



# Biologically Inspired CMOS Vision Sensors

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# Overview

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- **Why biologically inspired sensors?**
- **Biological visual system**
  - Computational strategies, Neural circuits
- Neuromorphic **Vision Sensors:**
  - Sensor for the detection of **image features (spatial)**
  - **Tracking sensor (spatio-temporal)**
- **Conclusions**

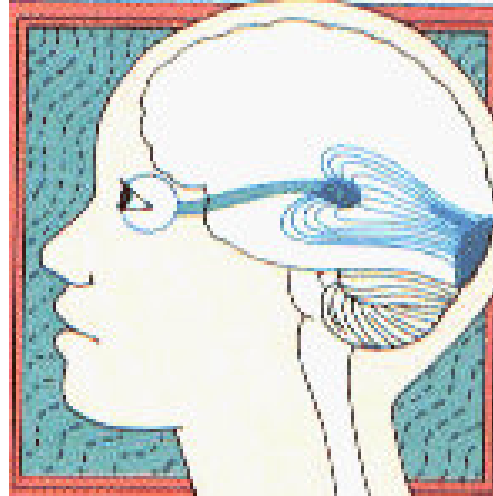
# A picture is worth a thousand words



1011110010100101011101001110100101000001111010101  
1010100010101100010001111010110001110100110  
101010110100111001101011000101010101010110110  
1101101001111010101000111010101101010111001101000101  
1101001011101101010111010111010000111110101011110110100

