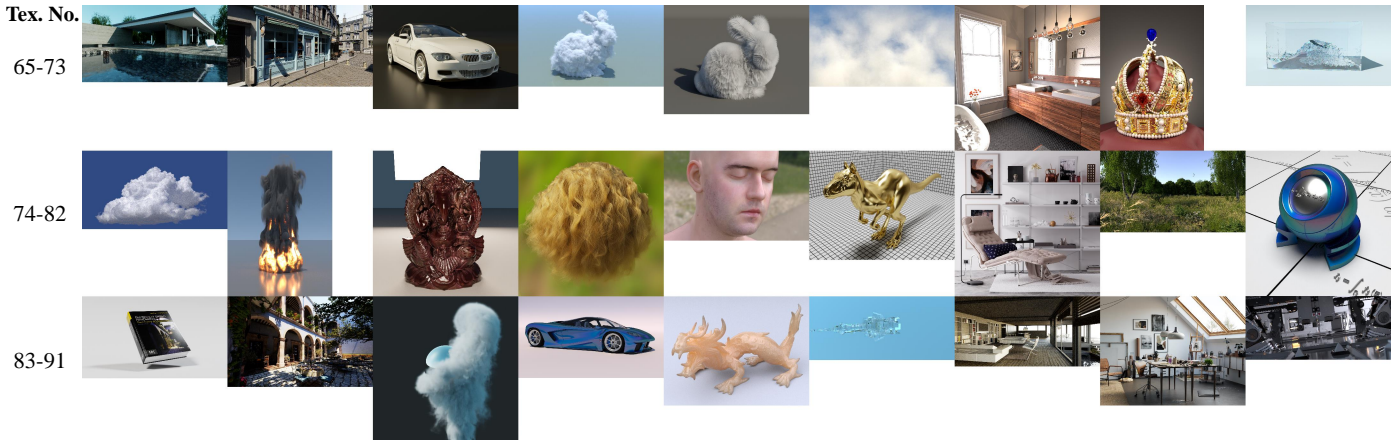


Fig. 2. 27 test images rendered by pbrt-v4 [19] to evaluate the performance of a texture codec in streaming rendered content. For convenience, we will refer to these images as No. 65 to No. 91.

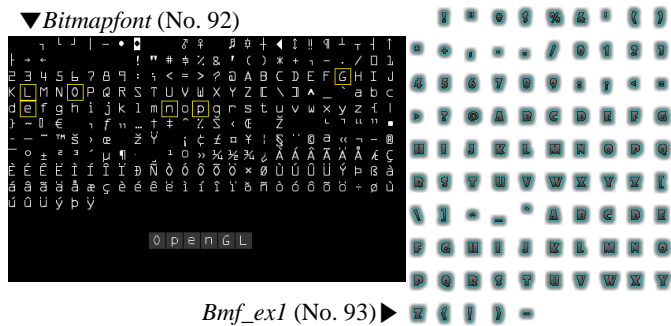


Fig. 3. Two test textures for font rendering. Each contains white text on a black background (No. 92) and colored text on a white background (No. 93), respectively.

thereby avoiding unnecessary tests. QuickETC2 achieves up to a  $3 \times$  speed-up and up to a 1 dB higher PSNR compared to etcpak 0.7. Recently, a QuickETC2 patch has been integrated into etcpak 1.0.

### 3. Our Approach

#### 3.1. Analysis of etcpak's compression artifacts

Even though the additional modes in QuickETC2 efficiently reduce many block artifacts in etcpak 0.7, there is still a quality gap between etcpak 1.0 and other high-quality encoders (e.g., ETCPACK, Etc2Comp, etc.) with their fast modes. Therefore, we need to analyze the compression artifacts of etcpak first. For the analysis, we executed etcpak 1.0 with 64 test images in the QuickETC2 paper (Figure 1), 27 test images rendered by pbrt-v4 [19] (Figure 2), and two images containing pure text (Figure 3). Using the second test set representing various rendering effects can be helpful to judge compression quality in that streaming case [1]. Rendered images similar to Figure 2 are not mapped into 3D objects; instead, they can be compressed and decompressed using a texture codec for video streaming.

According to our analysis, etcpak 1.0 exhibited several artifact patterns, as shown in Figure 4. We will analyze the reasons for each artifact type in the following descriptions. To better understand the following description, please refer to the flow chart of etcpak's ETC2 compression, illustrated in Figure 5.

The first artifact type is posterization, which appeared in Atlas. When all the color values in a block are the same, etcpak's solid-color check function quickly determines the block color through RGB555 quantization and skips further processing. This technique had been used for the ETC1-only mode in etcpak 0.7, but etcpak 1.0 forces this early filtering for both ETC1 and ETC2 encodings. This filtering accelerates the compression of background parts, but its simple quantization can bring out unnecessary background boundaries. If most blocks in a texture

of the blocks. Therefore, ETC2 compression takes longer than ETC1 compression. McAnlis [22] reported that the ETC2 encoding time using the Mali Texture Compression Tool [23], which internally includes ETCPACK, was several minutes to 1.3 hours per texture when the slow mode was selected.

The etcpak [13] encoder was released to address the long encoding time of ETC2 compression. Its primary goal is a high speed, achieving several orders of magnitude speed-up compared to other encoders. This speed-up is possible due to efficient work distribution and highly optimized compression parts using SSE and AVX2 intrinsics. However, earlier versions of etcpak (up to and including version 0.7) did not support the T- and H-modes, which are more complex than the ETC1 and Planar modes. Additionally, this encoder restricts the number of ETC1 encoding trials, only utilizing the average color of sub-blocks. Both the limited mode support and the limited encoding trials can degrade the image quality.

