

# ***Optimization and Acceleration for OpenCV-based Embedded Vision Applications***

Bo Wu, *Ph.D.*

Technical Marketing Manager

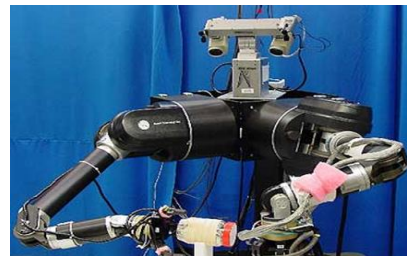
# Agenda

- OpenCV for Embedded Vision Algorithm Development
- Vision Algorithm Optimization on a Processor
- Vision Algorithm Acceleration using ASIPs
- A Case Study: Canny Edge Detection
- Summary

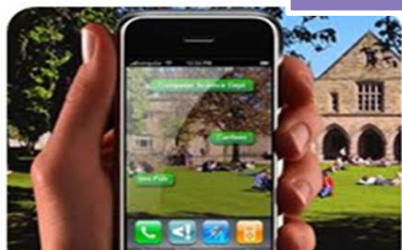
# Vision Processing Goes Embedded



Advanced Driver Assistance  
Systems



Industrial Automation



Augmented reality



Gesture Control



Unmanned Autonomous  
Vehicles

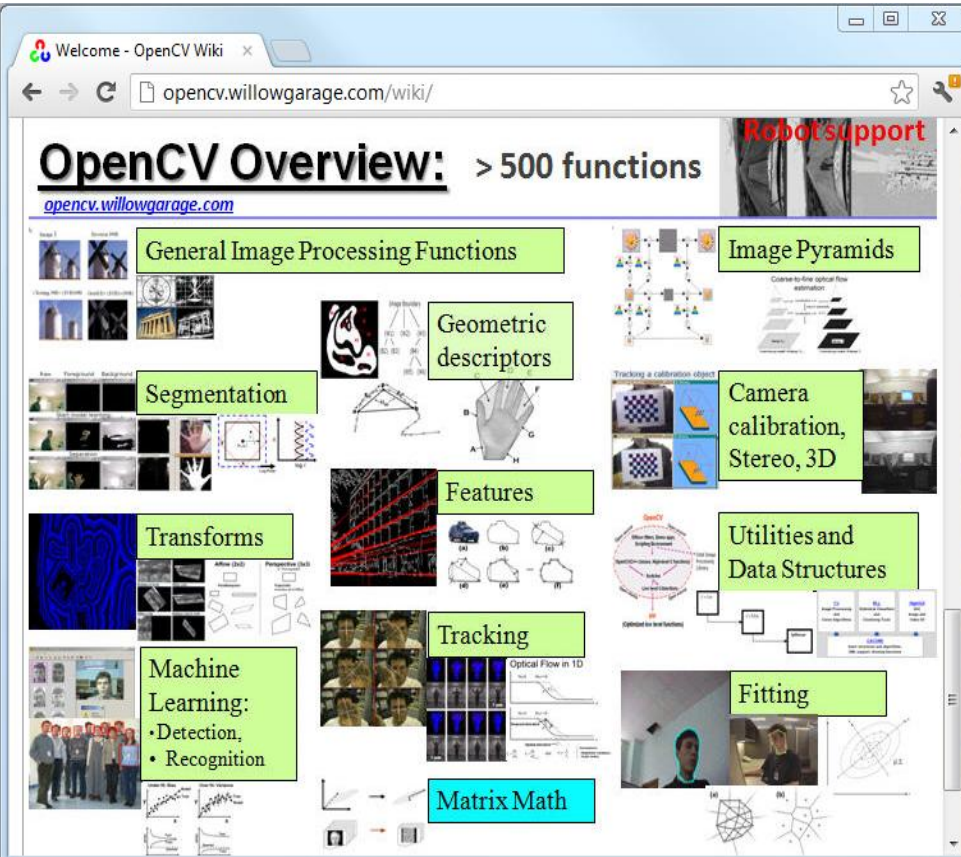
## Requirements

- Sophisticated and Diverse DSP algorithms
- Specialized I/O: cameras, lighting, stereo
- High Performance, Low Power and Programmability!