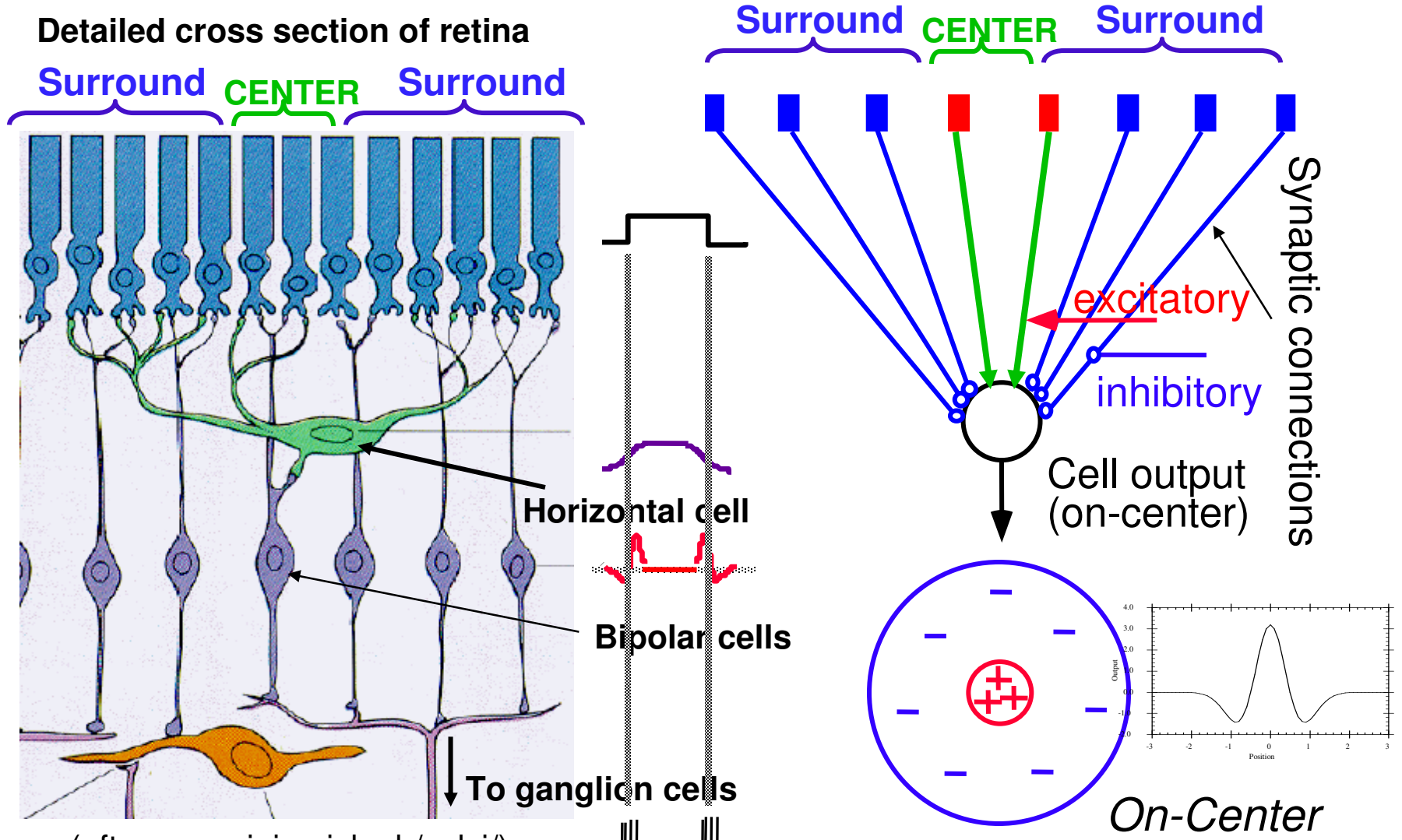
# Biological Vision System

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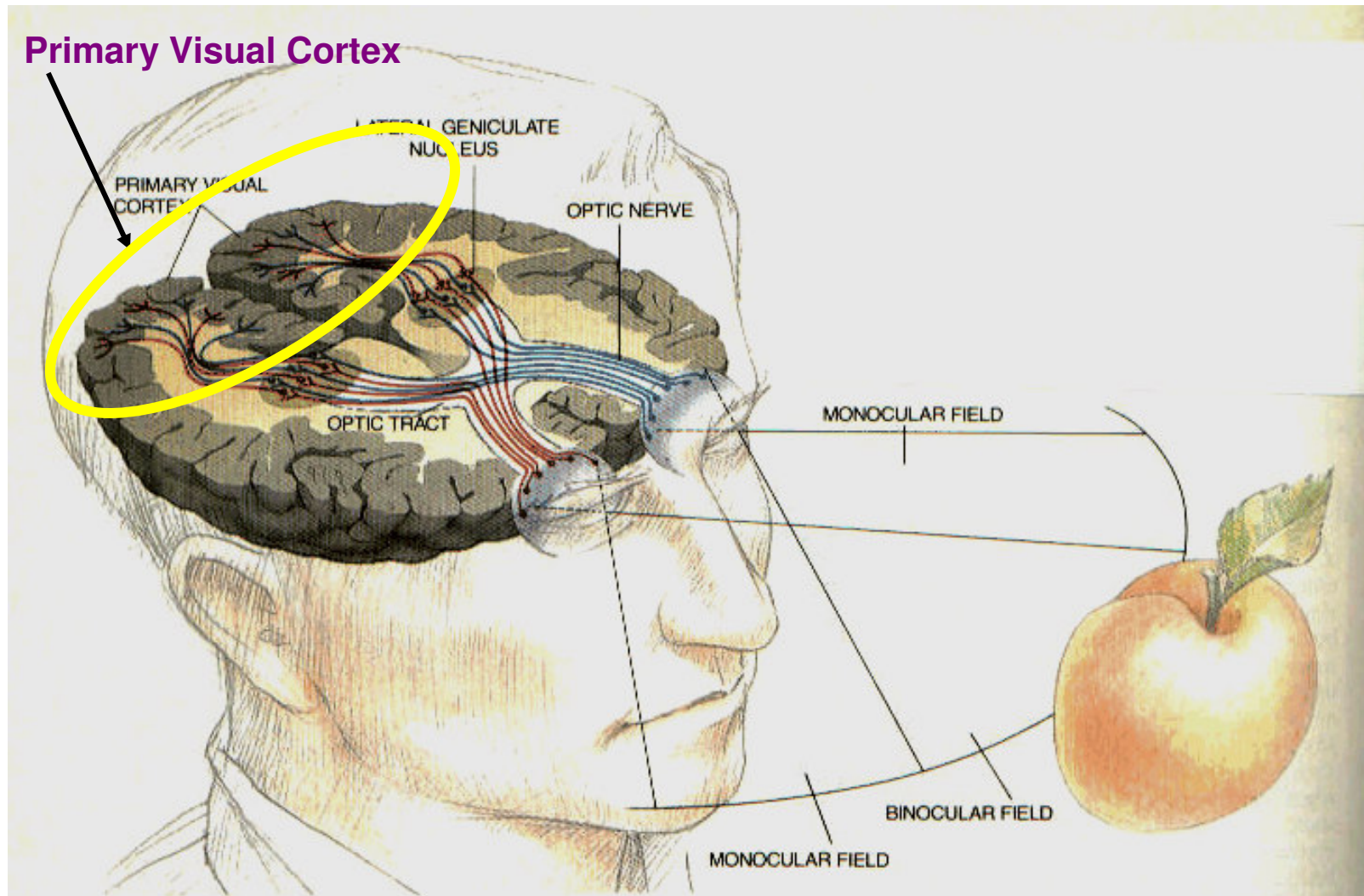
**Retina**  
**Receptive Fields**  
**Visual Cortex**

# Retina - Center surround receptive field



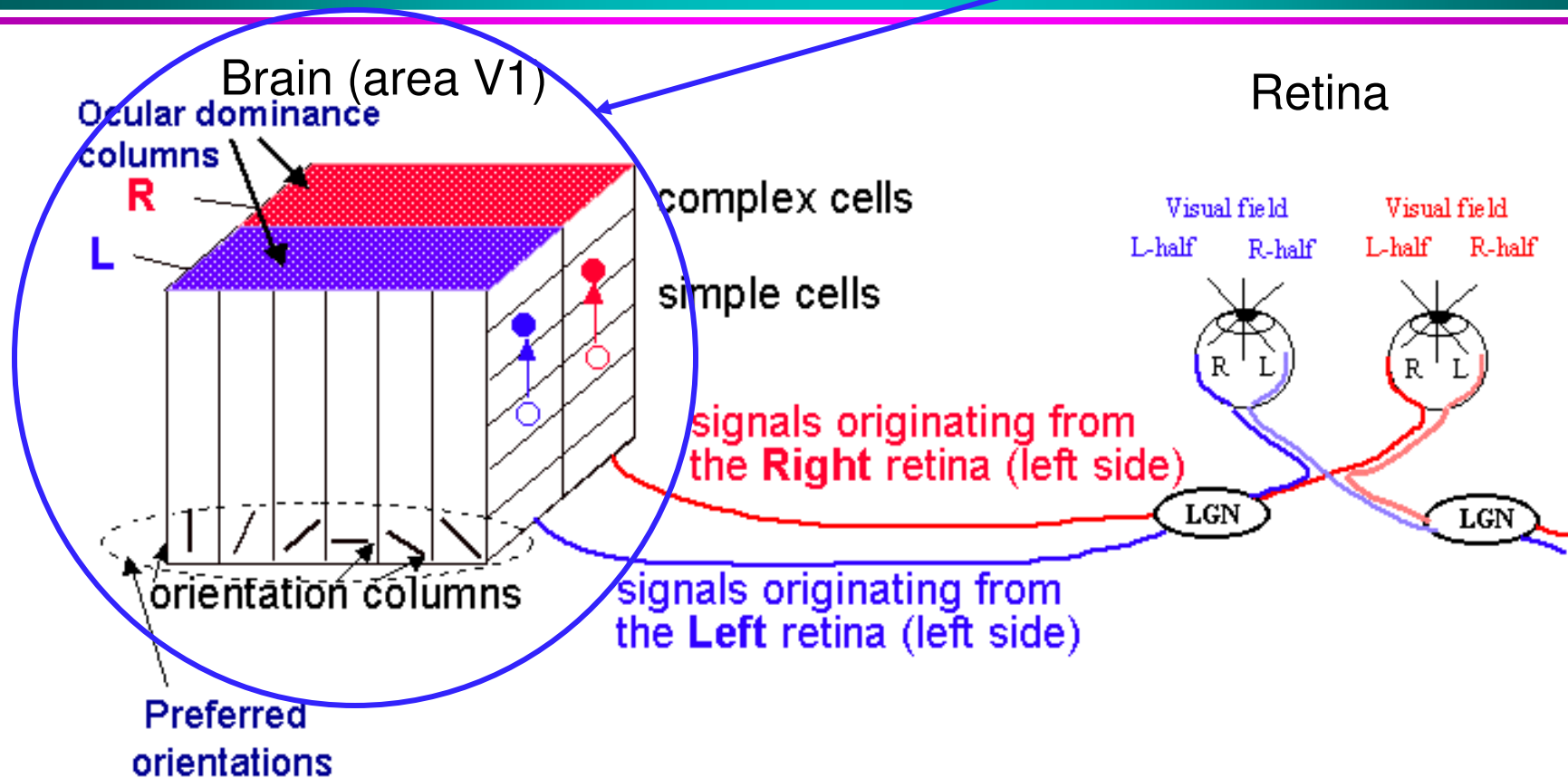
(after: [www.ini.unizh.ch/avlsi/](http://www.ini.unizh.ch/avlsi/))  
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# Processing in the Visual Cortex



