

A Fast Multilevel Successive Elimination Algorithm

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ABSTRACT

In this paper, A Fast Multi-level Successive Elimination Algorithm (FMSEA) is presented for block matching motion estimation in video coding. Motion estimation accuracy of FMSEA is equal to that of Multilevel Successive Elimination Algorithm(MSEA). FMSEA can reduce the computations for motion estimation of MSEA by using partial distortion elimination technique. The efficiency of the proposed algorithm was verified by experimental results.

요약

본 논문에서는 비디오코딩의 움직임 추정을 위한 빠른 다단계 연속제거 알고리즘(FMSEA: Fast Multilevel Successive Elimination Algorithm)을 제안하였다. FMSEA의 움직임 추정 정확도는 Multilevel Successive Elimination Algorithm(MSEA)과 동일하다. 부분 왜곡 제거 기법을 사용하는 FMSEA는 MSEA의 연산량을 효과적으로 줄일 수 있다. 실험을 통하여 제안된 알고리즘의 효율성을 확인하였다

Key words: Multilevel Successive Elimination Algorithm, Motion estimation, Motion vector

1. Introduction

Video frame has spatial redundancy and consecutive frames have very big temporal redundancy. The temporal redundancy can be removed by using motion estimation and compensation techniques. So, motion estimation and compensation techniques have been used widely in video coding.

Motion estimation methods are classified into two classes of block matching algorithms (BMA)[1][2] and pel-recursive algorithms (PRA)[3]. Owing to their

implementation simplicity, block matching algorithms have been widely adopted by various video coding matching block of pixels within the search window in standards such as CCITT H.261[4], ITU-T H.263[5], and MPEG[6]. In BMA, the current image frame is partitioned into fixed-size rectangular blocks. The motion vector for each block is estimated by finding the best the previous frame according to matching criteria.

Although Full Search algorithm (FSA) finds the optimal motion vector by searching exhaustively for the

best matching block within the search window, its high computation cost limits its practical applications.

To reduce computation cost of FSA, many fast block matching algorithms such as three step search[7], 2-D log search[2], orthogonal search[8], cross search[9], one-dimensional full search[10], variation of three-step search [11][12], unrestricted center-biased diamond search[13] etc. have been developed. As described in[14], these algorithms rely on the assumption that the motion compensated residual error surface is a convex function of the displacement motion vectors, but this assumption is rarely true [15].

Therefore, the best match obtained by these fast algorithms is basically a local optimum.

Without this convexity assumption, Successive Elimination Algorithm (SEA) proposed by Li and Salari [16] reduces the computation cost of the FSA. To reduce the computation cost of SEA, Multilevel Successive Elimination Algorithm (MSEA) [17] were proposed. Our research team proposed Efficient Multilevel Successive Elimination Algorithms for Block Matching Motion Estimation (EMSEA) [18] to reduce the computation cost of MSEA. The partial distortion elimination scheme of EMSEA was improved and then

$$B_c(i,j)(m,n)=f_c(i+m,j+n) \quad (1)$$

$$B_p^{(i,j,x,y)}(m,n)=f_p(i-x+m,j-y+n) \quad (2)$$

where x and y represent two components of a candidate motion vector, $-M \leq (x,y) \leq M$ and $0 \leq (m,n) \leq N-1$. The SAD between the two blocks is defined as:

$$SAD(x,y) = \sum_{m=0}^{N-1} \sum_{n=0}^{N-1} |B_c^{(i,j)}(m,n) - B_p^{(i,j,x,y)}(m,n)| \quad (3)$$

The goal of motion estimation is to find the best pair of indices (x,y) so that the following sum of absolute difference is minimized, as

The motion estimation accuracy of FMSEA is identical to that of FSA and the computation cost of MSEA is reduced by using FMSEA.

