

**Distributed Vision Processing
in Smart Camera Networks**

CVPR-07

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Outline

- I. Introduction
- II. Smart Camera Architectures**
 1. **Wireless Smart Camera**
 2. Smart Camera for Active Vision
- III. Distributed Vision Algorithms
 1. Fusion Mechanisms
 2. Vision Network Algorithms
- IV. Requirements and Case Studies
- V. Outlook

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in Smart Camera Networks

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CHAPTER II:
Smart Camera Architectures

Richard Kleihorst, François Berry

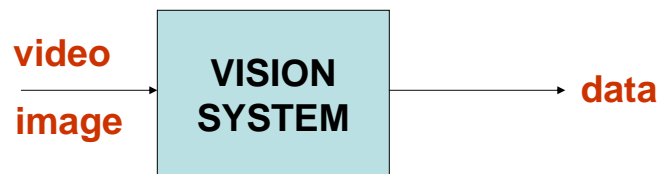
Wireless Camera (WiCa)

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NXP Semiconductor Research

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Vision Systems

- Are systems that analyze images and video
- They report in events/objects/properties
- DVD recorders, set-top boxes, smart cameras



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"Smart Cameras"

- = Camera + intelligence
- = The basis for new applications
 - Such as: detection, tracking, scene analysis



Automotive



Mobile Comm.



Surveillance



Consumer

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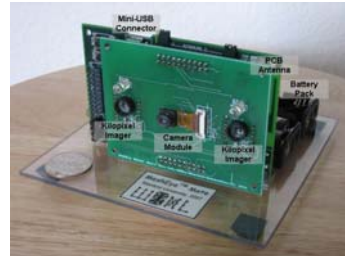
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6

Some Low-Cost Smart Cameras



CMUcam3 (ARM7)
60 MIPS @ 650mW



Stanford MesyEye
Mote (ARM7)

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7

Smart Wireless Camera Platform



WiCa (Xetal SIMD)
50 GOPS @ 600mWatt



Cyclops (AVR RISC)
8 MIPS @ 50mWatt?

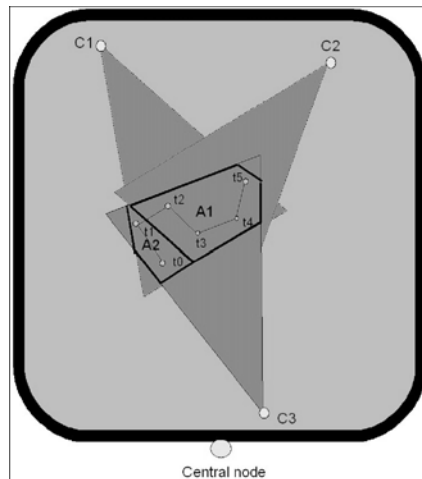
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8

Distributed Vision Systems

- Use **multiple cameras** to analyze the scene
- Less problems with occlusion
- Camera **networks**
- Distributed processing
- Distributed reasoning



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9

Requirements in System Integration

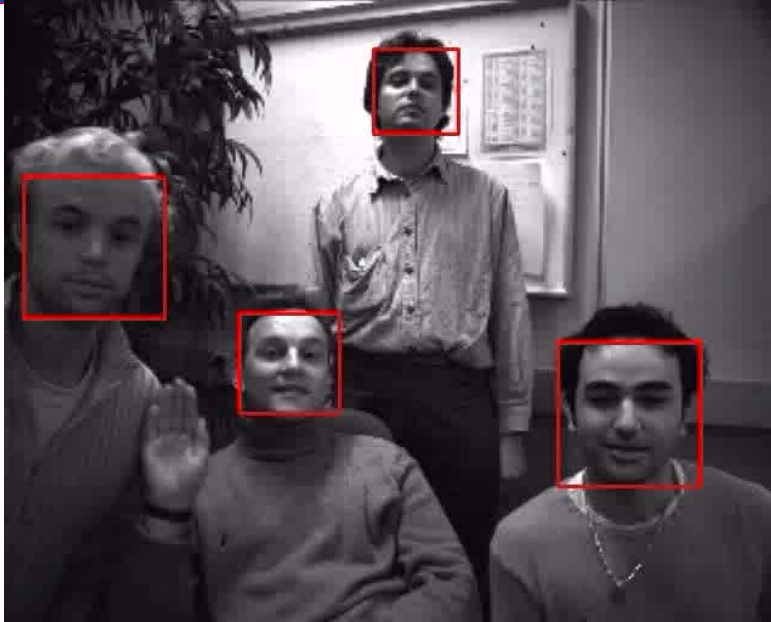
- Performance
- Energy consumption
- Cost
- Architectural features (for active vision)