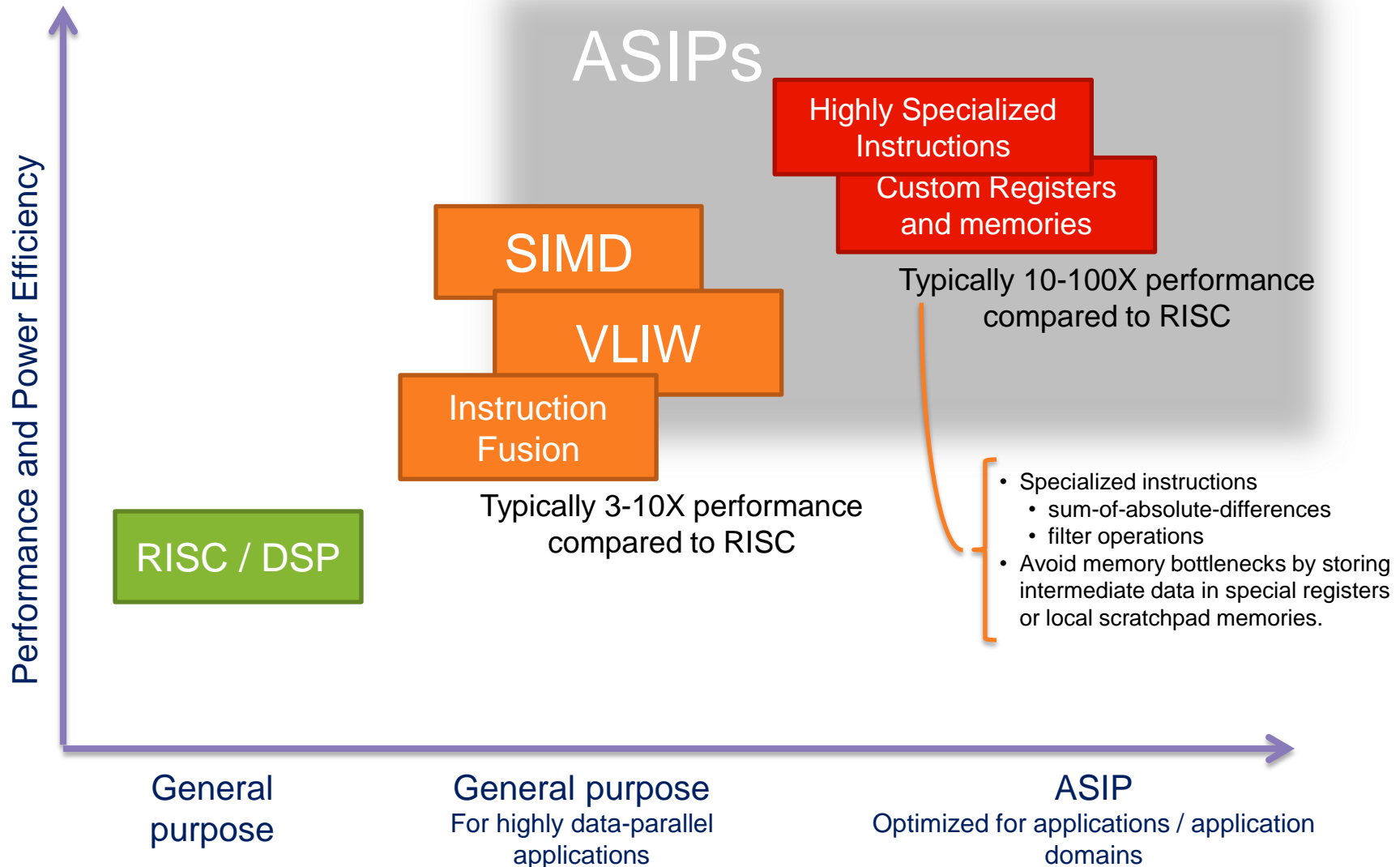
# OpenCV for Vision Algorithms

- Very rich library with >500 algorithms for Computer Vision
- BSD-style open source license
- Used widely for computer vision applications

