# Efficient AV1 Video Coding Using A Multi-Layer Framework

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# Abstract

This paper proposes a multi-layer multi-reference prediction framework for effective video compression. Current AOM/AV1 baseline uses three reference frames for the inter prediction of each video frame. This paper first presents a new coding tool that extends the total number of reference frames in both forward and backward prediction directions. A multilayer framework is then described, which suggests the encoder design and places different reference frames within one Golden Frame (GF) group to different layers. The multi-layer framework leverages the existing coding tools in the AV1 baseline, including the tool of "show\_existing\_frame" and the reference frame buffer update module of a wide flexibility. The use of extended ALTREF\_FRAMEs is proposed, and multiple ALTREF\_FRAME candidates are selected and widely spaced within one GF group. ALTREF\_FRAME is a constructed, noshow reference obtained through temporal filtering of a look-ahead frame. In the multi-layer structure, one reference frame may serve different roles for the encoding of different frames through the virtual index manipulation. The experimental results have been collected over several video test sets of various resolutions and characteristics both texture- and motionwise, which demonstrate that the proposed approach achieves a consistent coding gain compared to the AV1 baseline. For instance, using PSNR as the distortion metric, an average bitrate saving of 5.57+% in BDRate is obtained for the CIF-level resolution set, some of which has a gain of up to 13+%, and 4.47% on average for the VGA-level resolution set, some of which up to 18+%.

# 1 Introduction

Google embarked on the open-source project entitled WebM [1] in 2010 to develop open-source, royalty unencumbered video codecs for the Web. WebM released two editions, first VP8 [2] and then VP9 [3], where VP9 achieves a coding efficiency similar to the latest video codec from MPEG entitled HEVC [4]. VP9 has delivered a significant improvement to YouTube in terms of quality of experience metrics over the primary format H.264/AVC. Google then joined the Alliance for Open Media (AOM) [5] effort for a Joint Development Foundation project formed with a few other industrial leaders, to define and develop media codecs, media formats, and related technologies [6][7], still under the open standard. In this paper, we focus on the multiple reference inter prediction aspect for the to-be first edition of the AOM video codec, namely AV1.

The use of multiple reference frames facilitates a better inter prediction for videos with a variety of motion characteristics, such as the presence of occlusion and uncovered objects, lighting changes, fade-in and fade-out effects, static background, etc. The state-of-the-art techniques proposed the use of both short-term references and long-term references (LTR) [8] to adapt to the specific content and motion features presented in the coded frame. The Rate-Distortion (RD) performance optimization requests a trade-off between identifying the best reference for one coded frame and the overhead bits spent in signaling the multi-reference candidates [9–11]. Further, the encoder-side computational complexity should be considered [12]. Leveraging the multiple reference resources, one video frame may be forward predicted or backward predicted or both, referred to as bidirectionally predicted [13]. Special modes have been designed to effectively encode these bi-predictive frames, i.e. B frames, including the use of DIRECT mode [14, 15] and the design of hierarchical B frames [16].

In this paper, we first propose a new coding tool that extends the number of reference frames in AV1 from three to six to increase the flexibility and adaptability for the multi-reference prediction. Furthermore, we describe the encoder design through the exploit of extended ALTREF\_FRAMES, and form a multi-layer framework facilitated by the two coding tools provided in AV1, namely the "show\_existing\_frame" and the virtual index manipulation. The experimental results validate the efficiency of the multi-layer structure with a consistent coding gain compared to the AV1 baseline over a variety of video test sets in various resolutions.

### 2 A New Coding Tool

#### 2.1 AV1 Baseline Reference Frame Design

Current AOM/AV1 baseline uses three reference frames for the coding of each intercoded frame: LAST\_FRAME, GOLDEN\_FRAME, and ALTREF\_FRAME. The three references used by one specific coded frame are selected from a reference frame buffer that can store up to eight frames. In general, an AV1 encoder may select LAST\_FRAME from a near past frame, and GOLDEN\_FRAME from a distant past. ALTREF\_FRAME is a no-show frame usually constructed from a distant future frame through temporal filtering. An AV1 encoder may apply different temporal filtering strength to construct an ALTREF\_FRAME, adapting to various motion smoothness levels across frames. A so-called Golden Frame (GF) group can be established, and all the frames within one GF group may share the same GOLDEN\_FRAME and the same ALTREF\_FRAME. LAST\_FRAME may be updated constantly. When the distant future frame that provides ALTREF\_FRAME is actually being coded, it is referred to as an OVERLAY frame but treated as a regular inter frame. OVERLAY frames usually cost fairly small amounts of bits as ALTREF\_FRAME may serve as an ideal prediction.

