# An Energy-Efficient SIMD Accelerator for Visual Pattern Matching 

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## 1. Motivation

- Object recognition and classification are currently some of the hot topics in computer vision with applications in image matching, robotics and panorama stitching
- When matching large databases against each-other, matching speed is an important performance metric, but power and energy plays a major role in the economy of the entire process.


## 3. Proposed Architecture

Accelerator

System


## 2. Background

 Image matching :- query images
- search images

Purpose: find objects from query images in search images

Step1: Extract local features (keypoints) with an algorithm like SIFT (Scale Invariant Feature Transform)

Step2: Find matching (D1/D2 distance)
keypoints in both the query set and at least one search image

## 4. Case study

Accelerator instance

- 128 Processing Elements
- 16-bit operands
- 32 registers
- 2KB Local Storage


## SAD computation

for(int j = 0; j < 28; j + + ) \{ R30 $=$ R[28] - R[j];
R31 = R30 < R29;
WHERE LT (R30 = R[j] - R[28]; )
REDUCE(R31);

SIMD matching application:

- SSD (Sum of Squared Differences) $=$ L2
- SAD (Sum of Absolute Differences) $=$ L1

$$
L_{p}=\left(\sum_{i=1}^{D}\left|X_{i}-Y_{i}\right|^{p}\right)^{\frac{1}{p}}
$$

## SSD computation

for(int j = 0; j < 28; j + + ) \{
R31 $=\mathrm{R}[28]-\mathrm{R}[\mathrm{j}] ;$
R31 = R31 * R31;
REDUCE(R31);
$\}^{\text {RED }}$

## 6. Conclusions

## 5. Results



Profiling of Execution Time

Energy Consumption per 100 MMatches

| Platform | TDP[W] | SAD energy [J] | SSD energy [J]] |
| :---: | :---: | :---: | :---: |
| Core i7 2600K | 95 | 83.77 | 76.98 |
| NVidia GTX680 | 195 | 24.23 | 24.37 |
| NVidia 8800 Ultra | 175 | - | 286.88 |
| ARM Cortex A9 | 1.25 | 53.41 | 59.24 |
| SIMD accelerator | 1.2 | 13.01 | 8.95 |

SSD and SAD matching

| Platform | ARM Cortex A9 | SIMD Accelerator |
| :---: | :---: | :---: |
| Frequency [MHz] | 667 | 100 |
| SSD Rate [MM/s] | 2.11 | 13.40 |
| SSD Speedup | 1 | 6.35 |
| SAD Rate [MM/s] | 2.34 | 9.22 |
| SAD Speedup | 1 | 3.94 |

- The SIMD accelerator implemented using a Zynq-7000 SOC is able to achieve 4-6x better SIFT descriptor matching throughput than a Cortex A9 processor, despite the FPGA implementation and 100 MHz operating frequency.
- Performance is delivered at about $3 x$ less energy consumption and similar power consumption
- The accelerated system is $40 \%$ more energy effective than Intel Core i7 2600K and Nvidia GTX680 when executing SIFT matching benchmark


## D.C.A.E.