- Difficult to implement in Embedded Applications
  - Requires C++ compiler
  - Optimized for IA32 + high-end GPU, not for embedded RISC or DSP
  - Requires Floating Point
- Difficult to meet performance and power requirements



# Vision Applications on Processors

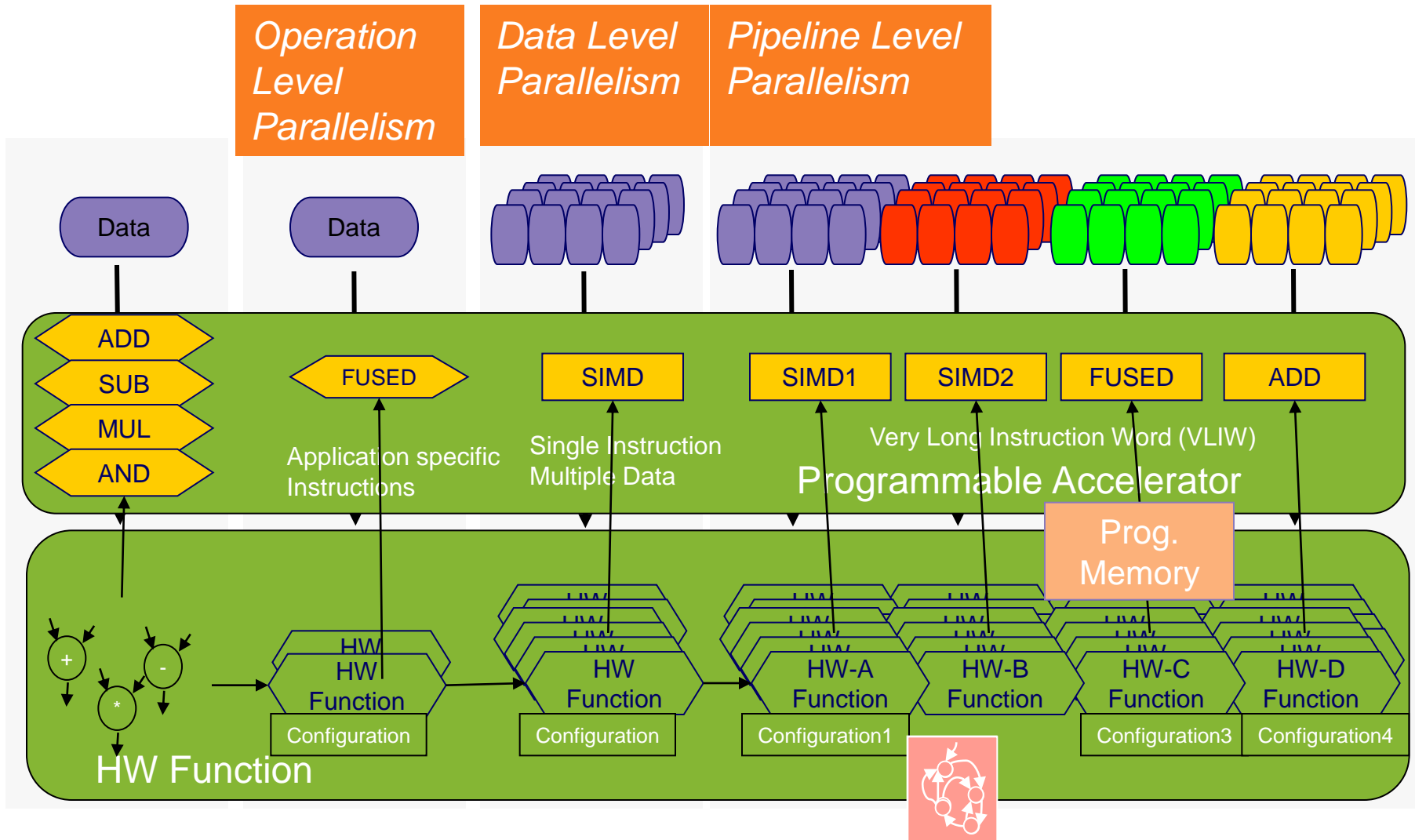


# Vision Algorithm-level Optimizations



- Pick and choose the algorithmic elements to fit the characteristics of a given application
  - Understand the fundamental of algorithms
  - Understand the requirement of the applications
  - Match the algorithms to applications
- Program level optimization, e.g.,
  - Replace 2D separable filter with two 1D filters
  - Adapt floating point operations to fixed point operations
  - Loop unrolling / folding
  - Memory alignment and reduction