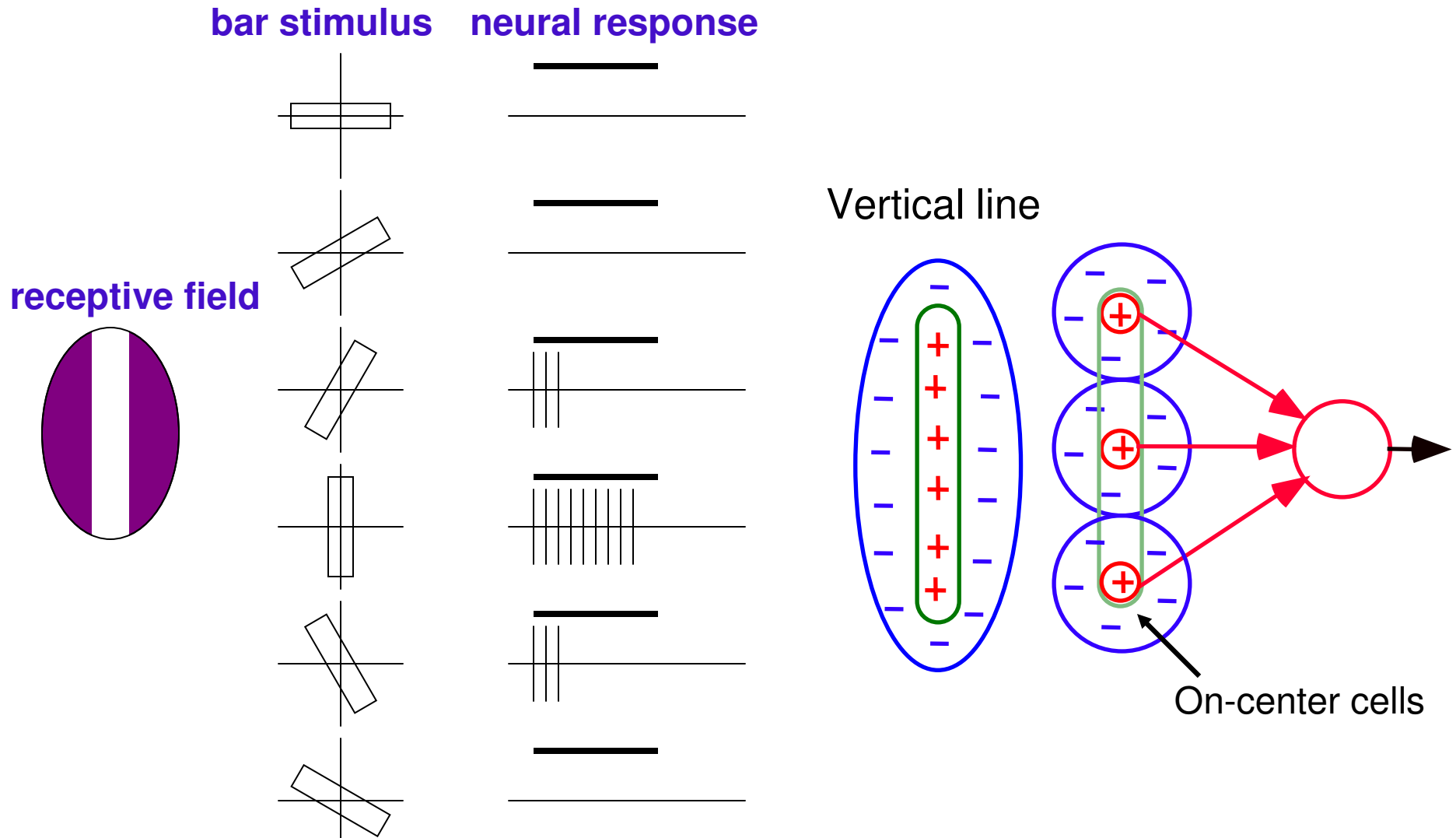
(Scientific American)

