

# Low-Power Video Segmentation by Pipeline Processing of Tiled Images

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## 1. Introduction

For object-based video processing such as recognition or tracking, the object-extraction process called *video segmentation* is an indispensable first step. One important field of object-based video processing are battery-based applications (ex. robot vision, intelligent transport systems, or mobile phones with camera). To realize these applications, 3 requirements have to be attained simultaneously, namely *real-time processing* (< 33msec/frame), *compact implementation* (single chip), and *low-power dissipation* (mW order). However, visual data has generally high complexity and contains a multitude of information, so that it's difficult to achieve these requirements with general purpose hardware like FPGAs, microprocessors or digital signal processors. Therefore, special purpose hardware is strongly required. Recently some hardware of video segmentation, based on the difference of frames, were proposed [1, 2, 3]. These approaches are effective for video images of a fixed camera. However it is difficult for mobile applications which use a moving camera, because all background objects are also moving in this case.

Previously, we proposed a digital video segmentation architecture [4, 5] as well as concepts for a compact implementation technique named *subdivided-image approach (SIA)* [6] and a low-power processing technique named *boundary-active-only (BAO)* scheme. Since our region-growing segmentation algorithm is based on connection-weights with neighboring pixel, it works well not only for video signals from fixed cameras but also for video signals from moving cameras. This paper reviews the SIA segmentation algorithm, circuit details for BAO-implementation. BAO-performance evaluation with a full-custom designed CMOS test-chip in 0.35 $\mu$ m technology, including a 41 $\times$ 33 pixel-processing array, is also presented.

## 2. Video Segmentation Architecture with Tiled Images

In the proposed subdivided-image approach (SIA) [6], as shown in Fig. 1, an input video image is divided into a plurality of small-size tiles with an overlapped region of 1 row and 1 column. Each tile is subjected to segmentation using a small-size processing cell-network, and the processing of all tiles is successively performed in order. Finally the results for all tiles are put together to complete the segmentation of the whole image with the information of associated pre-labeled regions.

Figure 2 shows the flowchart of the SIA algorithm and there are 3 main procedures called initialization, segmentation, and label restore. In the initialization procedure, the connection-weights  $W_{ij}$  in a tile image are calculated from the luminance (resp. RGB-data) differences  $|I_i - I_j|$  for gray-scale images (resp. color images). Inclusion of a pixel  $i$  in a given segment is decided by examination of the  $W_{ij}$  with neighboring pixels  $j$ , which are already included in the grown region. Then leader pixels (self-excitable pixels), which are the seeds of the subsequent region-growing process, are determined from calculated connection-weights. Next, if there are already labeled pixels in overlapped pre-labeled region, then segmentation and label restore procedures are executed and otherwise only the segmentation procedure is performed. In segmentation procedure, one of the leader pixels is self-excited and a new region is grown from this leader pixel. The priority of the overlap leader pixels is higher than that of other leader pixels, therefore these pixels are self-excited at first. In each growing step of the region, excitable pixels are determined with a threshold condition for the sum of connection-weights with excited neighbors, and the pixels fulfilling the excitation condition are automatically ex-

cited. The growing steps are repeated as long as excitable pixels exist. When no further excitable pixels are left, the growing process of the respective segment finishes and the excited pixels, constituting the new segment, are labeled and inhibited. The segmentation process is completed when all initially determined leader pixels are inhibited.

If the pre-labeled cells which have different pre-label numbers should become the same region, a label conflict occurs. To avoid this situation, label numbers of pre-labeled overlap regions are always observed in the label restore procedure. This procedure carries out following 2 main processes: (1) If cells with labels identical to excited cell exist, these cells are forced to be excited. The excitation condition on the pre-labeled region must go on, because inclusion operation decided by the weight from excited neighbors. (2) If a growing region connects to the pre-labeled region which has a different label (label conflict), conflicting label numbers are stored in a table. At the end of the region growing, the smallest number of conflict labels is allocated to the grown region and already labeled tiles are relabeled if necessary.