QuickETC2 [17, 16] addresses the quality degradation of etcpak 0.7. QuickETC2 supports high-speed T-/H-block compression to reduce block artifacts. Additionally, it optimizes encoding performance by deciding the compression mode(s) early based on the luma differences in each block,

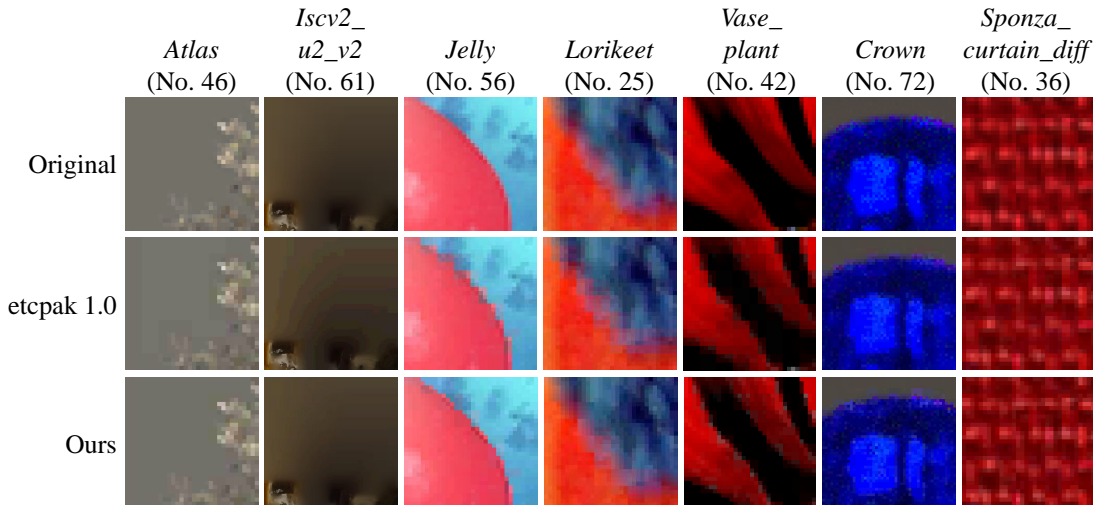


Fig. 4. Artifact patterns appeared in the images compressed by etcpak 1.0: Posterization, banding, block artifacts, and blurring. These artifacts could be alleviated after applying our approaches as shown in the third row.

1 are filled with solid colors, this posterization can get worse  
2 and visible banding can appear, as shown in *Iscv2\_u2\_v2*.

3 The second type is block artifacts, which are related to  
4 the conversion from RGB to luma in Equation 1 [24].

$$5 \quad Y = 0.299R + 0.587G + 0.114B \quad (1)$$

6 etcpak 1.0 extensively utilizes the above luma-  
7 conversion equation for error calculations, early  
8 compression-mode decisions, and clustering in the  
9 T-/H-mode compression, thereby reducing computational  
10 overhead. However, this strategy can sometimes generate  
11 several artifacts with different aspects and reasons, as  
12 shown in *Jelly*, *Lorikeet*, and *Vase\_plant*.

13 In *Jelly*, etcpak 1.0 shows blocky edges with color bleed-  
14 ing, which can be handled efficiently by the T- or H-modes  
15 in ETCPACK. However, etcpak 1.0 selects the ETC1 mode  
16 instead of T- or H-modes, resulting in the artifacts. The  
17 reason is that QuickETC2’s early compression-mode deci-  
18 sions and its clustering during the T-/H-mode compres-  
19 sion utilize luma values of each texel. The luma values  
20 of light pink and light blue colors in the *Jelly* texture  
21 are similar, so the luma differences of each block are not high  
22 enough for T- or H-modes to be selected either in the early-  
23 compression mode decisions (due to the luma differences  
24 being less than  $T_3=0.38$  in QuickETC2 [16]) or in the en-  
25 code selector (due to low-quality T-/H-mode compression).

26 In *Lorikeet*, the ideal mode for the boundary region  
27 is Planar to express soft gradients. However, the early-  
28 compression mode decision scheme does not consider the  
29 Planar mode because the blocks’ luma differences are  
30 not less than the predefined threshold value ( $T_2=0.09$  in  
31 QuickETC2 [16]). As a result, etcpak 1.0 selects the ETC1  
32 mode for the region, and the softness of the region was lost.

33 The block artifacts in *Vase\_plant* are more visible than  
34 in the previous cases. The red flower consists of high-  
35 contrast black and red colors, and due to the absence of

green and blue colors in the region, the luma values of each  
pixel are always low. As a result, luma-based approxima-  
tions fail to maintain compression quality in those cases.  
For example, the ETC1 mode used in the boundaries re-  
sults in block artifacts because of improper calculation of  
distance errors. Additionally, the Planar mode used in the  
inner part of the petals also amplifies block artifacts. The  
blue jewel in *Crown* has very low luma contrasts, so we can  
see blocky boundaries for a similar reason to *Vase\_plant*.

The fourth artifact type is blurring. As shown in  
*Sponza\_curtain\_diff*, compressing a block with a domi-  
nant color channel (red or blue) could result in a loss of  
detail. The reason for the blurring in this region is the low  
luma values, similar to the case of *Vase\_plant*. However,  
*Sponza\_curtain\_diff* and *Vase\_plant* show different arti-  
fact types because the blurred part in the former has low  
contrast and no diagonal edges.