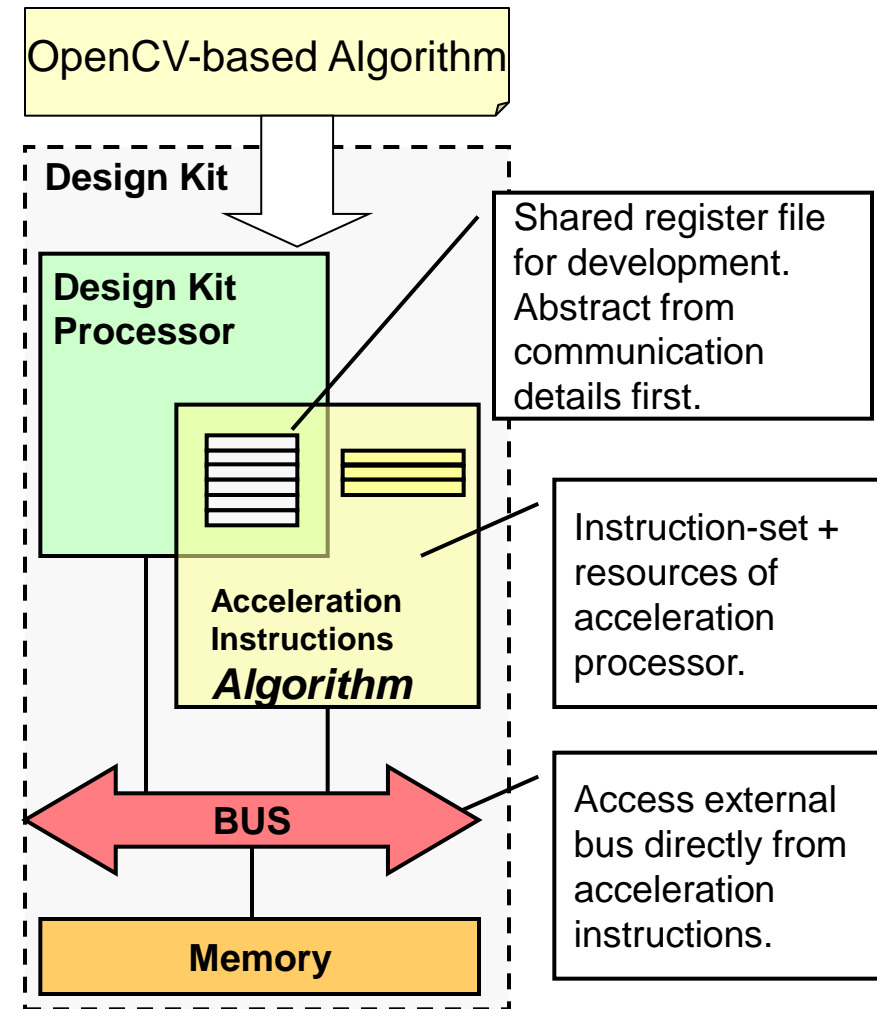
# Vision Acceleration Utilizing Parallelism