# Processing in the Visual Cortex



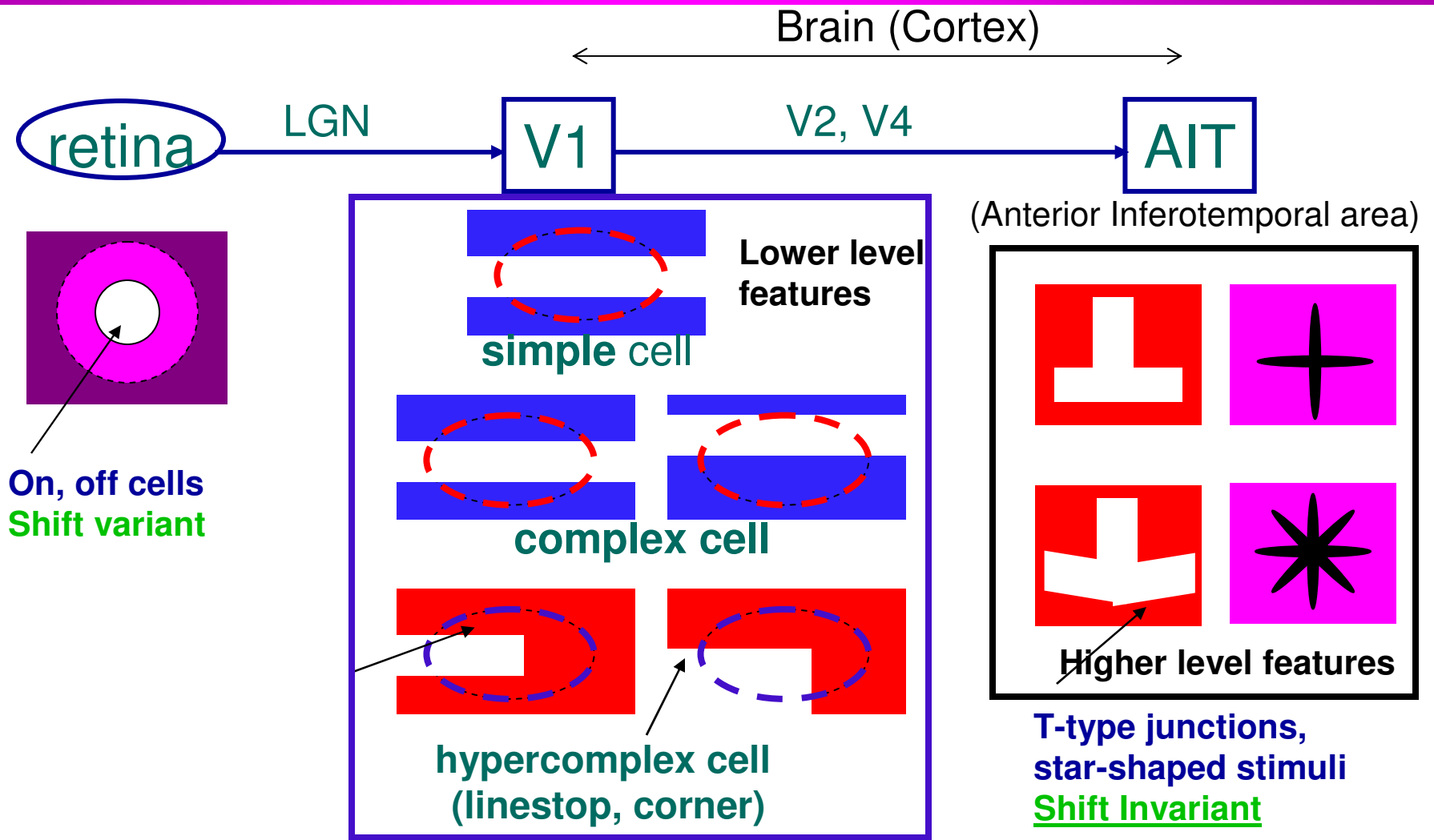
- Cortical area V1: hypercolumn structure
  - Orientation, edge, line stops, etc detectors