AV1 baseline designs two types of inter prediction: A block predicted from one reference frame with a corresponding motion vector is said to be in a *single prediction* mode, while a block predicted using two different reference frames and two corre-



Figure 1: AV1 reference frame buffer update.

sponding motion vectors is said to be in a *compound* mode. *Compound* prediction always chooses the two predictions from two different directions, and generates a new predictor by simply averaging the two *single* predictors.

The reference frame buffer update in AV1 is realized through two syntaxes in the frame level: First is an eight-bit reference Refresh Flag, with each bit signaling whether the corresponding frame in the reference buffer needs to be refreshed or not by the newly coded frame; The second syntax is a mechanism referred to as "Virtual Index Mapping", as shown in Fig. 1. Each of the three references is labeled by a unique virtual index, and both the encoder and the decoder maintains a Reference Frame Map to associate a virtual index with the corresponding physical index that points to its location within the reference buffer. Both the Refresh Flag and the virtual indices are written into the bitstream. The advantage of using such mapping mechanism is to largely avoid memory copying whenever reference frames are being updated.

# 2.2 Extended Reference Frame - A New Coding Tool

To make full use of the reference frame buffer designed to store a maximum of eight frames, we propose a new coding tool that extends the number of reference frames for each coded frame from three to six. Specifically, we add LAST2\_FRAME, LAST3\_FRAME, and BWDREF\_FRAME, where the former two references are usually selected from past for forward prediction and the later selected through look-ahead for backward prediction. Moreover, different from ALTREF\_FRAME, BWDREF\_FRAME leverages the existing coding tool provided by the AV1 baseline, namely the "show\_existing\_frame" feature, to encode a look-ahead frame without applying temporal filtering, thus no corresponding OVERLAY frame is needed. The use of BWDREF\_FRAME is more applicable as a backward reference at a relatively shorter future distance. The extended reference frames allow a total of six candidates for the *single prediction* mode, and a total of 8 candidates for the compound mode as a combination of a forward predictor and a backward predictor are considered. Consequently each video frame is offered an extensively larger set of multi-reference prediction modes, thus leading to a great potential for the rate-distortion (RD) performance improvement.

To efficiently encode the extended number of references, context-based, bit-level binary tree structures are adopted, as shown in Fig. 2a and Fig. 2b. Depending on the availability and the final coding modes of the two neighboring blocks within the causal window - on the top and at the left, five contexts are designed for the coding of every bit in either *single reference* or *compound* prediction.



Figure 2: Binary tree structure design for context-based, bit-level entropy coding of the extended reference frames.



Figure 3: Encoder design using extended ALTREF\_FRAMEs.

Moreover, through the use of BWDREF\_FRAME, a symmetric framework of multireference prediction is established for the *compound* mode: (1) A BWDREF\_FRAME may be selected from a nearer future frame, paired with the nearer past LAST\_FRAME; (2) A BWDREF\_FRAME may be selected from a father future frame, paired with the father past LAST2\_FRAME; and (3) ALTREF\_FRAME may be selected from a distant future frame, paired with the GOLDEN\_FRAME in the distant past. The use of extended reference frames that are spread out widely thus allows an adaptation to the dynamic motion characteristics within one video sequence.

#### 3 Encoder Design - A Multi-Layer Framework

Aligned with the new coding tool introduced in Session 2, we address the encoder design in this session. An extended ALTREF\_FRAME scheme is proposed, which adopts more than one ALTREF\_FRAME candidates within one GF group. Still complied with the syntax that allows one ALTREF\_FRAME at maximum for the coding of each frame, several frames may be buffered to act as ALTREF\_FRAME serving for different frames. These candidates may be selected from various locations within the GF group and have various temporal filtering strengths applied. A multi-layer framework is then constructed with the aid of the extended ALTREF\_FRAMEs. Such encoder design is targeted to make full use of the eight-frame spots in the reference buffer and best leverage the new coding tool of extended reference frames.



(b) Symmetric multi-reference prediction in encoding order (SE for non-filtered ALTREF\_FRAMEs and O for filtered ones

Figure 4: An example of the symmetric multi-layer multi-reference framework.

# 3.1 Extended ALTREF\_FRAMEs

As illustrated in Fig. 1, the "Virtual Index Mapping" mechanism specifies how the reference frame buffer is updated. Both the encoder and the decoder use identical virtual indices associate with the same reference frame, and maintain a respective Reference Frame Map to track the corresponding physical location in the reference frame buffer. Within one GF group the encoder may buffer multiple frames to serve as the ALTREF\_FRAME candidates, which is referred to as the extended ALTREF\_FRAME scheme. To facilitate such an encoder design, an ALTREF Map is exploited only at the encoder side, as shown in Fig. 3. The ALTREF Map in essence is used to track the encoder's choice on the current selected ALTREF\_FRAME. It stores the virtual indices of all the ALTREF\_FRAME candidates, and the virtual index associated with the current selected ALTREF\_FRAME is written to the bitstream.