II. Multilevel Successive Elimination Algorithm

Let $f_c(i,j)$ and $f_p(i,j)$ denote the intensity of the pixel with coordinate (i,j) in the current frame and the previous frame respectively. Assume that the size of a block (Y component of the macro block in H.263) is $N \times N$ pixels, the search window size is $(2M+1) \times (2M+1)$ pixels, and the matching criteria function is the sum of absolute difference(SAD) which is the distortion between two blocks.

Let $B_c^{(i,j)}$ and $B_p^{(i,j,x,y)}$ denote the target block and reference block in the current frame and the previous frame with the top left corners at (i,j) and $(i-x,j-y)$ respectively. $B_c^{(i,j)}$ is the target block which requires motion vector.

follows:

$$d = \min_{x,y} SAD(x,y) \quad (4)$$

Applying mathematical inequality $||X||_1 - ||Y||_1 \leq ||X - Y||_1$ [19] for $X = B_c^{(i,j)}$ and $Y = B_p^{(i,j,x,y)}$ gives

$$|R - M(x,y)| \leq SAD(x,y) \quad (5)$$

where

$$R = ||B_c^{(i,j)}||_1 = \sum_{m=0}^{N-1} \sum_{n=0}^{N-1} B_c^{(i,j)}(m,n)$$

$$M(x, y) = \left\| \mathbf{B}_p^{(i,j,x,y)} \right\|_1 = \sum_{m=0}^{N-1} \sum_{n=0}^{N-1} \mathbf{B}_p^{(i,j,x,y)}(m, n)$$

$$\text{SAD}(x, y) = \left\| \mathbf{B}_c^{(i,j)} - \mathbf{B}_p^{(i,j,x,y)} \right\|_1 = \sum_{m=0}^{N-1} \sum_{n=0}^{N-1} \left| \mathbf{B}_c^{(i,j)}(m, n) - \mathbf{B}_p^{(i,j,x,y)}(m, n) \right|$$

R and $M(x,y)$ are the sum norms of the two blocks and are pre-computed using the efficient procedure described in [16].

In MSEA, each block is partitioned into several sub-blocks. First, the block is partitioned into four sub-blocks with size $(N/2) \times (N/2)$. Then each sub-block is partitioned into four sub-blocks with size $(N/4) \times (N/4)$. This procedure can be repeated until the size of the sub-blocks become 2×2 .

The maximum level of such partition is $L_{\max} = \log_2 N - 1$ for the blocks with size $N \times N$. The MSEA with L -level partition, $0 \leq L \leq L_{\max}$, is called L -level MSEA, and the SEA corresponds to the 0-level MSEA.

At the l -th level of the L -level MSEA, where $0 \leq l \leq L$, the number of the sub-blocks is $S_l = 2^{2l}$, and each sub-block is of the size $N_l \times N_l$, where $N_l = N/2^l$. In L -level MSEA, we define $R_l^{(u,v)}$, $M_l^{(u,v)}(x,y)$, $\text{SAD}_l^{(u,v)}(x,y)$, $\text{SAD_SB}_l(x,y)$ as follows:

$$R_l^{(u,v)} = \sum_{m=0}^{N_l-1} \sum_{n=0}^{N_l-1} \mathbf{B}_c^{(i,j)}(m + uN_l, n + vN_l) \quad (6)$$

$$M(x, y) = \left\| \mathbf{B}_p^{(i,j,x,y)} \right\|_1 = \sum_{m=0}^{N-1} \sum_{n=0}^{N-1} \mathbf{B}_p^{(i,j,x,y)}(m, n) \quad (7)$$

$$\text{SAD}(x, y) = \left\| \mathbf{B}_c^{(i,j)} - \mathbf{B}_p^{(i,j,x,y)} \right\|_1 = \sum_{m=0}^{N-1} \sum_{n=0}^{N-1} \left| \mathbf{B}_c^{(i,j)}(m, n) - \mathbf{B}_p^{(i,j,x,y)}(m, n) \right| \quad (8)$$

$$\text{SAD_SB}_l(x, y) = \sum_{u=0}^{2^l-1} \sum_{v=0}^{2^l-1} \left| R_l^{(u,v)} - M_l^{(u,v)}(x, y) \right| \quad (9)$$

where (u,v) is the index of a sub-block and $0 \leq l \leq L$. At l -th level partition, where $0 \leq u, v \leq 2^l - 1$, it can be easily seen that the following relation holds:

$$\text{SAD}(x, y) = \sum_{u=0}^{2^L-1} \sum_{v=0}^{2^L-1} \text{SAD}_l^{(u,v)}(x, y) \quad (10)$$