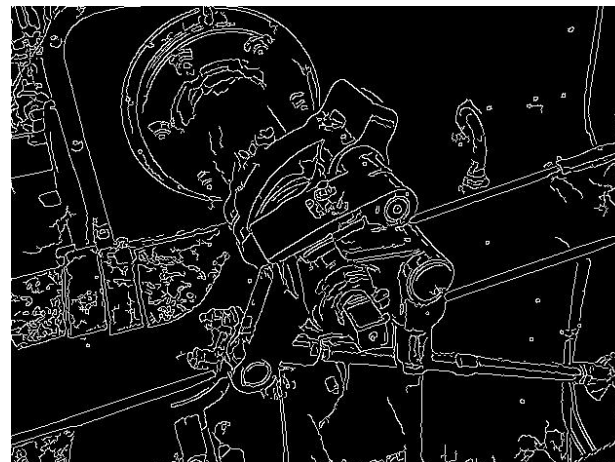
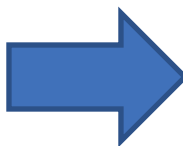
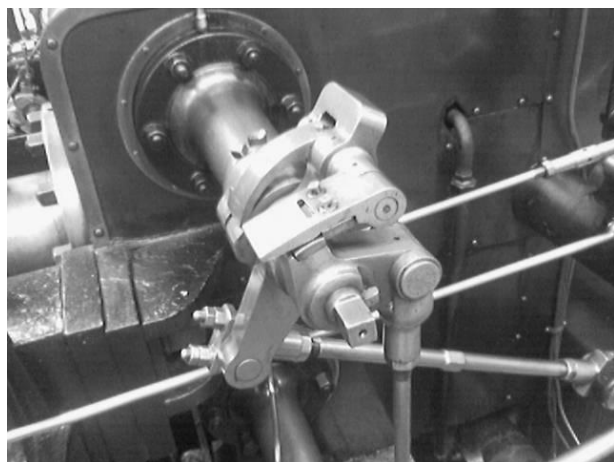
# Vision Acceleration Flow using ASIP

- Compile, run and analyze OpenCV based algorithm on a embedded Processor
- Move time critical code from software into hardware by
  - Add necessary registers or local memories
  - Add acceleration instructions
  - Call new instructions from the software
  - Run and test the modified algorithm



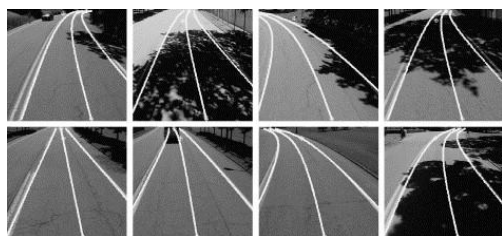


# A Case Study: Canny Edge Detection

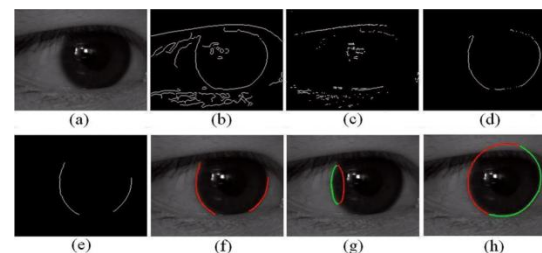


**Canny Edge Detection: Robust Edge Detection in Greyscale Image**

Example Applications in Vision:

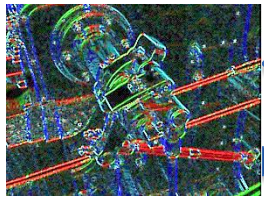
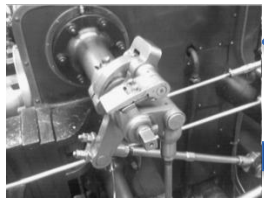
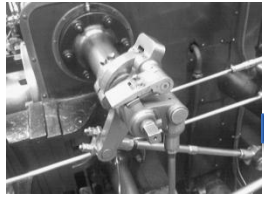


Lane detection



Iris-scan – iris detection

# Canny Edge Detection: the Algorithm



## Gaussian Blur

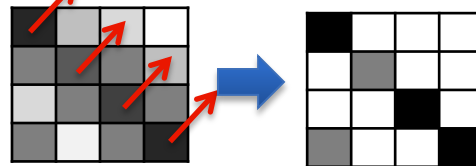
Apply two-dimensional Gauss filter: —  $\begin{bmatrix} & & \\ & & \\ & & \end{bmatrix}$

## Gradient Computation

Apply Sobel Operators:  $\begin{bmatrix} & & \\ & & \\ & & \end{bmatrix}$  and  $\begin{bmatrix} & & \\ & & \\ & & \end{bmatrix}$   
and compute magnitude and sector:



## Non-maximum Suppression

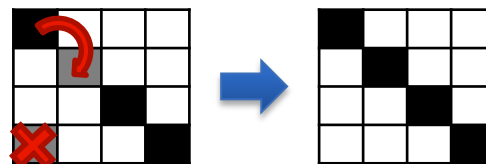




Only retain pixels with highest gradient.