### 3.2. Our modifications to minimize the compression arti- facts

The artifacts described in Section 3.1 are mainly related  
to luma-based approximations and encoding-mode skip-  
ping. To solve these problems, we modify all stages in  
etcpak 1.0, as illustrated in Figure 5. However, we have  
not considered extending search spaces to find base colors  
in each compression mode, as described in THUMB [25]  
and ETCPACK [14], because this strategy can exponen-  
tially increase compression time.

First, we use the Planar mode to compress solid-color  
blocks and avoid posterization in the background. When  
encoding solid-color blocks, the check-solid-color function  
uses RGB555 quantization and skips further processes  
(shown by the gray arrow in Figure 5), reducing compres-  
sion costs. However, RGB676 encoding in the Planar mode  
preserves color much better in these solid-color cases. It  
is no surprise that in such situations, 9 bits for dRdGdB in  
an ETC1 sub-block are set to zero, while the Planar mode

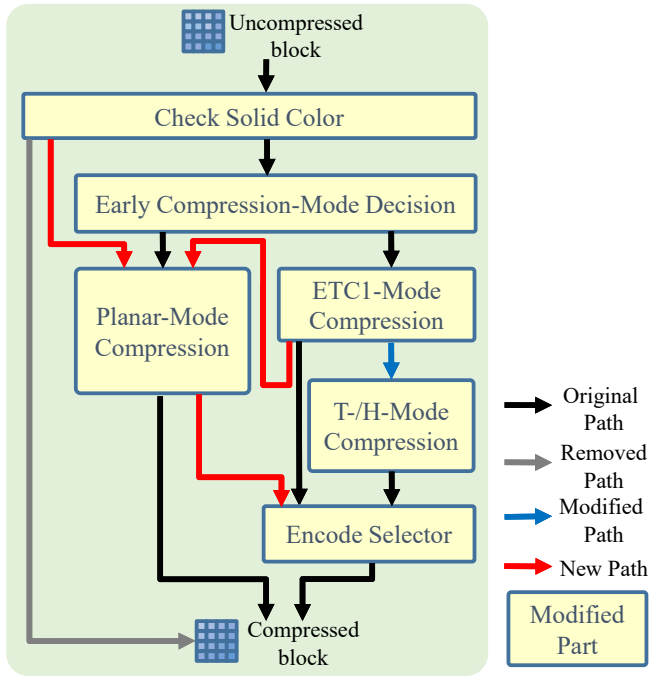


Fig. 5. A flow chart of the ETC2 RGB compression in etcpak 1.0 (ProcessRGB\_ETC2()). We have modified all the sub-functions in the process.

1. For each color channel, we calculate ‘bgrRange’ by subtracting the minimum value from the maximum value among 16 pixels in a block.

2. We then compare ‘bgrRange’ values for each channel and identify the maximum value. The corresponding channel for this maximum ‘bgrRange’ is stored in ‘maxBgrCh,’ while the maximum ‘bgrRange’ value itself is stored in ‘maxBgrRange.’ These two values can be used for additional T-/H-mode compression later.

3. To obtain ‘totalBgr’ for each channel, we sum up the color values of 16 pixels in that channel. Additionally, we calculate ‘sumOfTotalBgr’ by adding up ‘totalBgr’ values for all channels.

4. We evaluate the values of ‘bgrRange’ in each channel and the ratios of ‘totalBgr’ to ‘sumOfTotalBgr.’ The former represents contrast in each channel, while the latter indicates the proportion of each channel’s contribution to the overall color information.

4.1. If the ‘bgrRange’ of the red or blue channel exceeds a threshold value (currently set at 1/5), and the ‘totalBgr’ of the red or blue channel accounts for a significant proportion (currently higher than 2/3) of ‘sumOfTotalBgr,’ we recalculate the weights. We mix the original weights of each channel from Equation 1 with the ratios of ‘totalBgr’ for each channel to ‘sumOfTotalBgr’ using a 1:1 ratio.

4.2. Otherwise, if the conditions in 4.1 are not met, we retain the original color weights as stated in Equation 1.

The unmodified or modified weights are passed to the stages for further ETC2 encoding, allowing us to select appropriate compression modes and color candidates for reddish or bluish blocks. Figure 6 illustrates an example.

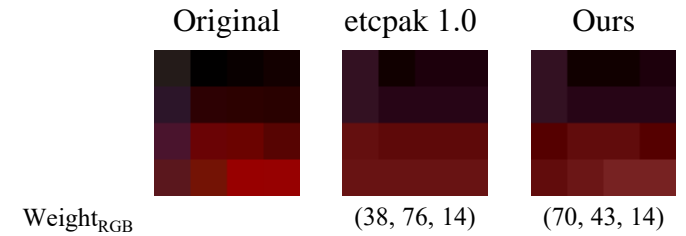


Fig. 6. RGB weights of a 4x4 block calculated using etcpak 1.0 and ours. In etcpak, the weight range is [0, 128], so the RGB weights in Equation 1 (0.299, 0.587, and 0.114) are represented as 38, 76, and 14, respectively. However, because the RGB difference of the uncompressed block in the above image is (151, 27, 45), our approach identifies this block’s dominant color as red and increases the weight of the red channel from 38 to 70. As a result, our approach can better preserve the reddish shape thanks to more accurate per-pixel distance values.

