# Influence of Depth Map Fidelity on Virtual View Quality

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*Abstract*—The paper deals with optimal bitrate distribution between video and depth maps in multiview compression. Influence of noise in depth data on the optimal bitrate allocation is studied. For simplicity simulcast approach is used. The results show that for high bitrates, virtual view quality depends on the depth map fidelity. However for low bitrates, this influence is negligibly small.

Keywords—High Efficiency Video Coding (HEVC), view synthesis, depth map, multiview video plus depth (MVD), free viewpoint video (FTV)

## I. INTRODUCTION

Free Viewpoint Television (FTV) [1] and 3-dimensional Television (3DTV) [2-3] are the most important applications of multiview video [4]. These systems employ many cameras to capture a scene. Typically, cameras in such systems are located around a scene on an arc or circle. Cameras in a system produce synchronized video streams that have to be converted into a representation that allows an user to freely select or alter the viewpoint he or she wants to watch. The most commonly used representation for the mentioned applications is multiview video and depth (MVD) format [5]. The multiview systems offer viewers very realistic depth impression through 3D content, that contains much more presented views of the scene than in fact have been acquired. These additional views are called virtual views. Virtual views are created by means of view synthesis from the video and depth maps acquired by the camera system.

In all those applications the produced representation needs to be transmitted to the viewer. Currently there are many works focused on efficient multiview and depth compression. Several techniques included in international standards have been developed in recent years, namely MVC [6], MV-HEVC and 3D-HEVC [7] to tackle the problem. Many more have been proposed within literature, e.g. [8-10].

One of the particular important problems is the bitrate allocation between texture and depth data. The problem have been studied quite extensively already [11-17] but there are still many questions opened. Tomasz Grajek Chair of Multimedia Telecommunications and Microelectronics Poznan University of Technology Poznań, Poland tgrajek@multimedia.edu.pl

In our previous paper [18] we have analyzed optimal bitrate allocation between video and depth data in case of HEVC simulcast compression for MVD video acquired from cameras with arbitrary locations around a scene. We have shown how to divide available bitrate between those two components to assure the best quality of the virtual views presented to the viewer in FTV or 3DTV systems.

During this study, we have observed that not all MVD video material behaved the same way. Some of test sequences exhibits strange, counterintuitive behavior. Namely, reducing the bit allocation for the depth component (effectively lowering total bit allocation) results in the increasing quality of the virtual views in some bitrate range. This strange behavior have been observed only for some, but not all test sequences.

Our assumption is that the quality of the depth data and thus its fidelity for view synthesis is not equal in all test data. Thus we will try to investigate the influence of the noise, or in general lowered quality of the depth data on the optimal bitrate distribution between texture and depth data.

The goal of the research is to investigate the influence of fidelity of depth maps on the quality of virtual view synthesis.

## II. METHODOLOGY OF EXPERIMENTS

In order to assess how fidelity of depth maps influences optimal bitrate allocation between depth and video data under the highest possible quality of virtual views assumption, experiments have been conducted according to block diagram presented in Fig. 1. At first, two views (i+1 - th and i-1 - th) with two associated depth maps have been independently encoded and decoded using HEVC [19]. Then, decoded views together with associated depth maps have been used to create a virtual view at position of *i*-th camera. This synthesized view is compared with the view acquired by the real camera exactly at the same position in 3D space as virtual one. Finally, the PSNR of virtual view created and total bitrate of all the data necessary for creating it, have been gathered together.

The experiments have been conducted on four test multiview video sequences with depth maps [20-21]. Summary of the test multiview sequences are given in Table 1. Camera positions for experiments have been chosen according to the Common Test Conditions (CTC) used by MPEG for testing 3D video compression [22]. To compress views and depth maps the reference test model of HEVC, namely HM v.16.18 [23] has been used. Since basic version of the software is prepared mainly for the video compression in 4:2:0 chroma format, depth maps have been encoded with all-zero chrome components. This results in negligible bitrate overhead for depth map coding, but corresponds to practical straightforward approach. For view synthesis the reference model software VSRS v.3.5 [24] has been used.

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Fig. 1. Structure of the performed experiments.

TABLE I. TEST SEQUENCES USED IN EXPERIMENTS

| Sequence Name      | Resolution | Used views | Synthesized view |
|--------------------|------------|------------|------------------|
| Ballet [20]        | 1024×768   | 3, 5       | 4                |
| Breakdancers [20]  | 1024×768   | 2,4        | 3                |
| BBB Butterfly [21] | 1280×768   | 49, 51     | 50               |
| BBB Flowers [21]   | 1280×768   | 39, 41     | 40               |

The simulcast compression of MVD data is controlled by four quantization parameters: two for video (QP) and two for depth (QD). Commonly two quantization parameters for video (QP) are set equal and two quantization parameters for depth (QD) also are set equal, resulting in only two free parameters one for both videos and one for both depth maps.