# 3.2 Multi-Layer-Multi-Reference Framework

A multi-layer framework may be constructed using the extended ALTREF\_FRAMEs, and an example is given in Figure 4a. This framework constructs a multi-layer structure where the top layer frames are coded through the prediction from the lower layers. As discussed in Sec. 2.1, one GF group starts with the coding of either a KEY\_FRAME or an OVERLAY frame, serving as the GOLDEN\_FRAME, followed by the coding of a distant future ALTREF\_FRAME candidate, denoted as ALTO in the figure. These two frames together form the bottom layer of the multi-layer structure. Given a GF group, we propose to use the new coding tools to construct multi-layer structure with the following steps.

Step 1. Insert k extended ALTREF\_FRAMEs and space them equally in the GF group. Since the extended ALTREF\_FRAME along with the original ALTREF\_FRAME lay out the bottom layer of the hierarchy structure, they will all serve as a distant future reference. We ensure there is enough space between each frame in the bottom layer by letting

$$k = \min\left(\left\lfloor \frac{\text{length}(\text{GF})}{4} \right\rfloor - 1, 2\right).$$

Note that due to the size constraint of the reference buffer, the maximum number of ALTREF\_FRAME allowed is two.

The extended ALTREF\_FRAME's divide the GF group into several subgroups. Compared to the original ALTREF\_FRAME, the extended ALTREF\_FRAME's are always located closer to the current coded frame, hence, a predictor of higher quality may be obtained without the use of temporal filtering. When an ALTREF\_FRAME is not filtered, the "show\_exsisting\_frame" flag is turned on and no OVERLAY frame is added. The coding of both ALT2 and ALT1 may choose ALT0 to serve as their ALTREF\_FRAME.

Step 2. Following coding order, the BWDREF\_FRAME in each subgroup is constructed and formed the second layer from the top of the multi-layer structure. Through the virtual index manipulation, coding of the BWDREF\_FRAME will use the near ALTREF\_FRAME (e.g. ALT2 or ALT1) to serve as its BWDREF\_FRAME and the distant ALTREF\_FRAME (ALT0) to serve as its ALTREF\_FRAME.

**Step 3.** The remaining frames in the GF group form the top layer of the multi-layer structure. These frames use the near future reference frame as their BWDREF\_FRAME, and the next future reference frame as their ALTREF\_FRAME, if available. For instance, in Figure 4a, all the first frames in the top layer of each subgroup have their own BWDREF\_FRAME and ALTREF\_FRAME explicitly coded. For those second frames in the top layer of each subgroup, through virtual index manipulation, the two available ALTREF\_FRAME candidates may serve as BWDREF\_FRAME and ALTREF\_FRAME respectively. For instance, for Frame 6, ALT2 may serve as BWDREF\_FRAME and ALTREF\_FRAME and ALTREF\_FRAME and ALTREF\_FRAME. For the last frame in the last subgroup of the GF group, i.e. Frame 13 in the figure, ALT0 is the only available backward reference, which may simply act as ALTREF\_FRAME and no BWDREF\_FRAME may be used.

Such coding structure is designed to minimize the decoding delay while to maintain a diversifying reference frame list to achieve a larger coding gain for the GF group. It is noted that the virtual index manipulation is only conducted at the encoder side, as the decoder simply identifies the virtual index associated with a specific reference frame from the bitstream. The encoder determines whether one buffered reference frame should act as BWDREF\_FRAME or act as ALTREF\_FRAME. We still maintain the size of reference frame buffer in the new coding tool the same as that specified in the AV1 baseline, considering the overall encoder complexity as well as the hardware design for the AV1 codec.

#### 4 Experiment Results

In this section the experimental results of using extended reference frames are presented. The encoder adopts the proposed multi-layer framework and the results are compared against the AV1 baseline. We have tested the new approach over four different data sets, namely *low-res*, *derflr*, *medium-res*, and *hd-res*, where the first two sets contain video clips of the CIF/SIF-level resolution, the third set contains VGA-level resolution, and the last set contains HD-level resolution (e.g. 720p). The overall results are summarized in Table 1. The example results of individual video clips for the *low-res* and *medium-res* are given in Table 3. In all cases, we simply use a VBR bitrate-controlled test condition, where videos are run at a range of target bitrates with a standard rate-control mechanism to obtain RD curves. The BDRate [17] is computed using the global PSNR as the distortion metric.

Compared against AV1 baseline, the new coding tool of the extended reference frames and the corresponding multi-layer encoder design increase the computational complexity at both the encoder and the decoder, but have a nearly negligible impact on the decoder side, as described in Table 2.