Figure 3 shows the construction of the cell-network, which is the core circuit of our video segmentation architecture. The label restore procedure is applied only to the cells on 1 row and 1 column in the overlapped region. The cell-network consists of cells, which are processing elements and correspond to the pixels, as well as connection-weight registers, which store the connection-weights. Each cell calculates the sum of the connection-weights with excited neighbors and determines its own new state (self-excited, excited, inhibited, labeled) according to a threshold condition. Due to this parallel processing of all cells, the power-dissipation increases in proportion to the number of cells (pixels). To avoid this increase, we propose the boundary-active-only (BAO) concept.

## 3. BAO Concept and Circuit Implementation

The BAO concept, which exploits the characteristics of the region-growing algorithm, is explained with Fig. 4. Due to the stepwise growth of each region, it is sufficient to activate only the cells which have an excitation possibility in the current growth step. Such cells must belong to the boundary of the currently grown region. More specifically, cells with an excitation possibility should not satisfy any of the following three conditions: (1) It is already excited ( $x_{ij}=1$ ). (2) It has already a segment number ( $l_{ij}=I$ ). (3) It is not excited and has no segment number, but there are no neighboring cells excited during the previous clock cycle  $t$ . In particular, condition (3) means that only a part of the complete boundary of the grown segment has an excitation possibility in the normal case (Fig. 4).

We implemented a BAO controller in each network cell, which realizes the BAO concept for reduced power dissipation by examining the above 3 conditions and controls the cell's stand-by mode by a clock-gating signal  $cell\_CLK_{ij}$  (Fig. 5). Since the cell-network has long global clock lines with large capacitances, we additionally restrict clock distribution to potentially active network cells by using a clock controller. The controller distributes the clock signal in the next clock cycle only to rows including cells, which have been excited in the previous clock cycle, and their neighbor rows.

## 4. Test-Chip Design and Performance Measurements

We designed and fabricated a video segmentation test-chip which implements a cell-network with the described BAO architecture in a 0.35 $\mu$ m 2-Poly 3-Metal CMOS technology. Figure 5 shows the die photo of the fabricated chip including a

cell-network for  $41 \times 33$  (1,353) pixels on an area of  $51.1 \text{mm}^2$ . The integration density achieved in the full-custom design is  $26.5 \text{pixel/mm}^2$ . Measured power dissipation for a worst-case input image (only one homogeneous region) is  $94.0 \text{mW}$  at  $10 \text{MHz}$  ( $0.069 \text{mW/pixel}$ ) in the segmentation phase. The worst-case power dissipation of a previously designed  $10 \times 10$  cell-network without BAO, which has a twelve-times smaller cell number, is  $30.9 \text{mW}$  at  $10 \text{MHz}$  ( $0.309 \text{mW/pixel}$ ). Therefore, about 78% power-reduction per pixel have been achieved with the BAO concept. Average power dissipation, estimated with a 7 segment input image, is  $45.8 \text{mW}$ . Estimated segmentation time and Si-area consumption with BAO-architecture for QVGA-size images are  $<250 \mu\text{sec}$  at  $10 \text{MHz}$  and  $<120 \text{mm}^2$  in a  $90 \text{nm}$  CMOS technology, respectively. The characteristic data of the test-chip are summarized in Table I.

## 5. Conclusions

We designed and fabricated a cell-network with  $41 \times 33$  cells in  $0.35 \mu\text{m}$  CMOS technology for low-power video segmentation and experimentally confirmed the effectiveness of the proposed BAO architecture. Compared with our previously pro-

posed segmentation architecture without BAO, about 78% power reduction per cell is achieved at  $10 \text{MHz}$  clock frequency.

Applying additionally the SIA approach, which effects only to the cells in pre-labeled regions of the 1st row and column, VGA-size video-segmentation is expected to become possible with this  $41 \times 33$  cell-network ( $16 \times 15$  tiles). The segmentation performance for VGA size input images is estimated as  $7.49 \text{msec}$  segmentation time at  $10 \text{MHz}$  clock frequency and  $< 94.0 \text{mW}$  power dissipation.

## Acknowledgments

The test-chips in this study have been fabricated in the chip fabrication program of VDEC, the University of Tokyo in the collaboration with Rohm Corporation and Toppan Printing Corporation. Part of this work was supported by a Grant-in-Aid for JSPS Fellows, 1650741, 2004.