$\text{SAD_SB}_l(x,y)$ can be classified as equation (11).

In [17], X. Q. Gao etc. proved that equation (5) can be expressed as equation (12) and then they proposed the MSEA which is based on equation (12).

$$\text{SAD_SB}_l(x, y) = \begin{cases} R - M(x, y) & l = 0 \\ \left| \sum_{u=0}^{2^l-1} \sum_{v=0}^{2^l-1} \left| R_l^{(u,v)} - M_l^{(u,v)}(x, y) \right| \right| & 1 \leq l \leq L \\ \text{SAD}(x, y) & l = L + 1 \end{cases}$$

(11)

$$\text{SAD_SB}_l(x,y) \leq \text{SAD_SB}_{l+1}(x,y) \quad (12)$$

where $0 \leq l \leq L$.

The L -level MSEA procedure is as follows:

- 1 select an initial candidate motion vector within the search window in the previous frame.
- 2 calculate the motion vector (\mathbf{MV}) and the SAD at the selected search point. These \mathbf{MV} and SAD become the current temporary motion vector and the current minimum SAD respectively.
(curr_temp_MV= \mathbf{MV} ,
curr_min_SAD= SAD)
- 3 select another search point among the rest of the search points.
- 4.0 calculate the SAD_SB_0 at the selected search point. if(curr_min_SAD \leq SAD_SB_0) then goto 7.
- 4.1 calculate the SAD_SB_1 at the selected

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    search point.
    if(curr_min_SAD ≤ SAD_SBl)
    then goto 7.
    .
    .
    .
4.L calculate the SAD_SBL at the selected
    search point.
    if(curr_min_SAD ≤ SAD_SBL)
    then goto 7.
5 calculate the SAD at the selected search
    point.
    if (curr_min_SAD ≤ SAD)      then goto
7.
6 curr_min_SAD=SAD
    calculate the motion vector    at the
    selected point. This    motion vector
    becomes the    current temporary motion
    vector.(curr_temp_MV=MV)
7 if (all the search points in the search
    window are not tested?) then goto 3.
8 the optimum motion vector=
    curr_temp_MV,
    the global minimum SAD=
    curr_min_SAD.
    