Third, we additionally conduct compression using the T-/H-/Planar modes to an ETC1 block compressed by the individual mode. Unlike the differential mode, the individual mode uses two different RGB444 base colors. As a result, blocks compressed in this mode may exhibit 4x2 or 2x4 block artifacts, particularly along the boundaries between different color areas. The additional compression modes can alleviate this issue. The red and blue arrows

1 can allocate more bits for RGB quantization compared to  
2 ETC1.

3 Therefore, we exclusively use the Planar mode in the  
4 cases to minimize quantization artifacts shown in Figure 4.  
5 We bypass the early compression-mode decision stage (in-  
6 dicated by the leftmost red arrow in Figure 5) in this case  
7 because there is no need to select a different mode in such  
8 instances.

9 Second, we apply variable color weights to blocks with a  
10 dominant color channel when calculating the luma values  
11 of the blocks. Equation 1 specifies these color weights as  
12 0.299, 0.587, and 0.114, chosen based on the human eye’s  
13 sensitivity to green light. Ström and Akenine-Möller [7]  
14 demonstrated that the perceptual error metric using these  
15 weights more accurately represents edges between different  
16 color areas than the error metric with equal RGB weights.

17 However, the fixed color weights for all blocks may not  
18 be suitable for all cases. In cases where a block has a dom-  
19 inant color channel, the block’s colors may appear reddish,  
20 greenish, or bluish. A block with a high level of green may  
21 not exhibit any issues after compression with the color  
22 weights specified in Equation 1 due to the high value as-  
23 signed to the green channel (0.587). However, the weights  
24 can produce suboptimal results for predominantly reddish  
25 or bluish blocks, as explained in Section 3.1.

26 To identify cases that require changing the color weights,  
27 we have added an RGB weight calculation function before  
28 the luma calculation in the early compression-mode  
29 decision stage. The function calculates new color weights  
30 through the following steps:

31

started from ‘ETC1-Mode Compression in Figure 5 indicate the newly added or modified paths for this additional process.

We perform the additional T-/H-mode compression using a modified clustering method only when the luma differences in a block are not high since luma-based clustering in QuickETC2 may not efficiently generate appropriate clusters in the case. Instead, we use values of the dominant color channel for clustering to avoid that case. If the difference in the dominant color channel of a block is low (less than  $T_2=0.09$  in QuickETC2 [16]), we do not execute the additional T-/H-mode compression. The reason is the expected quality improvement for a low-contrast block may be minimal.

In contrast to the original implementation in etcpak 0.7, QuickETC2 omits error calculations in the Planar mode because this mode is selected only in low-contrast regions. However, this assumption does not hold in the case of multiple modes. Therefore, we need to compare the compression results from the Planar, ETC1, and T-/H-modes in the encode selector, as shown in the red paths in Figure 5. We calculate the block error only if the Planar-mode compression function is additionally called after ETC1 compression. Otherwise, we skip the error calculation and directly encode the block as implemented in QuickETC2.

Fourth, to ensure a fair comparison between the compression results from the ETC1 and T-/H-modes, we perform additional error calculations in the encode selector. QuickETC2 used a slightly different error calculation method for its T-/H-mode compression compared to the ETC1 mode in etcpak 1.0. In the ETC1 mode, the luma values of the candidates are calculated first and then used for error comparisons. There is only one base color per sub-block, and the distance modifier per pixel only affects the brightness of each pixel. This is a clever strategy to reduce overhead of error calculations. In the T-/H-mode compression, differences between the original and compressed pixels are calculated for each color channel and combined according to color weights for luma conversion to obtain an error value. Because a difference can be a negative number, the T- and H-modes use the absolute value in contrast to the ETC1 mode. As a result, the errors calculated in the ETC1 mode can be lower than those in the T-/H-modes. This inconsistency can be solved by changing the ETC1 compression logic, but it leads to increased overhead. Therefore, we enable the additional error correction logic in the encode selector only if the current block contains a result from the T-/H-mode. If a variable color weight is applied to the current block, we disable this additional error calculation to prevent leaning too much toward the T- or H-mode.

Fifth, we recommend some minor updates to the T-/H-mode compression in QuickETC2. The first update involves using the colors in four vertices of a block (1st, 4th, 13th, and 16th pixels) for base color calculation, in addition to the colors in pixels with the minimum and maximum luma values. This change is intended to alleviate

block artifacts that become more visible when the colors of pixels at the block’s vertices are substantially different from those in neighboring blocks. Figure 7 demonstrates the advantages of this vertex-weighted base-color calculation. The second update involves forcing the T-mode if the number of pixels in the smaller cluster is less than four. This change enables a cluster of more than 13 pixels to be expressed with three palette colors instead of one or two. Although these methods may not reduce errors, they can help reduce visible block artifacts. Finally, when selecting the H-mode or the additional T-mode with the ETC1 individual mode, we opt for a more conservative start distance index for error calculations, two steps earlier than in QuickETC2. This approach slightly reduces performance but enhances quality.

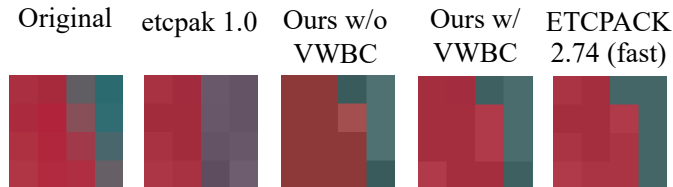


Fig. 7. A case where our vertex-weighted base-color (VWBC) calculation is advantageous. The H-mode in our method preserves the shape of the block compared to the ETC1 mode selected by etcpak 1.0. However, without VWBC, the colors after compression are less vibrant than the original colors. The VWBC approach resolves this issue, resulting in compressed colors that are closer to the original.

