EXTENDED VERSION OF ICIP (INTERNATIONAL CONFERENCE ON IMAGE PROCESSING) PAPER

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1. EXPERIMENTAL RESULTS (BD TABLE)

1.1. Using the Information of Cuboids

In Table 1, using the **cuboids map**, all the encoding results are reported and these results are submitted to **ICIP** conference except the last 2 sequences namely *Tango2* and *FoodMarket4*.

Table 1. Encoding complexity vs Bjontegaard delta data from the testset. (ICIP, Only 64 by 64, **Cuboids**)

| Sequence | BD-BR | BD-PSNR | ΔT |
|-----------------------|---------------|-----------|------------------------|
| Vehicles | 1.27% | -0.08 dB | 9.49% |
| CatRobot | 2.67% | -0.09 dB | 10.33% |
| DaylightRoad2 | 2.36% | -0.05 dB | 8.61% |
| Campfire | 6.87% | -0.15 dB | 14.29% |
| ParkRunning3 | 1.40% | -0.07 dB | 10.48% |
| Tango2 | 5.5% | -0.11 dB | 13.16% |
| FoodMarket4 | 8.6% | -0.18 dB | 18.68% |
| Average | 4.10% | -0.11 dB | $\boldsymbol{12.15\%}$ |
| Average Except Last 2 | 2.91 % | -0.09 dB | 10.64% |

1.2. Using the Information of Edge

In Table 2, using the **edge image**, all the encoding results are summarized. In this case, **Sobel** edge detection approach is used to generate the edge image.

1.3. Using the Information of Cuboids+Edge

In Table 3, the encoding outputs are presented using **both cuboids map and edge information**. When the split decision of a certain CU (64×64) is **equal** then only this decision is taken by **merging** these two separate approaches. On the other hand, if these two distinct methods contradict to obtain a decision of a specific CU, the decision is come from **VVC** (Simply, this CU is handovered to VVC to get the split decision).

Table 2. Encoding complexity vs Bjontegaard delta data from the testset. (Only 64 by 64, **Edge**)

| Sequence | BD-BR | BD-PSNR | ΔT |
|-----------------------|-------|-----------|------------------------|
| Vehicles | 0.97% | -0.06 dB | 4.74% |
| CatRobot | 2.02% | -0.07 dB | 8.45% |
| DaylightRoad2 | 0.84% | -0.02 dB | 9.82% |
| Campfire | 1.32% | -0.03 dB | 11.17% |
| ParkRunning3 | 0.85% | -0.05 dB | 13.39% |
| Tango2 | 2.05% | -0.04 dB | 16.17% |
| FoodMarket4 | 4.68% | -0.11 dB | 32.84% |
| Average | 1.82% | -0.05 dB | $\boldsymbol{13.80\%}$ |
| Average Except Last 2 | 1.20% | -0.05 dB | 9.51% |

1.4. Using the Information of Cuboids+Edge+Threshold

In Table 4, the encoding outputs are shown by using the information of cuboids map, edge and setting a threshold. This method is almost analogous to subsection 1.3. However, there is a subtle difference between the subsection 1.3 and 1.4. A short description is given below of this method.

Assuming that the split decision of certain CU (64×64) is d_1 which obtained from cuboids map. On the other hand, the decision is d_2 that is coming from edge model. Now, the final decision is calculated in the following equ., where, d is the final split decision, $W_1=W_2=0.5$ and the threshold = 0.5.

$$d = \frac{(d_1 * W_1) + (d_2 * W_2)}{(W_1 + W_2)} \tag{1}$$

2. EXPERIMENTAL RESULTS (BD CURVE)

In this section, all the BD curves for various test sequences are shown. Fig. 1, Fig. 2, Fig. 3, Fig. 4, Fig. 5, Fig. 6 and Fig. 7 show the RD performance of *Vehicles*, *CatRobot*, *DaylightRoad2*, *Campfire*, *ParkRunning3*, *Tango2*, *FoodMarket4* respectively.

Table 3. Encoding complexity vs Bjontegaard delta data from the testset. (Only 64 by 64, **Edge + Cuboids**)

| Sequence | BD-BR | BD-PSNR | ΔT |
|-----------------------|---------------|-----------|------------|
| Vehicles | 0.20% | -0.01 dB | 0.68% |
| CatRobot | 0.94% | -0.03 dB | 2.23% |
| DaylightRoad2 | 0.29% | -0.01 dB | 3.44% |
| Campfire | 0.36% | -0.01 dB | 3.31% |
| ParkRunning3 | 0.23% | -0.01 dB | 6.29% |
| Tango2 | 1.51% | -0.03 dB | 7.01% |
| FoodMarket4 | 1.47% | -0.03 dB | 7.43% |
| Average | 0.71 % | -0.02 dB | 4.34% |
| Average Except Last 2 | 0.40% | -0.01 dB | 3.19% |