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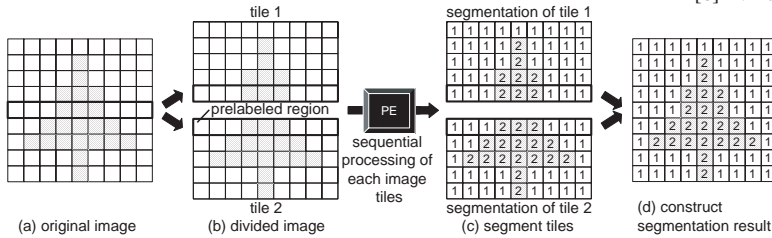


Fig. 1: Processing example of the SIA approach. Pre-labeled regions at the boundary of the tile enable correct segmentation of regions extending over several tiles.

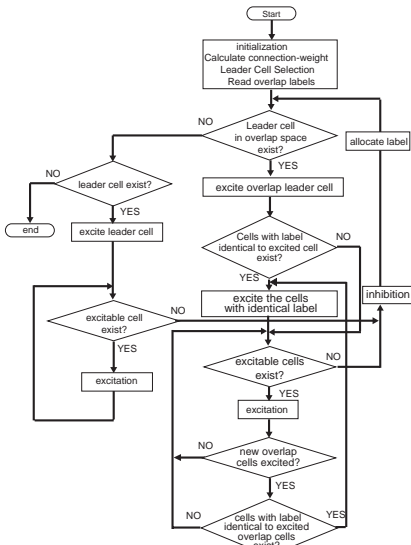


Fig. 2: General flowchart of the SIA algorithm.

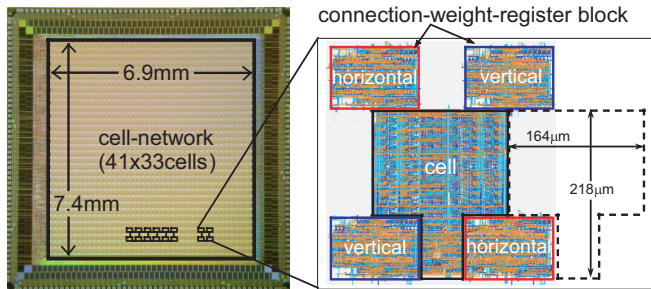


Fig. 6: Die photo of the network with BAO including  $41 \times 33$  cells, designed in a  $0.35 \mu\text{m}$  3-metal CMOS technology. The layout of cell and connection-weight-register blocks is magnified on the right side.

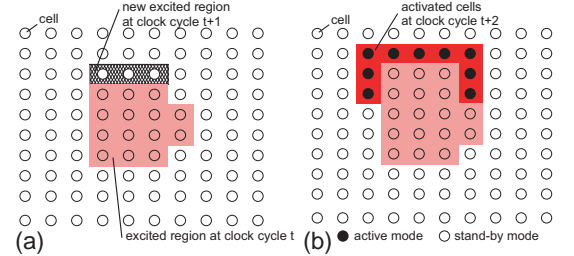


Fig. 4: Conceptual diagram of the proposed boundary-active-only (BAO) scheme. (a) shows the excited and newly excited regions at clock cycle  $t$  and  $t+1$ , respectively. (b) Only cells, which are neighbors of excited cells at  $t+1$ , are activated in clock cycle  $t+2$ .

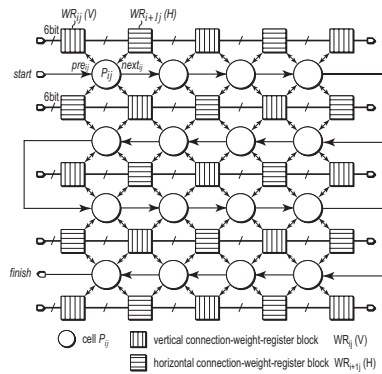


Fig. 3: Block diagram of the cell-network, implemented by alternately laying cells and connection-weight-register blocks.

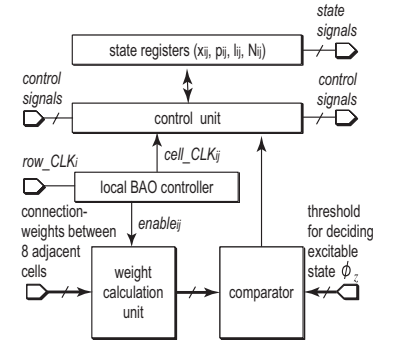


Fig. 5: Block diagram of the cell  $P_{ij}$  with BAO controller.