## 4. Experimental Results

In this section, we will analyze how a combination of the modifications introduced in Section 3.2 affects quality and performance. Our approaches are built on etcpak 1.0 [13] integrated the QuickETC2 patch [16], and we will compare our QuickETC2-HQ method to etcpak 1.0 and ETCPACK 2.74 [14]. When executing ETCPACK, we used its default setting, the fast mode with the perceptual error metric.

### 4.1. Experiment setup

For our experiments, we utilized the test image set used in QuickETC2 [17, 16] (Figure 1), the set rendered by pbrt-v4 [19] (Figure 2), and the two text textures in Figure 3. The quality-comparison metrics we used are  $\Psi$ LIP [26], PSNR and the standard luma-based SSIM [27]. The  $\Psi$ LIP values range from 0 to 1. We used  $\Psi$ LIP version 1.2 with a default value of  $p=67$  pixels per degree for our experiments. We obtained PSNR and SSIM values from opencv-python 4.6.0.66 and ImageMagick 7.1.1-8, respectively.

For the performance comparison, we used a desktop computer equipped with an Intel Core i7 12700 CPU (8 performance-cores, 4 efficient-cores, and total 20 threads), 32GB DDR4-3200 RAM, a 2TB SSD, and Windows 11. We measured the execution time using each encoder’s timing function. The time spent on the other operations, such as file I/O and PNG decompression, was not included in the timing values.

## 4.2. Comparison analysis

Table 1 summarizes the experimental results. Our QuickETC2-HQ method bridges the quality gap between etcpak 1.0 and ETCPACK. Compared to the baseline, etcpak 1.0, our approach achieved 9.5% lower  $\mathcal{F}$ LIP and increased PSNR and SSIM values. The average  $\mathcal{F}$ LIP value of QuickETC2-HQ is now comparable to that of ETCPACK, with only a 0.0023 difference between them. However, QuickETC2-HQ is two to three orders of magnitude faster than ETCPACK (the speed-up factor depends on the number of threads). Thus, QuickETC2-HQ can be practically used to reduce texture encoding time in a production build.

Table 1. Experimental results. All the values in this table were averaged over the 93 test textures. Upwards ( $\uparrow$ ) and downwards ( $\downarrow$ ) arrows indicate that lower and higher values are better, respectively.

Quality comparison			
Encoder	$\mathcal{F}$ LIP $\downarrow$ (mean)	PSNR $\uparrow$ (dB)	SSIM $\uparrow$
etcpak 1.0	0.0476	36.98	0.954
Ours	0.0431	37.61	0.961
ETCPACK 2.74 (fast)	0.0408	38.56	0.968

Performance comparison (MPixels/s $\uparrow$ )		
Encoder	single-threading	multi-threading
etcpak 1.0	345	2266
Ours	212	1390
ETCPACK 2.74 (fast)	0.94	0.94

The reason why  $\mathcal{F}$ LIP is more favorable to our approach than PSNR and SSIM is as follows. First of all, a PSNR value with equal weighting factors for the three RGB channels does not properly reflect the advantage of our variable color weights mentioned in Section 3. For example, our approach decreases the mean squared error (MSE) value in the red channel in Sponza\_curtain\_diff and provides sharper details of the red curtain. When calculating the PSNR value, the increased MSE values in the green and blue channels offset the decreased MSE value in the red channel, even though the red curtain makes up most of the image. Similarly, although our approach resulted in a 2% lower SSIM value than etcpak 1.0 in the test image, this result is erroneous as with Nilsson and Akenine-Möller’s analysis [28]. Moreover, we found that SSIM often failed to capture the reduction in block artifacts, as described in the QuickETC2 paper [16]. In contrast,  $\mathcal{F}$ LIP measures both color and feature differences and can accurately detect visual enhancements resulting from our additions, including variable color weights. Therefore, we will use  $\mathcal{F}$ LIP values in further in-depth analysis.

Figure 8 presents a detailed quality comparison of our approach with etcpak 1.0 and ETCPACK. In Kodim07, our additional Planar-mode compression improves the