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10

Example Event Casting: Face Detection



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11

Face Detection Application Mapping



Pixel processing:

Haar filters

for every pixel
similar

SIMD
10++GOPS

Image processing:

Image pyramid

for every image
similar

FPGA/DSP
100MOPS

Application:

Draw box, event

For every event
different

CPU
1MOPS

SIMD → Single Instruction Multiple Data

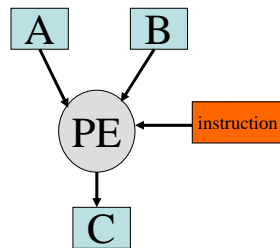
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12

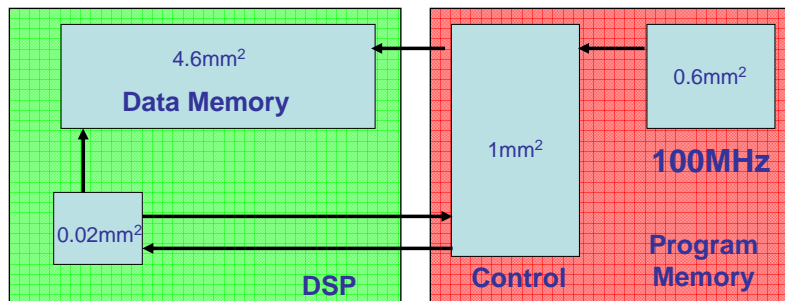
Why SIMD for Low-Level?

- High-performance (need > 10GOPS)
- High internal- bandwidth (need > 500Gb/s)



Bandwidth =
 $10\text{GOPS} * 3 * 16\text{bits}$

Uniprocessor to SIMD: 1 PE



Performance

100MOPS

Size

5.22mm²

Performance/area

19MOPS/mm²

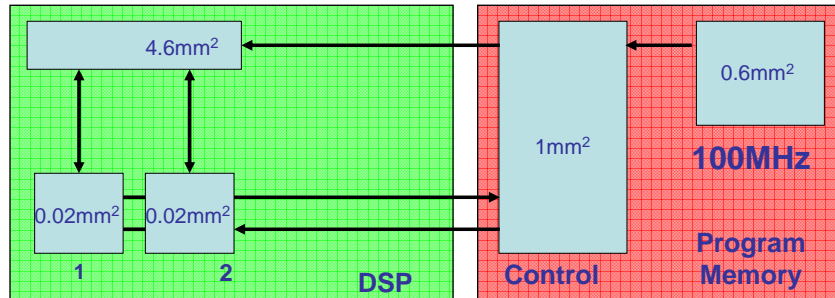
Overhead

26%

Bandwidth

4.8Gb/s

Uniprocessor to SIMD: 2PEs



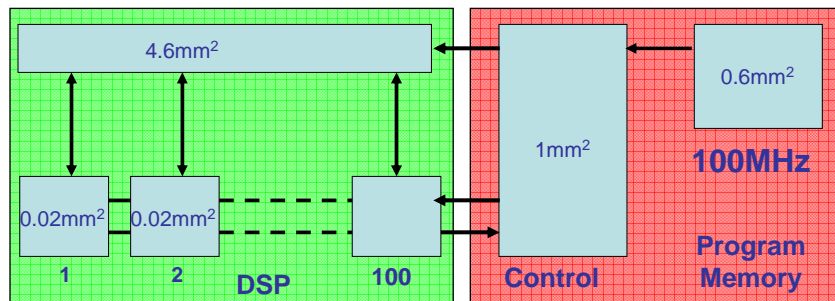
Performance	200MOPS
Size	5.24mm ²
Performance/area	38MOPS/mm ²
Overhead	25%
Bandwidth	9.6Gb/s

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Uniprocessor to SIMD: 100PEs



Performance	10 GOPS
Size	8.2 mm ²
Performance/area	1.2 GOPS/mm ²
Overhead	20%
Bandwidth	480 Gb/sec.

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Uniprocessor to SIMD

	RISC : 1PE 50MHz	Xetal-II SIMD : 320PE@150MHz	Pentium4 2.4GHz
Peak Performance	0.05 GOPS	100 GOPS	6 GOPS
Size	6.4 mm ²	44.4 (0.18u) 11.1 (0.09u) mm ²	131 mm ²
Performance /area 0.18u	0.008 GOPS/mm ²	2.25 GOPS/mm ²	0.045 GOPS/mm ²
Overhead	26%	12%	??%
Bandwidth	2 Gb/S	1.5Tb/S	58 Gb/S
Peak Power Consumption		1.0 Watt	59 Watt

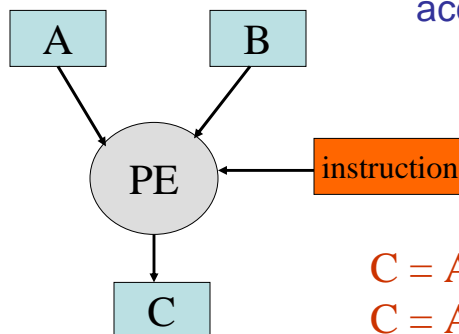
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Why is SIMD Low-Power?