# Orientation selectivity of a simple cell





# Information flow from retina to brain



Increased complexity of the stimuli for Cell excitation

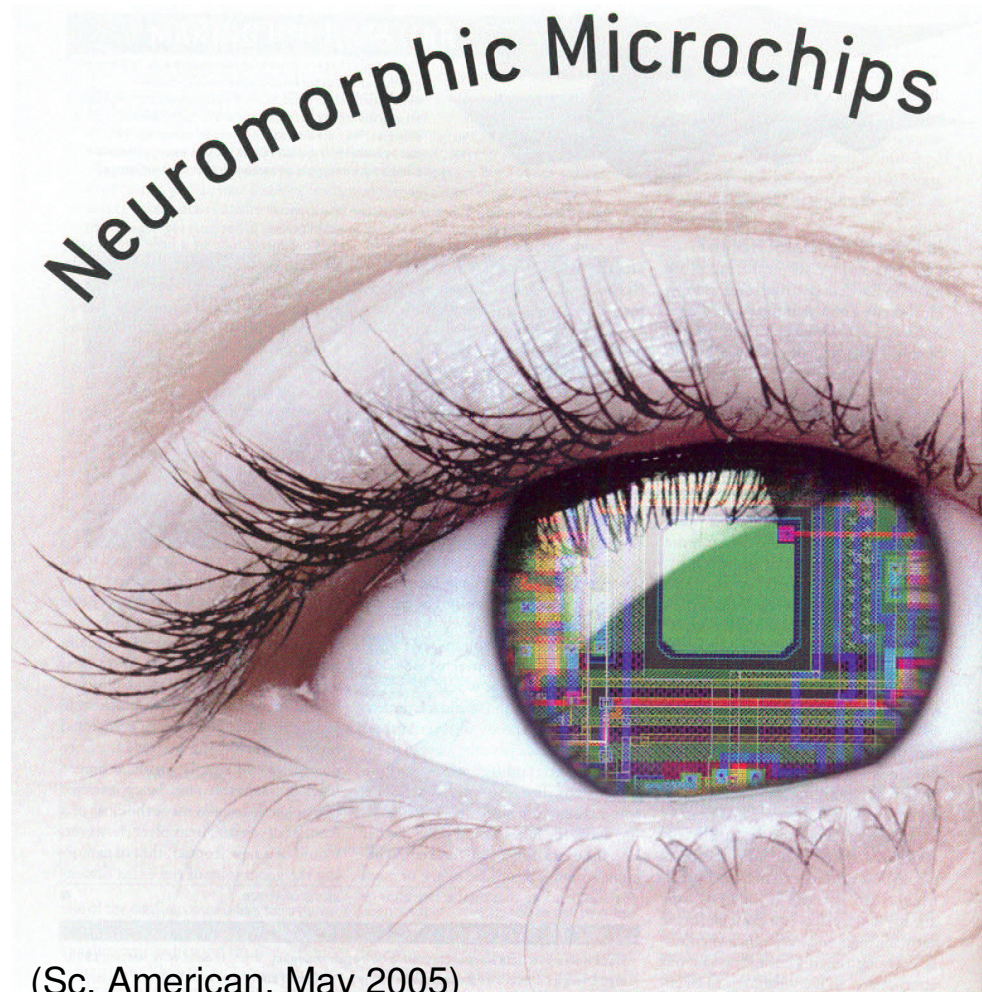
# In summary: the biological system...

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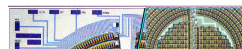
- **Decomposes** a picture in many **features**: edges, orientation, line stops, junctions, onset (in time) etc.
- The **features are integrated at higher level** into a more conceptual representation.
- **Highly structured**, parallel and hierarchical.
- Distributed architecture leads to:
  - Data reduction; fast processing (parallelism), robustness

# Neuromorphic Vision Sensors

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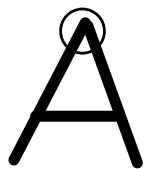
Confluence of electronics and biology



# Example 1

## Vision Sensor for the Detection of Image Features

Line orientations, line stops  
Edges, corners, intersections:



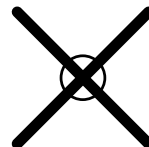
(a)

**Corner**



(b)

**T-type**



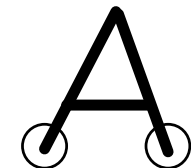
(c)

**X-type**



(d)