Table 1: Coding gains of the multi-layer framework using extended reference frames compared against AV1 baseline in terms of BDRate reduction over datasets of various resolutions.

| Data Set | low-res | derflr  | medium-res | hd-res  |
|----------|---------|---------|------------|---------|
| Ext-Refs | -5.573% | -4.465% | -4.471%    | -3.192% |

Table 2: Computational complexity increment of the proposed approach compared against AV1 baseline.

|          | Encoder Side | Decoder Side |
|----------|--------------|--------------|
| Ext-Refs | +74.16%      | +2.12%       |

#### 5 Conclusion and Future Work

In this paper, we first introduce a new coding tool that extends the total number of reference frames in the AV1 baseline. We then propose a multi-layer framework for the encoder design, which leverages the new coding tool through the use of extended ALTREF\_FRAMEs and the virtual index manipulation. The multi-layer, multireference prediction framework substantially increases the overall coding efficiency over an abundant set of video clips of various content and motion characteristics with a wide range of resolutions, providing evidence for the effectiveness of the proposed framework. The computational complexity at the decoder side is negligible. For the next step we will focus on the encoder-side complexity reduction. For instance, through the use of a much smaller set of block partition/prediction candidates for some of the references (e.g. LAST2\_FRAME and LAST3\_FRAME) complexity may be reduced at a sacrifice of the coding gain. We will also investigate the more optimized encoder design specifically applied to the higher resolution videos so that the coding effectiveness on the higher resolution videos may be on par with that on the lower resolution scenarios. Also, it is possible for both the encoder and the decoder to keep track of the update of all the reference frames, and check whether either LAST2\_FRAME or LAST3\_FRAME belong to the previous GF group. As the current GF group always start with an updated GOLDEN\_FRAME it is possible to remove the use of LAST2\_FRAME or LAST3\_FRAME if they are not in the current GF group, which may greatly help on the encoder speedup whereas incur negligible coding performance degradation.

| Video                 | Resolution | BDRate  | Video               | Resolution       | BDRate  |
|-----------------------|------------|---------|---------------------|------------------|---------|
|                       |            | Saving  |                     |                  | Saving  |
|                       |            | (%)     |                     |                  | (%)     |
| akiyo                 | CIF        | -5.789  | BQMall              | 832×480          | -6.117  |
| bowing                | CIF        | -3.885  | BasketballDrillText | $832 \times 480$ | -3.937  |
| bridge_close          | CIF        | -5.908  | BasketballDrill     | $832 \times 480$ | -2.970  |
| bridge_far            | CIF        | -6.777  | Flowervase          | $832 \times 480$ | -4.109  |
| bus                   | CIF        | -4.528  | Keiba               | $832 \times 480$ | -1.274  |
| $\operatorname{city}$ | CIF        | -5.041  | Mobisode2           | $832 \times 480$ | -2.671  |
| coastguard            | CIF        | -9.797  | PartyScene          | $832 \times 480$ | -5.837  |
| container             | CIF        | -12.683 | RaceHorses          | $832 \times 480$ | -1.340  |
| crew                  | CIF        | -3.642  | aspen               | 480p             | -2.751  |
| flower                | CIF        | -13.176 | crowd_run           | 480p             | -11.267 |
| foreman               | CIF        | -4.433  | $old\_town\_cross$  | 480p             | -4.323  |
| harbour               | CIF        | -8.018  | red_kayak           | 480p             | 1.840   |
| highway               | CIF        | -2.426  | rush_field_cuts     | 480p             | -9.318  |
| husky                 | CIF        | -4.256  | sintel_trailer_2k   | 480p             | -4.825  |
| ice                   | CIF        | -4.308  | snow_mnt            | 480p             | 0.496   |
| mobile                | CIF        | -12.347 | $speed_bag$         | 480p             | -7.850  |
| mother daughter       | CIF        | -4.794  | station2            | 480p             | -2.548  |
| news                  | CIF        | -3.214  | $tears_of_steel1$   | 480p             | -4.122  |
| pamphlet              | CIF        | -1.446  | tears_of_steel2     | 480p             | -6.668  |
| paris                 | CIF        | -3.305  | $touchdown_pass$    | 480p             | -2.321  |
| signirene             | CIF        | -5.419  | $west_wind_easy$    | 480p             | -1.235  |
| silent                | CIF        | -3.380  | $controlled\_burn$  | 480p             | -1.340  |
| students              | CIF        | -6.415  | crew                | 4CIF             | -2.476  |
| tempete               | CIF        | -9.465  | harbour             | 4CIF             | -8.387  |
| waterfall             | CIF        | -7.412  | ice                 | 4CIF             | -2.876  |

Table 3: Coding gains of the multi-layer framework using extended reference frames compared against AV1 baseline in terms of BDRate reduction on the low and mid resolution datasets (50 video clips).

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