```

The MSEA speeds up the process of finding the motion vector by eliminating hierarchically impossible candidate motion vectors in the search window before their SAD calculation which requires intensive computations.

If we delete step 4.0~4.L in the L-level MSEA procedure, then the procedure becomes the full search algorithm procedure. If we delete step 4.1~4.L, then the procedure becomes the successive elimination algorithm procedure.

III. Fast Multilevel Successive

Elimination Algorithm

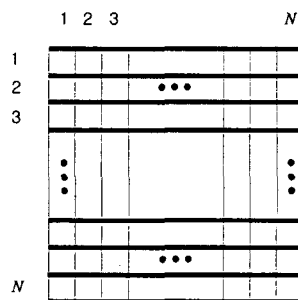
As shown MSEA procedure step 4.1 ~ ~ ~ 4.L, MS_l EA can eliminate impossible candidate vectors before their SADs are computed. So, MSEA can reduce the computations of SEA.

If Partial distortion elimination (PDE)[20] technique is applied to MSEA, then the computations of SADs calculation can be reduced. In MSEA, SADs calculation must actually be computed for all $N \times N$ pixels.

PDE is an effective speed up technique used in vector quantization to find a best reconstruction vector from a set of vector code words.

All of the terms in the equation (3) are positive. If at any point the partially evaluated sum exceeds the current minimum $SAD(curr_SAD_{min})$, that candidate block cannot be the best matching block and the remainder of the sum does not need to be calculated. While it is not efficient to test the partial sum against the $curr_SAD_{min}$ every additional term is added, a reasonable compromise is to perform the test after N times additions when block size is $N \times N$ as shown in fig2. So, the maximum number of PDE test is N times.

In MSEA, SAD is calculated all the $N \times N$ pixels and then the calculated SAD is compared with $curr_SAD_{min}$.



[Fig. 2] PDE test in SAD calculation

If step 5 of MSEA is replaced with the following steps, then MSEA procedure becomes that of FMSEA.

step 5.0 calculate the SAD at the

selected search block for N pixels.

step 5.1 if ($curr_SAD_{min} \leq SAD$)

then goto step 7.

else if SAD is not calculated for all pixels($N \times N$) then goto step 5.0

IV. Experimental Results of Fast Block Sum Pyramid Algorithm

The standard video sequences with qcif(176x144) such as "foreman.qcif", "trevor.qcif" were used in the experiment and we tested 100 frames of the sequences. The block size was 16x16 pixels ($N=16$). The size of the search window was 31x31 pixels ($M=15$) and only integer values for the motion vectors were considered. Experimental results are shown in table 1. In table 1, "m.e." means matching evaluation that require SAD calculation, avg. # of rows means the number of calculated rows in the SAD calculation before partial distortion elimination. Overhead(in rows) is the sum of all the computations except SAD calculation. "in rows" means that the computations are represented in order of 1 row SAD computations.

It is important to notice that with the MSEA, the efficiency of the procedure depends on the order in which the candidate motion vectors are searched, and that the most promising candidates should be tested first. This eliminates the maximum number of candidates. In our experiment, we used spiral search.

Table 1. The computations of FMSEA

Algorithm	Test seq.	Avg. # of m.e./frame	Avg. # of rows/m.e.	Overhead (in rows)	Total (in rows)	reduction
MSEA (0)	foreman	19,283.6	16.00	8,657.5	317,195	
	trevor	19,497.2	16.00	8,669.7	320,625	
FMSEA (0)	foreman	19,283.6	6.01	8,659.2	124,554	60.7%
	trevor	19,497.2	7.28	8,670.1	150,610	53.0%
MSEA (1)	foreman	4,804.9	16.00	13,463.3	90,342	
	trevor	7,879.3	16.00	13,511.6	139,580	
FMSEA (1)	foreman	4,804.9	9.72	13,461.0	60,165	33.4%
	trevor	7,879.3	10.85	13,510.5	99,001	29.1%
MSEA (2)	foreman	1,800.5	16.00	18,161.0	46,969	
	trevor	4,290.1	16.00	21,288.6	89,930	
FMSEA (2)	foreman	1,800.5	12.71	18,159.3	41,044	12.6%
	trevor	4,290.1	12.29	21,290.9	74,016	17.7%
MSEA (3)	foreman	749.0	16.00	24,975.2	36,959	
	trevor	1,563.4	16.00	38,071.1	63,086	
FMSEA (3)	foreman	749.0	14.63	24,971.4	35,929	2.8%
	trevor	1,563.4	13.70	38,069.7	59,488	5.7%

The FMSEA which incorporates the MSEA with PDE, reduces the computations of MSEA by 60.7%, 53.0% maximally for foreman.qcif, trevor.qcif respectively.

V. Conclusions

A Fast Multilevel Successive Elimination Algorithm based on MSEA has been proposed to reduce the computations of MSEA for motion estimation in video coding. Partial distortion elimination technique used in EMSEA was improved and then the improved PDE technique was applied to MSEA. The FMSEA can find the global optimum solution and outperforms the MSEA and can reduce the computations of block matching calculation of MSEA. FMSEA is a very efficient solution for video coding applications that require both very low bit-rates and good coding quality.

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