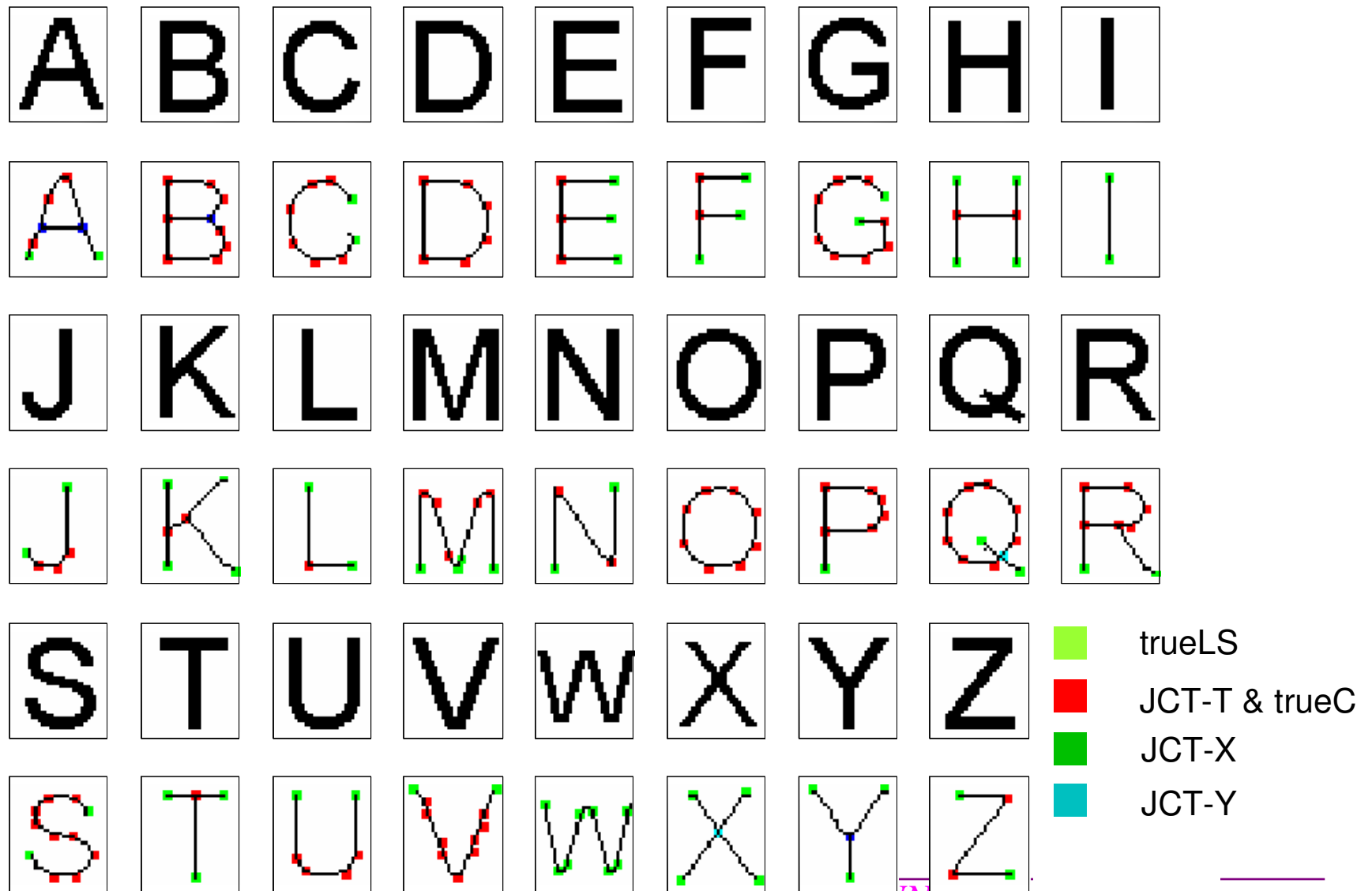
**Y-type**



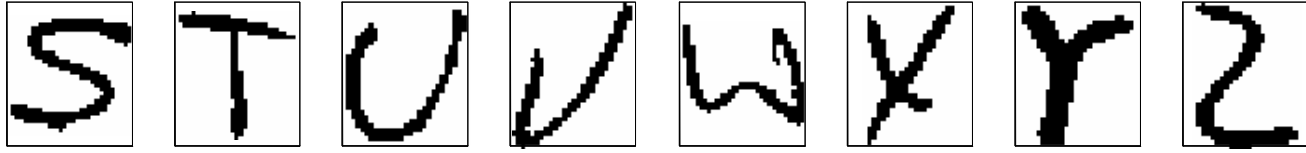
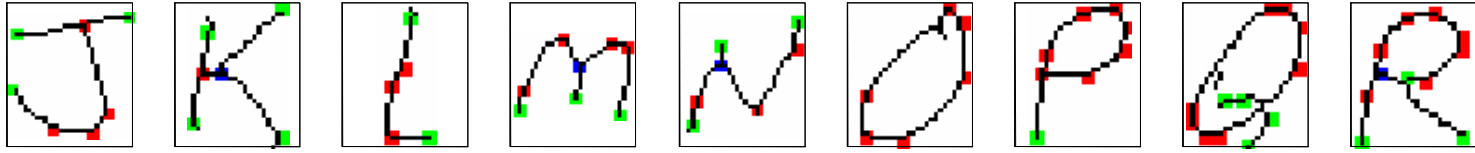
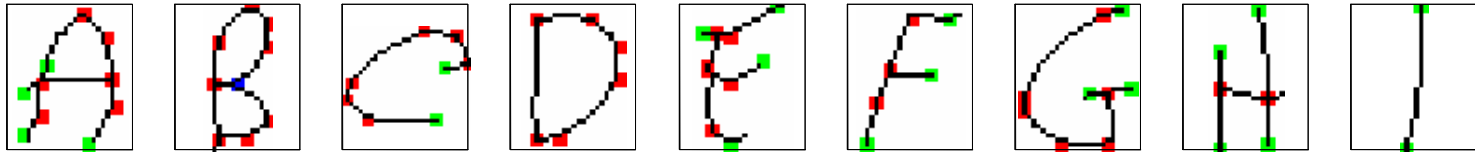
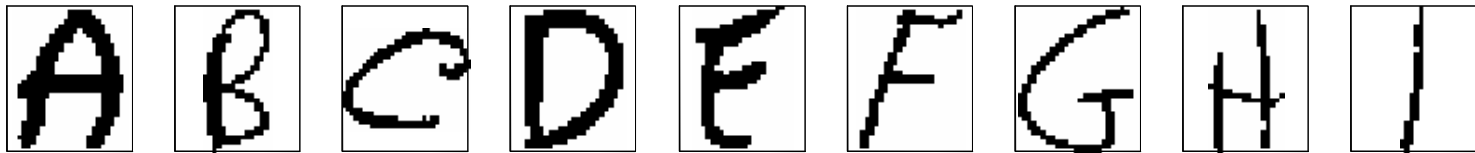
(e)

**Line stops**

# Detected features for printed characters



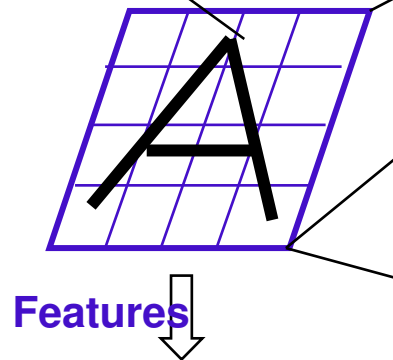
# Detected features for handwritten characters



- trueLS
- JCT-T & trueC
- JCT-X
- JCT-Y
- JCT-Y

# Retinal orientation sensor

Smart pixel array:  
Receptors & feature detector



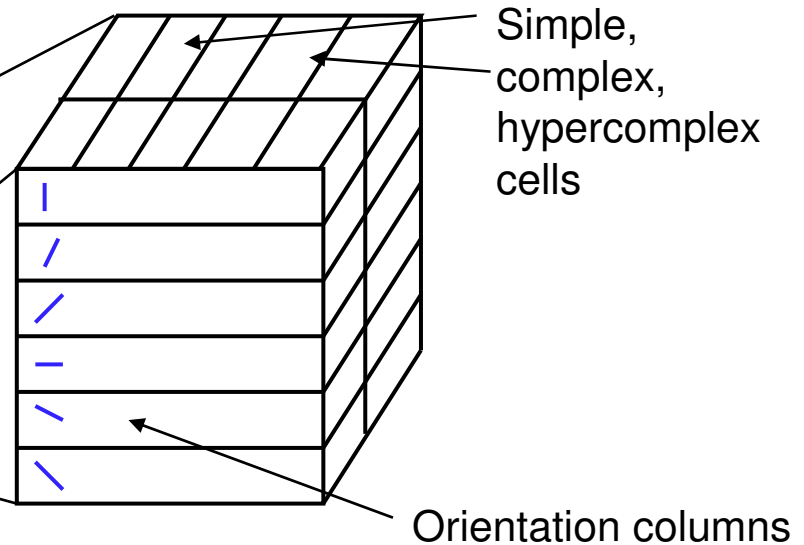
**Recognition layer**

Proposed approach:

- Template matching
- Programmable templates are executed in sequence

Trade-off between speed and area to reduce the number of processing elements.