In [18] we propose a method for appropriate choosing QP and QP values (so called optimum QP-QD pairs) in order to reach highest possible virtual view quality.

Having optimum QP-QD pairs for unaltered (original) depth maps from [18], we have repeated experiments, this time with noise added depth maps. We have try several noise amplitudes. Adding noise N (see Fig. 1) is understood as adding random uniformly distributed values between (-N and +N) to each of the values stored in both depth maps. We have considered only that N is integer number (such as 1,2,3, etc.). For each N value, optimal QP-QD pairs have been extracted from data gathered during experiments.

## **III. EXPERIMENTAL RESULTS**

As in [18], to find the optimum QP-QD settings, all QP-QD pairs were tested (QP and QD values both from 15 to 50). In Fig. 2, red points represent results of compression with all possible combinations of quantization parameters for views and depth maps for four considered sequences, while black lines represent optimum QP-QD pairs for each test sequences. The optimum QP-QD pairs belong to envelope over cloud of PSNR-bitrate points that form the best R-D (rate-distortion) curve. For natural test sequences (*Ballet* and *Breakdancers*), when decreasing bitrate (applying stronger compression, i.e. selecting higher quantization parameters values) quality of virtual (synthesized) view is first increasing and after passing

some maximum point, starts decreasing. This "increasing" part of the curve is very surprising and interesting, because as a result of the reduced number of bits needed to represent MVD sequence we get better quality of virtual view (of course up to some point). However, this observation does not hold for artificial (computer generated) sequences, in our case *BBB Butterfly* and *BBB Flowers*.

Fig. 3 shows the relationship between the quality of synthesized view and total bitrate for exemplary test sequences with different quality of depth maps. The lines represent the optimum R-D curves. The blue lines represent quality of virtual view produced from video and depth maps without any noise. The magenta, green, and red lines represent quality of virtual view synthesized from video and depth maps with various noise (*N*) added. Black squares indicate *QP-QD* pair with the highest quality of virtual view for given depth map quality. Despite the amount of noise added, the best quality of virtual view is achieved for the same *QP* value (for our test sequences *QP=22*). However, the more noise we add the greater the *QD* value should be.

Fig. 4 presents relations between fidelity of depth maps and quality of the synthesized views for different amount of noise added. Fidelity of depth maps (*Depth PSNR*) is calculated as average depth maps quality associated with i+1 –th and *i*-1 -th views.

From Fig. 3 and Fig. 4 we clearly see the influence of added noise on the quality of virtual view, but only for high bitrates, when compression is not very strong. If we apply stronger compression (lower bitrates) the influence of added noise becomes negligible. The most straightforward explanation is: from some point, quantization error (quantization noise) introduced by compression becomes stronger than the noise added to depth maps before compression. If we recall, generally quantization removes high frequency components from images, so it will remove noise (noise in fact is high frequency signal). Adding stronger noise to the depth maps requires greater *QD* value (stronger quantization) to remove this added noise during compression of MVD sequences.

Abovementioned observation is also clearly visible in Fig. 5, where optimum QP-QD pairs have been plotted. Again for values of quantization parameters (QP) below 25÷30, the stronger noise we add, the higher QD should be set to get the highest possible quality of virtual views.



Fig. 2. Optimum R-D curves for unmodified depth maps with optimum QP-QD pairs.



Fig. 3. Optimum R-D curves for different quality of depth maps.





Fig. 4. Influence of fidelity of depth maps on virtual view quality. *Depth PSNR* is calculated as average depth map quality associated with i+1 and i-1 views.



Fig. 5. Optimum *QP-QD* pairs for exemplary test sequences for different fidelity of depth maps.

#### **IV. CONCLUSIONS**

In this paper we studied the performance of the optimum QP-QD pairs and showed the influence of the fidelity of depth maps on the quality of virtual views.

As can be expected, increasing the amount of noise added to depth maps leads to decrease of virtual views quality. However this observation holds only to some point, i.e. to the point in which quantization error (noise) introduced by compression is lower than the added noise. For stronger compression, when quantization noise is greater than added one, difference between quality of virtual views achieved for various amount of added noise is negligible.

For rather high bitrates, the stronger noise we add to depth maps, the higher QD should be applied to get the highest possible quality of virtual views.

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