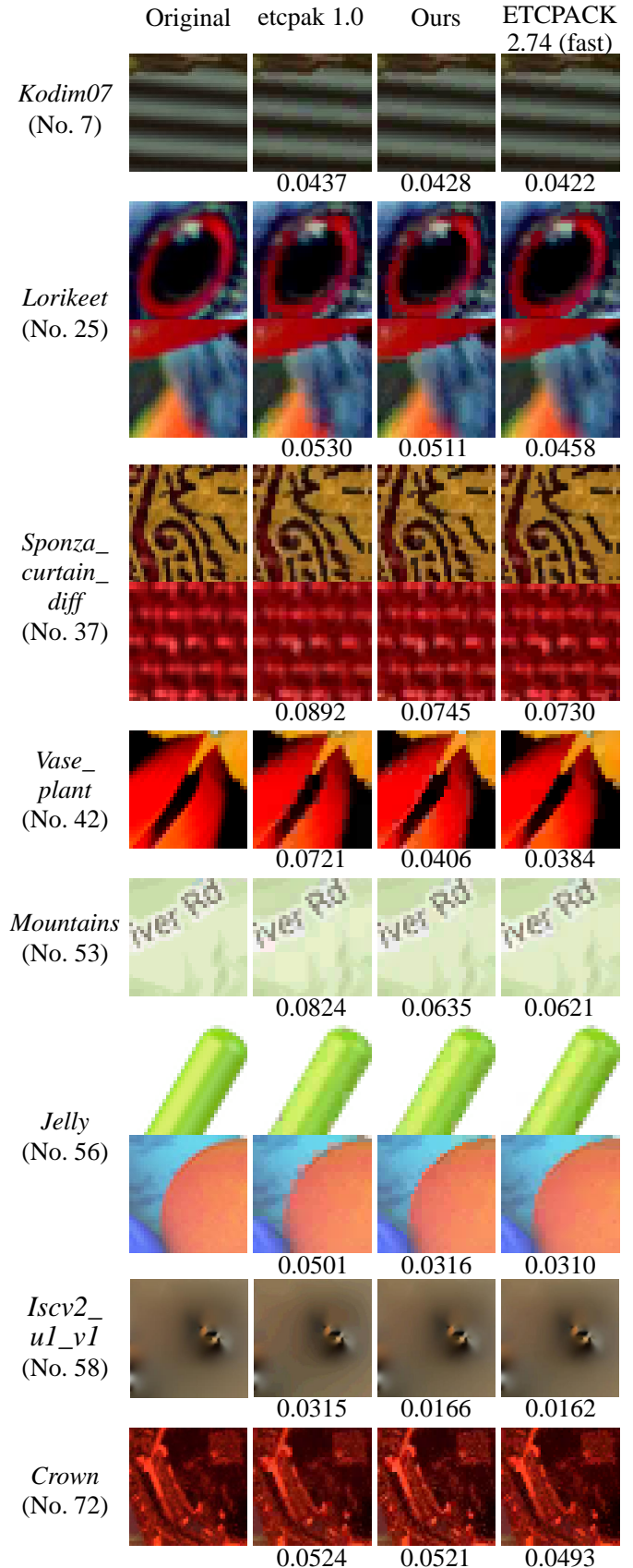


Fig. 8. Quality comparison. The number below each image is the  $\mathcal{F}$ LIP value (lower is better). QuickETC2-HQ alleviates various issues remained in etcpak 1.0, such as aliasing, color shifts, shape distortion, color bleeding, block artifacts, blurring, posterization, etc. Please zoom in the image to distinguish differences.