Table I: Characteristic data of the designed test-chip.

Technology	0.35 $\mu\text{m}$ , 2-Poly 3-Metal CMOS
Cell Architecture	Weight-Parallel (high-speed)[4]
Design Area	6.9mm $\times$ 7.4mm (41 $\times$ 33 cells)
Supply Voltage	3.3V
Max Clock Frequency	10MHz
Segmentation Time (41 $\times$ 33 pixels)	34 $\mu\text{sec}$ @10MHz (Worst Case )
Worst Case Power Dissipation (Measured, 41 $\times$ 33 pixels)	94.0mW@10MHz (Segmentation) 192mW@10MHz (Initialize)
Pixel Density	26.5pixel/mm $^2$



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## Introduction and an Short Overview

### Video Segmentation

Extracting meaningful regions from natural input video pictures (30frame/sec) for higher level image processing applications.

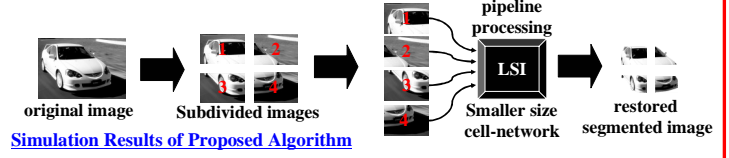
### Features of the Proposed Video Segmentation

- High segmentation quality as good as the conventional architecture<sup>†</sup>
- 78% power reduction per pixel compared with our previously proposed architecture<sup>†</sup> without Boundary-Active-Only concept
- VGA size (640x480pixels) single chip video segmentation
  - Segmentation time < 7.49msec@10MHz,
  - Power dissipation at 10MHz < 94mW@10MHz

### Boundary-Active-Only Scheme for Low Power

- Low-power technique for region-growing segmentation algorithm without sacrificing real-time processing
- Only boundary cells of the currently grown region have to be activated

### Subdivided-Image (SIA) Approach for Compact and Low Power

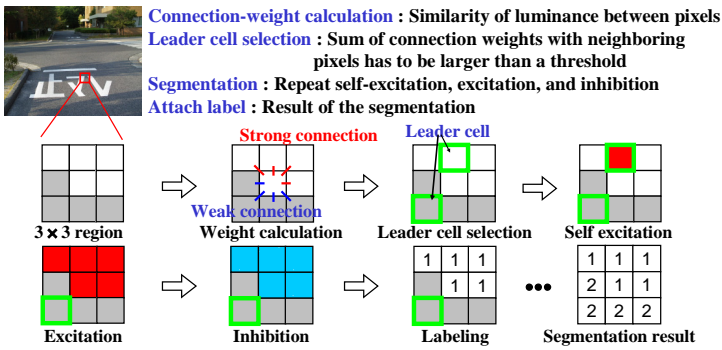


### Simulation Results of Proposed Algorithm

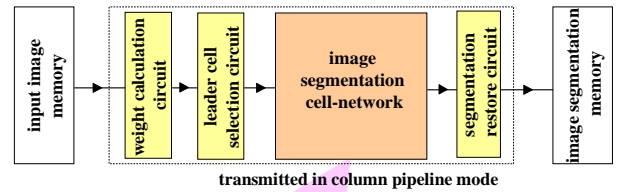
Input image	Segmentation result

Simulation software: MATLAB (image processing toolbox)  
 Input image size: 640 x 480 pixel (VGA size)  
 Pixel number per tile: 41 x 33 pixel (1353 pixel)  
 Tile number: 240 tiles (16 x 15)

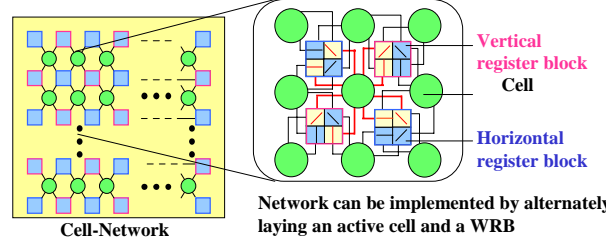
## Video Segmentation Algorithm (Region Growing Approach)