- Typical DSP instructions need 4 accesses to memory



$C = A + B;$
 $C = A > B ? A : B;$

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18

Why is SIMD Low-Power?

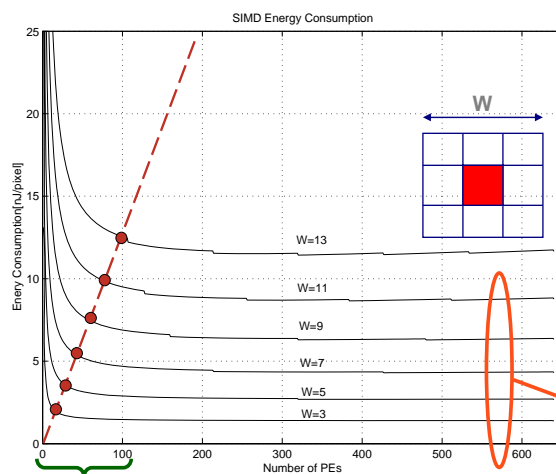
- SIMD has multiple PEs in parallel
- **Arithmetic** always has to be done
- But: **Instruction fetch** is shared multiple times
- Data (A,B,C) access is shared in **multiple-word-wide** memories
- Accessing an **8 times** wider memory takes **half** the amount of energy per data entity

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SIMD Energy Consumption



- Basis: Convolution
 - Computation
 - Communication
 - Memory access

Without voltage scaling,
energy saving levels off

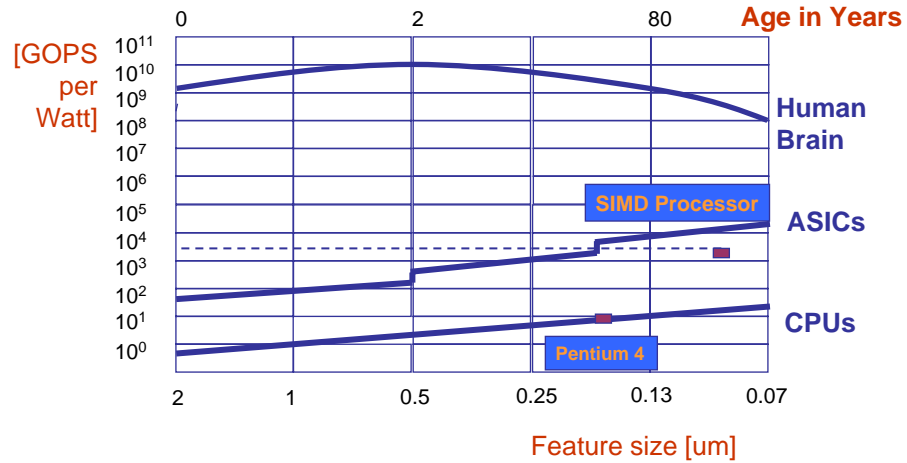
Parallelism → Memory Localization

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20

Computational Efficiency Growth (Moore)

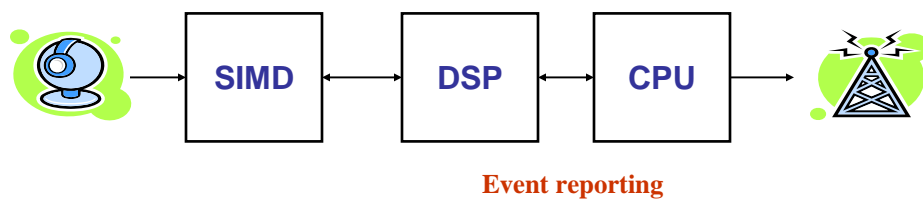


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21

Smart Wireless Camera Architecture

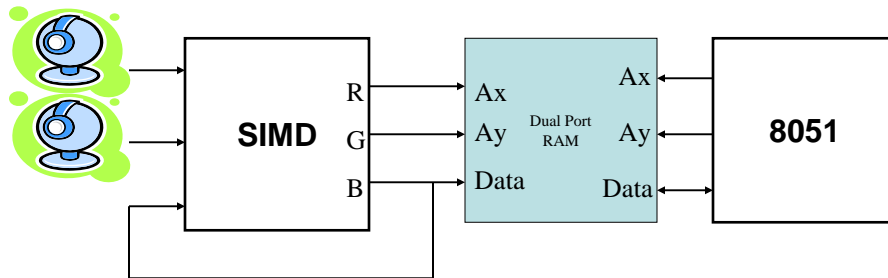


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Connecting The Processors



Feedback loop:

- Frame buffer, working with multiple images
- Look-Up-Table
- Image down-up sizing for pyramid approaches
- Image rescanning for lens-distortion correction

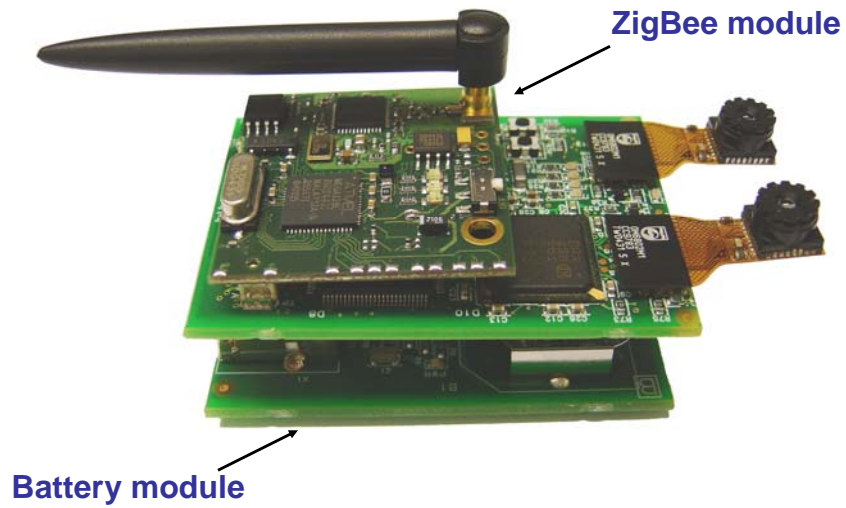
Smart Wireless Camera Platform



“**WiCa**”

- **IC3D/Xetal3** based
- Stereo sensor input
- 50GOPS performance
- Typical 100milli-Watts
- **ZigBee** node
- **Battery** powered
- C++ programmed

Smart Wireless Camera PCB



Ben Schueler, NXP

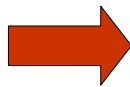
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25

What Have We Mapped to WiCa?

Object recognition applications



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What Have We Mapped to WiCa?

Depth estimation from stereo



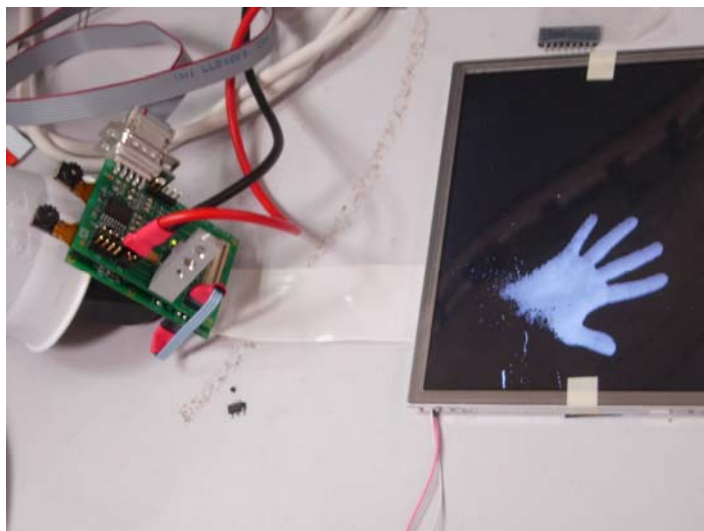
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27

What Have We Mapped to WiCa?

Gesture recognition



Alexander Danilin, NXP

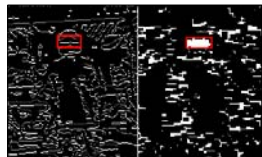
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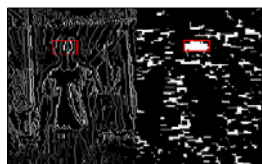
28

What Have We Mapped to WiCa?

Face detection: soft edge features



Horizontal soft edges



Vertical soft edges



Which Algorithms Run Easily on WiCa?

- Where much of the application is running on the SIMD
- Where the DSP/CPU is used for limited or occasional tasks only
- Choose appropriate algorithmic basis for scene analysis
 - For example: “feature based”

Some Power Consumption Results

- | | |
|---------------------------|---------|
| • Object recognition | 25mWatt |
| • Face detection | 40mWatt |
| • Stereo depth estimation | 50mWatt |
| • Gesture recognition | 15mWatt |

Requirements in System Integration

- Performance
- Energy consumption
- Cost
- Architectural features (for active vision)

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