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Biological approach for feature detection:

- Multiple receptive fields
- Massively parallel execution
- Requires many processing element (cells)

# Implementation considerations

## Template matching (or convolution)

$$x_{ij}(n+1) = f\left(\sum_{l=-1}^1 \sum_{m=-1}^1 x_{i+l,j+m}(n) r_{lm}, I\right)$$

$$= f\left(\sum_{l=-1}^1 \sum_{m=-1}^1 x_{i-l,j-m}(n) k_{lm}, I\right)$$

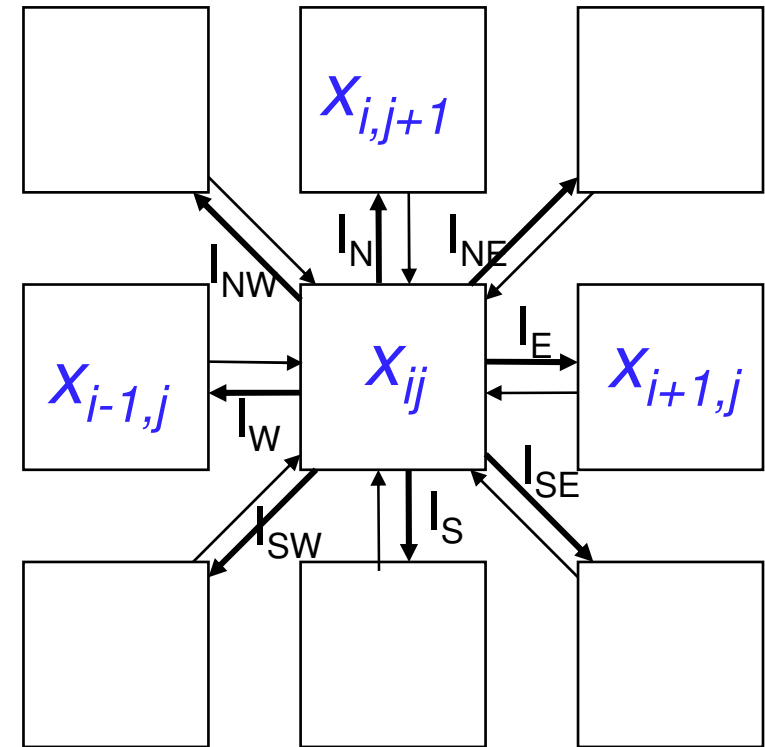
$$f(x;I) = 1 \text{ if } x \geq I \\ = 0 \text{ if } x < I$$

$I$ : Threshold

Template:

$$K = \begin{pmatrix} r_{11} & r_{10} & r_{1-1} \\ r_{01} & r_{00} & r_{0-1} \\ r_{-11} & r_{-10} & r_{-1-1} \end{pmatrix}$$