Mark: - “Maybe is edge” 

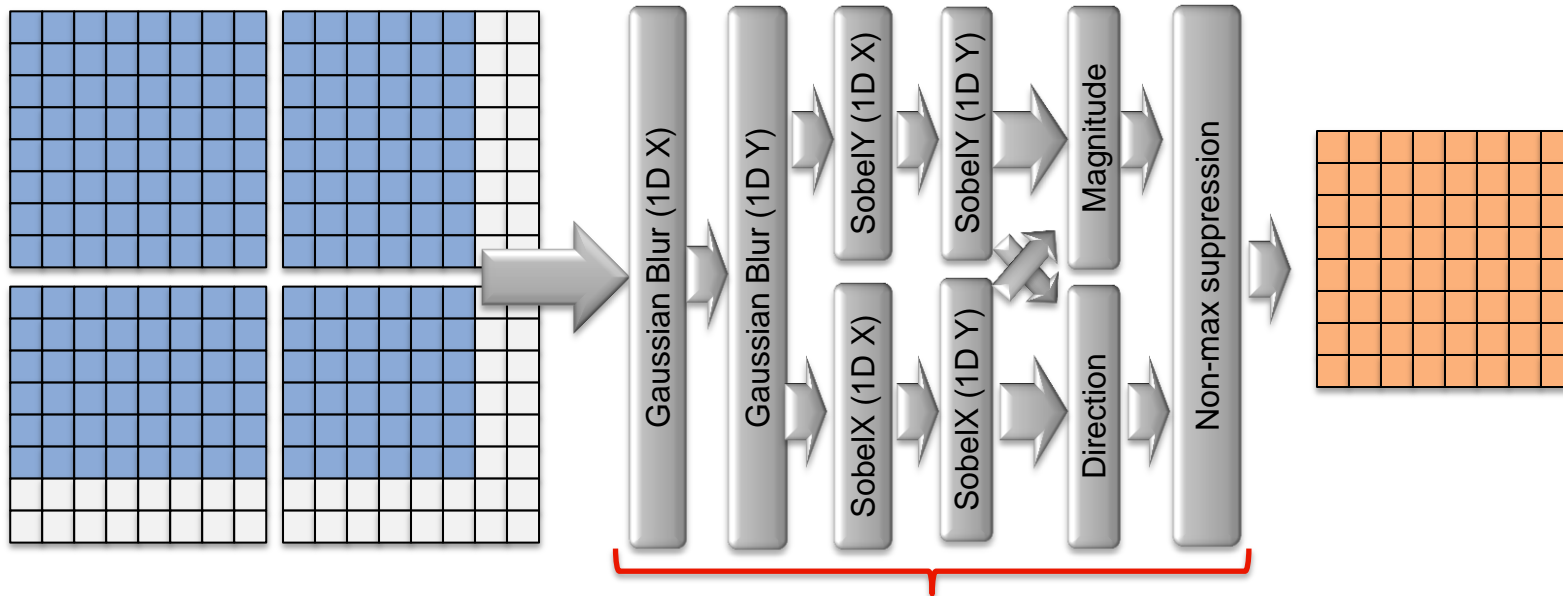
- “Certainly is edge” 

## Thresholding



Trace along the -pixels  
starting from -pixels

# ASIP: Pipelined Execution of Canny Edge Detection



One **Canny** Instruction activates 9 operations in 6 stages.

Assembly code for the ASIP:

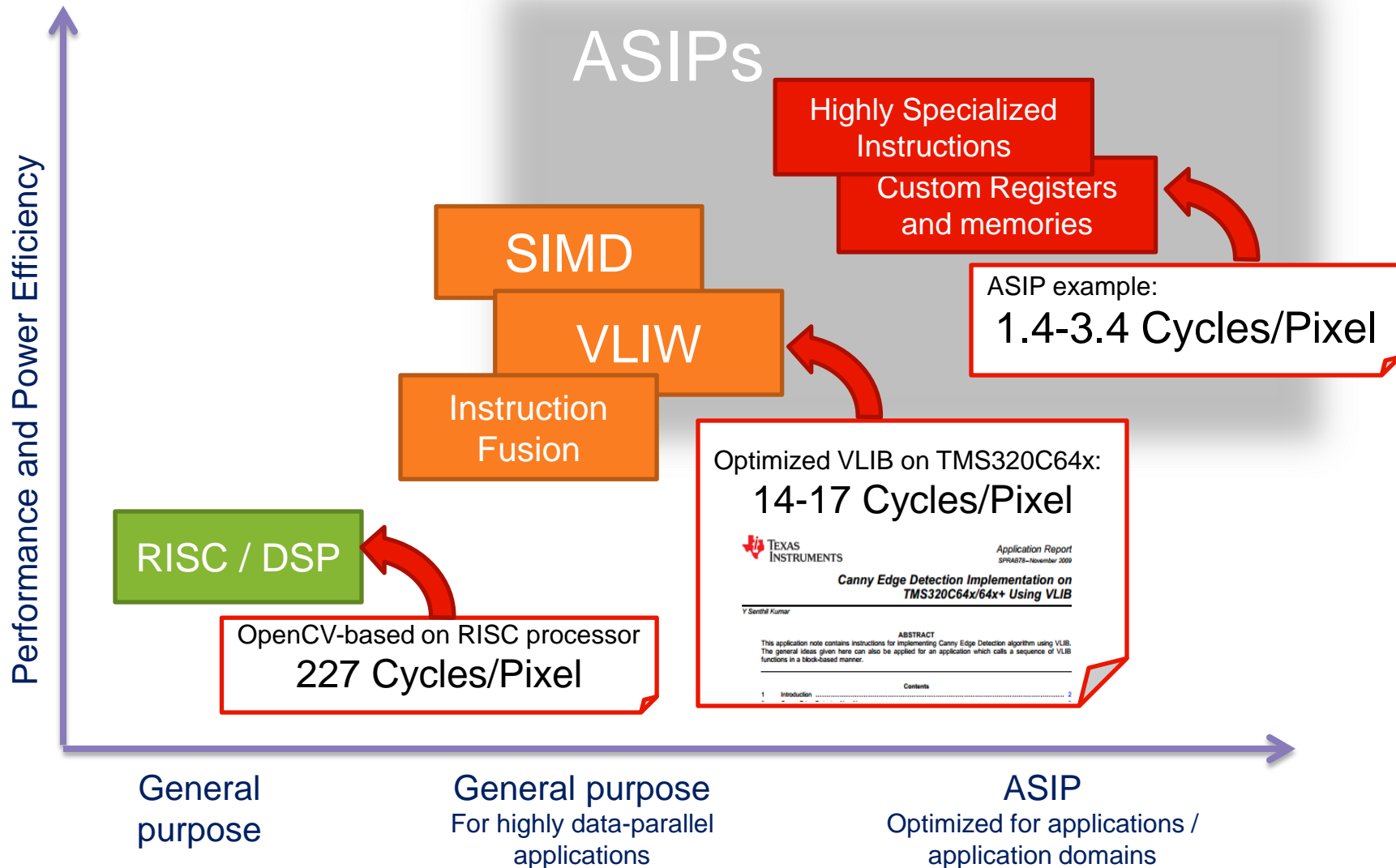
```
loadPixels8 p0, [r1], r3
loadPixels8 p1, [r1,8], r3
loadPixels6 p4, [r2], r3
loadPixels6 p5, [r2,8], r3
```

Load 8-lines of pixel data at address r1 with stride r3 in p0  
Load 8-lines of pixel data at address r1 + 8 with stride r3 in p1  
Load 2-lines of pixel data at address r2 with stride r3 in p4  
Load 2-lines of pixel data at address r2 + 9 with stride r3 in p4

```
CannyNonMax p3, ( p0, p1, p4, p5 )
```

Performs all on 16x16 image in p0,p1,p4,p5 and store in p3

# Results for Canny Edge Detection



# Summary

- OpenCV library is a good starting point for embedded vision algorithm development
- Further optimization and acceleration are required for implementation of the vision algorithm on an embedded processor
- Application specific instruction-set processors (ASIPs) can achieve the balance between performance, complexity, and power
- Structured Design Methodology and Tools for ASIPs simplify the design effort