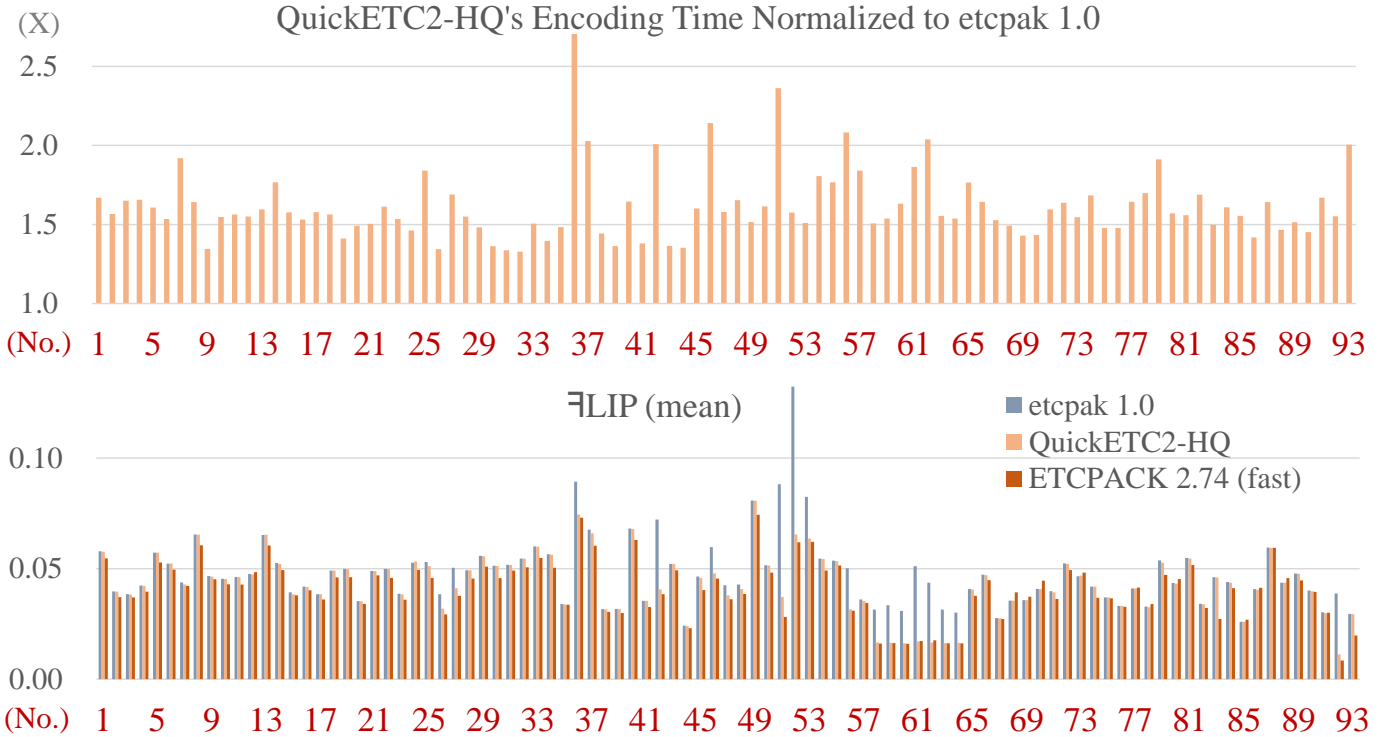


Fig. 9. Comparison results in each texture. Top: Performance comparison using the encoding-time overhead of QuickETC2-HQ compared to etcpak 1.0. Bottom: Quality comparison using  $\mathcal{F}$ LIP values between etcpak, QuickETC2-HQ, and ETCPACK. QuickETC2-HQ requires 1.6  $\times$  overhead over etcpak on average, but it suppresses etcpak’s increases in  $\mathcal{F}$ LIP values.

1 quality by smoothing aliased edges and preventing color  
 2 shifts that appeared in ETC1 blocks, as ETCPACK does.  
 3 In Lorikeet, QuickETC2-HQ preserves the eye’s ellipse  
 4 shape, removes the color-bleed edge on the bill, and soft-  
 5 ens blocky boundaries. In Sponza\_curtain\_diff, etcpak’s  
 6 results show greenish-gold colors and blurred weaving pat-  
 7 terns, but our approach restores them to the original.  
 8 ETCPACK sharpens the original image. In Vase\_plant,  
 9 QuickETC2-HQ removes a significant amount of block  
 10 artifacts between the red and black regions, although it  
 11 does not outperform ETCPACK. In Mountains, the pos-  
 12 terization artifact presented in etcpak 1.0 no longer ap-  
 13 pears in our approach, and the text is more visible due to  
 14 the preservation of the white text borders. In Jelly, our  
 15 method dramatically improves the compression quality. In  
 16 contrast to the others, ours prevents the black color in the  
 17 transparent background from penetrating the pea-green  
 18 antenna. Furthermore, our additional T-/H-mode com-  
 19 pression removes many block artifacts with color bleed-  
 20 ing in etcpak. ETCPACK generally handles the bound-  
 21 ary between two different colors better than our approach.  
 22 In Iscv2\_u1\_v1, ours smooths banding artifacts in etc-  
 23 pak, similar to ETCPACK. In Crown, etcpak generates  
 24 blocky boundaries and slightly faded colors, and ours al-  
 25 leviate these artifacts well. The results between ours and  
 26 ETCPACK are similar in terms of shape preservation, but  
 27 ETCPACK expresses vivid colors in the original images  
 28 better.

Figure 9 presents the performance and quality compari- 29  
 son in each texture. The encoding time of QuickETC2-HQ 30  
 normalized to that of etcpak 1.0 ranges from 1.3  $\times$  to 2.7  $\times$ , 31  
 with an average of 1.6  $\times$ . Although the additional compu- 32  
 tations in our approach increases the encoding overhead, 33  
 it also improves the compression quality, as indicated by 34  
 the  $\mathcal{F}$ LIP values. When the quality difference between etc- 35  
 pak 1.0 and ETCPACK 2.74 with the fast mode is small, 36  
 the impact of QuickETC2-HQ is not significant. However, 37  
 when etcpak 1.0 exhibits visible artifacts, our approach 38  
 corrects most of them, resulting in lower  $\mathcal{F}$ LIP values that 39  
 are closer to those of ETCPACK. 40

#### 4.3. Ablation study 41

For the ablation study, we selected six representative 42  
 images in the test set and measured the  $\mathcal{F}$ LIP values and 43  
 performance on different settings in each image. The pur- 44  
 pose of this study is to determine how each method in- 45  
 troduced in Section 3.2 affects compression quality and 46  
 performance. We tabulate the results in Table 2. 47

Firstly, the Planar mode for solid-color blocks (a) only 48  
 affects results if some part of the texture contains solid- 49  
 color blocks. Thus, the results of Kodim07, Lorikeet, 50  
 Sponza\_curtain\_diff remained the same before and after 51  
 applying the method to the baseline. While this method 52  
 could reduce the  $\mathcal{F}$ LIP values of RGBA textures such as 53  
 Vase\_plant and Jelly, there was no noticeable visual im- 54  
 provement because errors in the transparent regions with 55



Table 2. Ablation study. (a), (b), (c), (d), and (e) in this table refer an addition of each method introduced in Section 3.2, respectively: (a) forcing the Planar mode for solid-color blocks, (b) variable color weights, (c) additional T-/H-/Planar mode compression, (d) additional error calculations, and (e) the updates for the T-/H-mode compression. The baseline is etcpak 1.0.

Image	$\overline{\text{FLIP}}$ (mean) $\downarrow$						Encoding time (ms) $\downarrow$					
	Baseline	+(a)	+(b)	+(c)	+(d)	+(e)	Baseline	+(a)	+(b)	+(c)	+(d)	+(e)
Kodim07	0.0437	0.0437	0.0433	0.0433	0.0428	0.0428	0.35	0.35	0.43	0.60	0.64	0.68
Lorikeet	0.0530	0.0530	0.0523	0.0521	0.0511	0.0511	0.28	0.28	0.34	0.46	0.49	0.52
Sponza_curtain_diff	0.0892	0.0892	0.0753	0.0753	0.0744	0.0745	2.3	2.3	3.6	5.9	6.0	6.4
Vase_plant	0.0721	0.0412	0.0407	0.0407	0.0406	0.0406	0.40	0.47	0.62	0.75	0.78	0.80
Jelly	0.0501	0.0333	0.0333	0.0332	0.0318	0.0316	0.16	0.19	0.28	0.31	0.33	0.34
Iscv2_u1_v1	0.0315	0.0167	0.0167	0.0166	0.0166	0.0166	14.1	15.0	21.0	21.9	22.1	22.3

the alpha value of zero were mainly reduced. On the other hand, the method is highly efficient for removing posterization and banding artifacts in RGB textures, as demonstrated by the results for *Iscv2\_u1\_v1*.