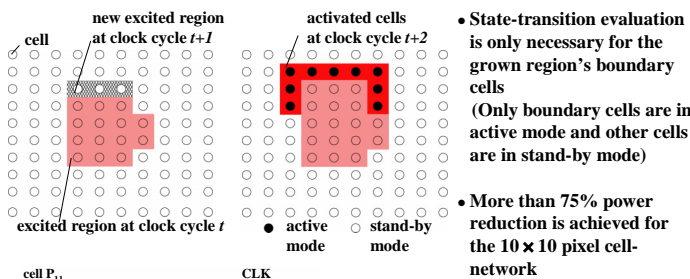
## Realized Architecture



**Cell**: Consists of registers and adders/subtractors  
 Changes its state  $x_k \in \{1,0\}$  depending on  $\sum W_{ik} \times x_k$  of 8 neighbors  
**Weight-register block (WRB)**: Two register-block types (horizontal/vertical)  
 Store the 4 connection-weights between the adjacent active cells  
 Output weights  $W_{ik} \times x_k$  to adjacent active cells



## Boundary-Active-Only Scheme (BAO)



## Subdivided-Image Approach (SIA)

**Image Segmentation for the SIA algorithm**

The labels at overlap region are used in other tile's segmentation  
**Label conflict**  
 Labels 2, 4, 5 are allocated to same region

**Flowchart of tile-segmentation**

**Tile-Segmentation Flow**

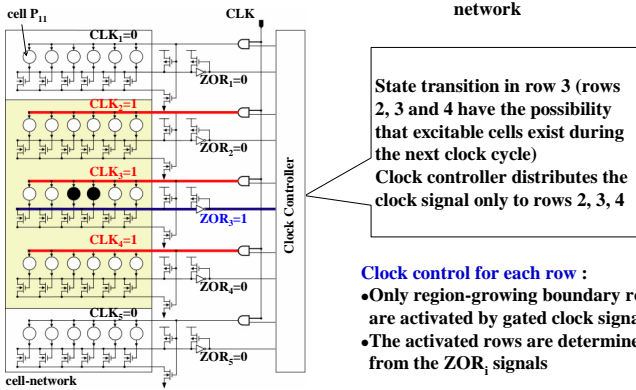
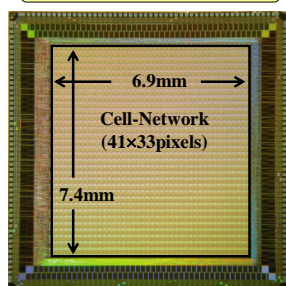


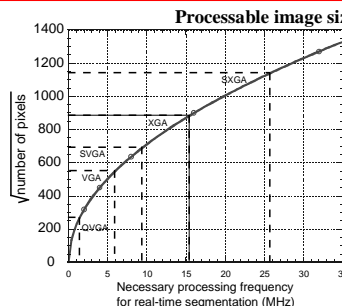
Table: Comparison result between previously proposed architecture<sup>†</sup> and newly proposed BAO architecture † T. Morimoto et al., 1st COE Workshop, 2003.

	without BAO <sup>†</sup>	with BAO	ratio
Number of Transistors	1694/cell	1738/cell	+3% / cell
Processing Time (41 x 33pixels)	34μsec	34μsec	0%
Power Dissipation	0.309mW/cell	0.069mW/cell	-78% / cell

## Implementation Result



Technology	0.35μm 2-Poly 3-Metal CMOS
Measured Max Frequency	10MHz
Power Dissipation (3.3V, segmentation)	45.8mW @ 10MHz (average) 94.0mW @ 10MHz (worst)
Segmentation Time	34μsec @ 10MHz (worst)
Pixel Integration Density	26.5pixel/mm <sup>2</sup>



Estimated image size processable in real-time (< 10msec/frame) as a function of the clock frequency (Estimated with 41 x 33 pixel cell-network)

- VGA size image (640 x 480 pixels) at 6MHz
- SVGA size image (800 x 600 pixels) at 10MHz
- XGA size image (1024 x 768 pixels) at 16MHz