Table 4. Encoding complexity vs Bjontegaard delta data from the testset. (Only 64 by 64, **Edge + Cuboids + Threshold**)

| Sequence | BD-BR | BD-PSNR | ΔT |
|-----------------------|---------------|--------------------|------------|
| Vehicles | 0.37% | -0.02 dB | 1.01% |
| CatRobot | 2.13% | -0.07 dB | 3.79% |
| DaylightRoad2 | 1.04% | -0.03 dB | 5.62% |
| Campfire | 1.06% | -0.03 dB | 5.21% |
| ParkRunning3 | 0.50% | -0.03 dB | 5.60% |
| Tango2 | 4.51% | -0.09 dB | 11.11% |
| FoodMarket4 | 8.02% | -0.17 dB | 16.87% |
| Average | 2.52 % | -0.06 dB | 7.03% |
| Average Except Last 2 | 1.02% | $-0.04\mathrm{dB}$ | 4.23% |

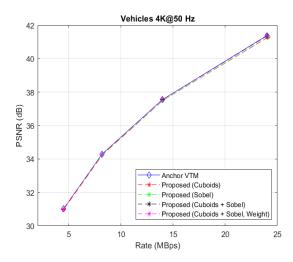


Fig. 1. RD curve for the *Vehicles* sequence.

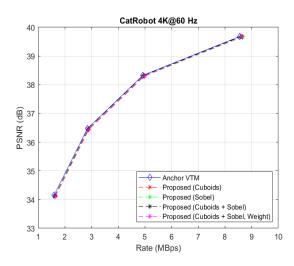


Fig. 2. RD curve for the CatRobot sequence.

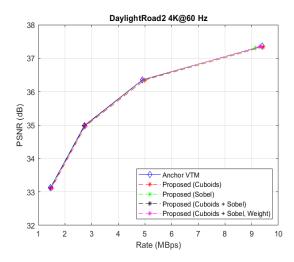


Fig. 3. RD curve for the DaylightRoad2 sequence.

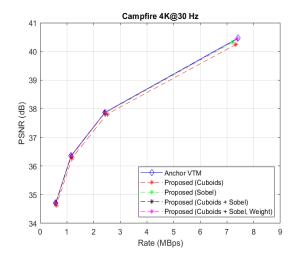


Fig. 4. RD curve for the *Campfire* sequence.

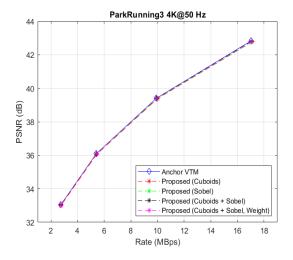


Fig. 5. RD curve for the *ParkRunning3* sequence.

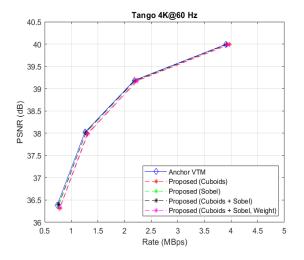


Fig. 6. RD curve for the Tango2 sequence.

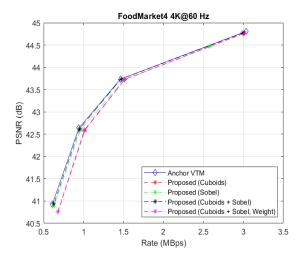


Fig. 7. RD curve for the *FoodMarket4* sequence.

3. CONCLUSION

- It is evident that, **edge model** performs better in case of BD-BR compared to cuboids method and it is shown in Table 2.
- Merge options of edge and cuboids have the outstanding performance in terms of BD-BR in comparison with the single methods. This results are shown in Table 3 and 4.
- *Tango2 and Foodmarkte4* act as **outliers** in terms of BD-BR for all the methods that are used here. We can simply discard these two in this regard or these sequences can be reported but needs to be shown as outliers.
- I prefer the method of using the information of cuboids+edge right now that is described in subsection
 1.3 for getting the decision of 64 × 64 CU. The reason of choosing this one is that this technique has the lowest bit rate loss in terms of BD-BR among the others.
- On top of that, if our method is able to anticipate the decisions **more perfectly** at 64×64 level, definitely, at the successive bottom levels, for instance, 32×32 or 16×16 , our proposed method will **perform well**. In contrast, if the decision is made as **wrong** at 64×64 level, the bit rate as well as RD performance for the successive lower levels may be deteriorated greatly like as exponentially.
- Though the time savings of cuboids+edge (subsection: 1.3) method at 64 × 64 level is comparatively small among the others, we will get the better results at 32 × 32 level as these step has lowest bit rate loss. Also, we have the experimental results that is up to 70% time savings starting from 50% can be achieved if our method is able to provide more accurate split decision.