Secondly, the variable color weights (b) always affects the encoding speed because the weights need to be recalculated for all blocks. This approach is especially effective for reddish or blueish textures, such as *Sponza\_curtain\_diff*.

Thirdly, both additional T-/H-/Planar mode compression (c) and additional error calculations (d) need to be used together to be effective. This is because the encode selector can only choose one block among several candidate blocks compressed on different modes. The encoding overhead depends on the ratio of ETC1 to ETC2 blocks.

Finally, the updates for T-/H-mode compression (e) can improve compression quality on some blocky diagonal edges. As a result, this method reduced the  $\overline{\text{FLIP}}$  value in *Jelly*, the most problematic texture in the QuickETC2 test set. However, if there are no noticeable block artifacts in a texture, the method has little to no effect on the compression result.

#### 4.4. Failure cases

Although QuickETC2-HQ solves a number of quality issues appearing in real-time ETC2 encoding, this method sometimes fails to find optimal results. First, the error-based mode selection does not always guarantee the perceptually best quality. As shown in the first row of Figure 10, the ETC1 blocks selected by etcpak 1.0 express smoothness in the pink region better than the T- or H-blocks selected by the other encoders. If a novel error-judgment method is utilized during the encoding process instead of MSE, we think this problem may be alleviated. Of course, this can be a fundamental modification in a block-based codec and can lead to some unexpected compression results. Thus, we would like to leave this investigation as a future research topic.

Second, some difficult cases need an exhaustive search to get high-quality ETC2 compression. In the second row of Figure 10, the twinkling gems in *Crown* generate spatially-incoherent colors, and some of the shiny pixels are discolored after ETC2 compression, except for ETCPACK with the slow mode. The third row of Figure 10 shows a similar

example. While ETCPACK with the slow mode made a flawless result, the others generated color bleeding in and out the black letter borders. Even additional T-/H-blocks in our approach worsened the color bleeding because inner grey texels and outer bright emerald-blue texels were grouped into the same cluster due to their luma similarity. Using the slow mode in ETCPACK can solve these color distortion and bleeding, but this is possible at the expense of compression speed; our encoder can compress each texture in Figure 10 within 1 ms, but ETCPACK with the slow mode requires about 1 minute per texture.

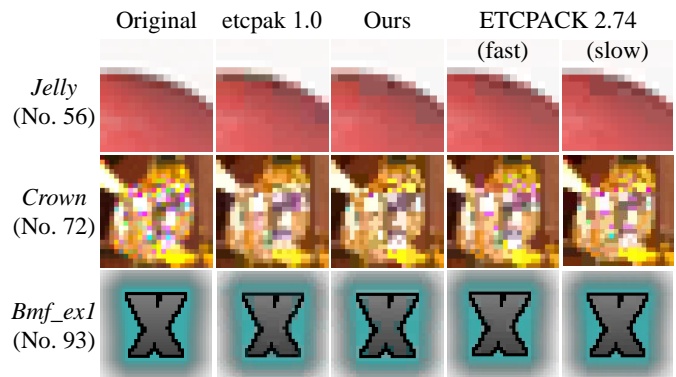


Fig. 10. Failure cases. Our approach may exacerbate block artifacts (*Jelly*), distort colors (*Crown*), or bleed colors (*Bmf\_ex1*) during the additional ETC2 encoding process.

## 5. Conclusions and Future Work

In this paper, we introduced QuickETC2-HQ, a set of improvements to etcpak 1.0, a state-of-the-art texture encoder. QuickETC2-HQ includes several techniques, such as Planar-mode compression of solid-color blocks, variable color weights, selective execution of additional T-/H-/Planar mode compression, vertex-weighted base-color calculations, and more accurate error comparisons. Combining these techniques reduces compression artifacts, such as blurring, posterization, and block artifacts. QuickETC2-HQ built on etcpak 1.0 provides a significant speed advantage over ETCPACK 2.74 with the fast mode

while delivering comparable compression quality to that. Therefore, we believe QuickETC2-HQ can be an excellent option for mobile app developers who need high compression quality and performance.

There are many avenues for future work. First, QuickETC2-HQ has a few parameters, and more optimal parameter values for QuickETC2-HQ may exist for better tradeoffs between quality and performance. With additional consideration of masking effects [29], we will be able to apply different parameters to different texture types. Second, if we consider not only the luma (Y) space but also the CbCr or HSV space for compression, we will be able to expect more quality improvements. Third, we would like to extend our work to other texture encoders in different platforms, such as the Betsy GPU texture encoder [30] and the H-ETC2 CPU-GPU hybrid encoder [31]. We would also like to explore how to apply some of our methods to other texture formats, such as ASTC [9] and BC7 [6]. Finally, the concept of variable color weights can be used for other image-processing applications. Because global color weights for luma conversion have been widely used in the image-processing community, we expect our locally variable approach may lead to new research topics.

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