$$r_{ij} = 1, -1, 0$$

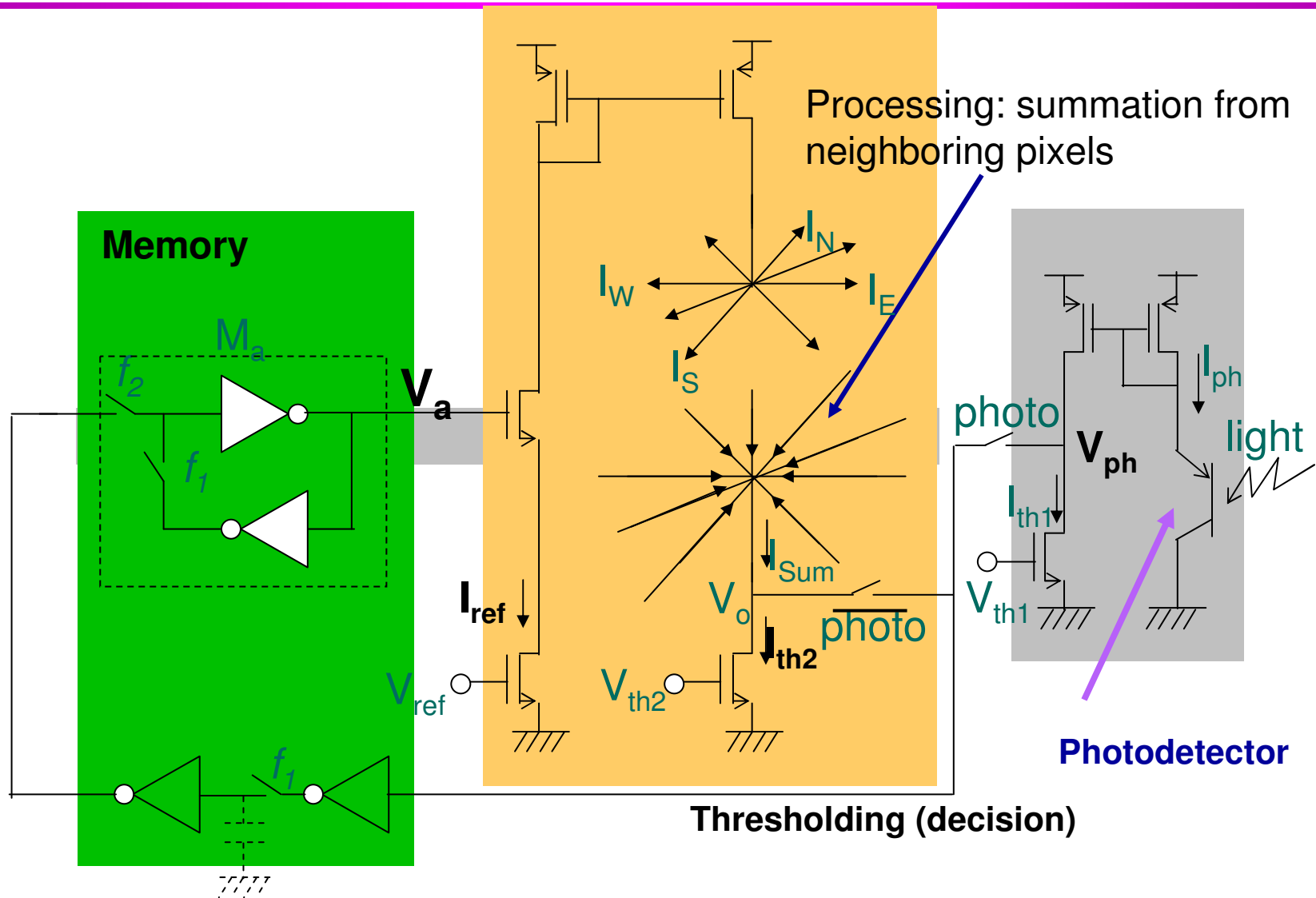


can be naturally mapped onto hardware by current distribution

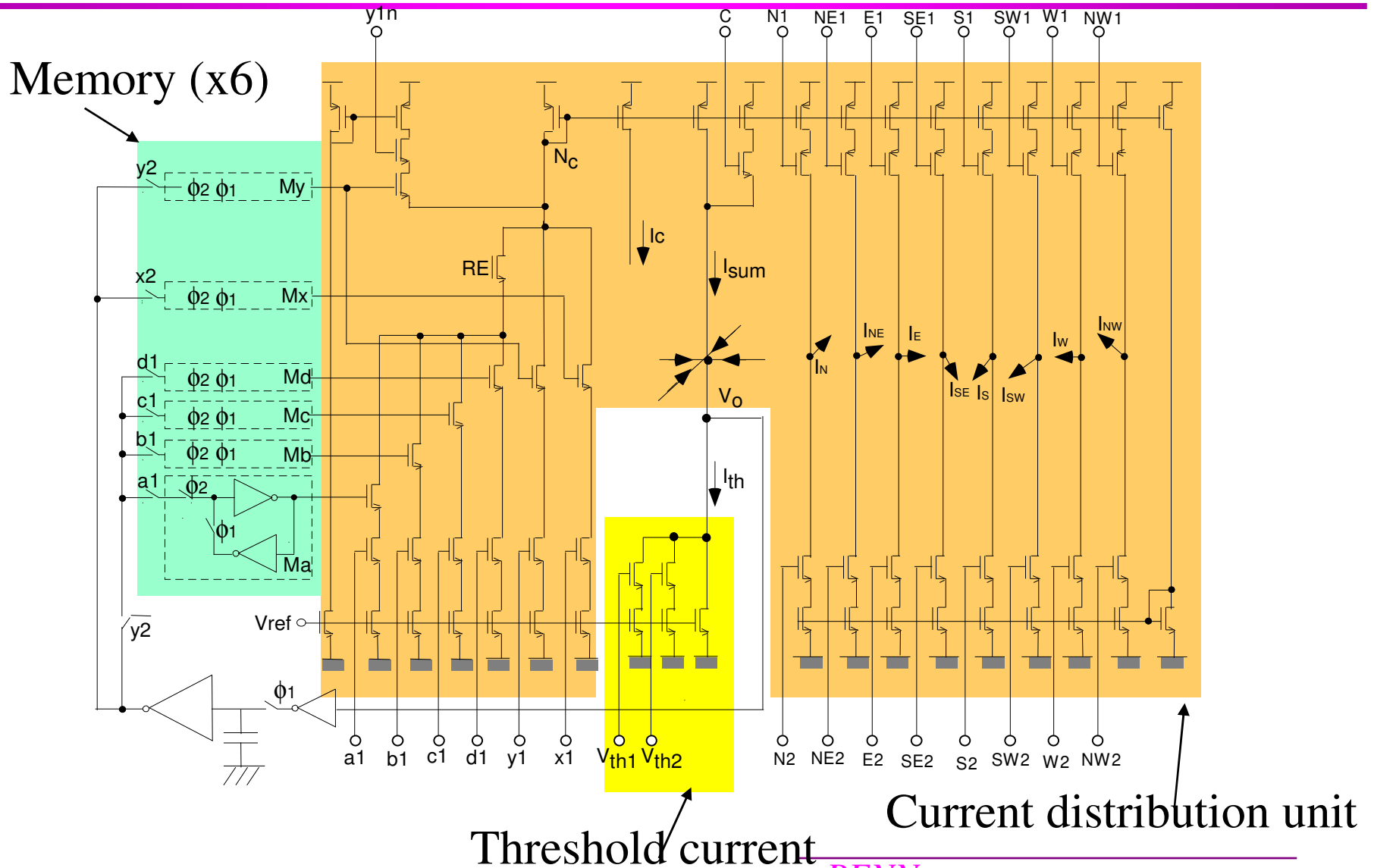
Template is made programmable to detect a variety of features and perform a set of operation



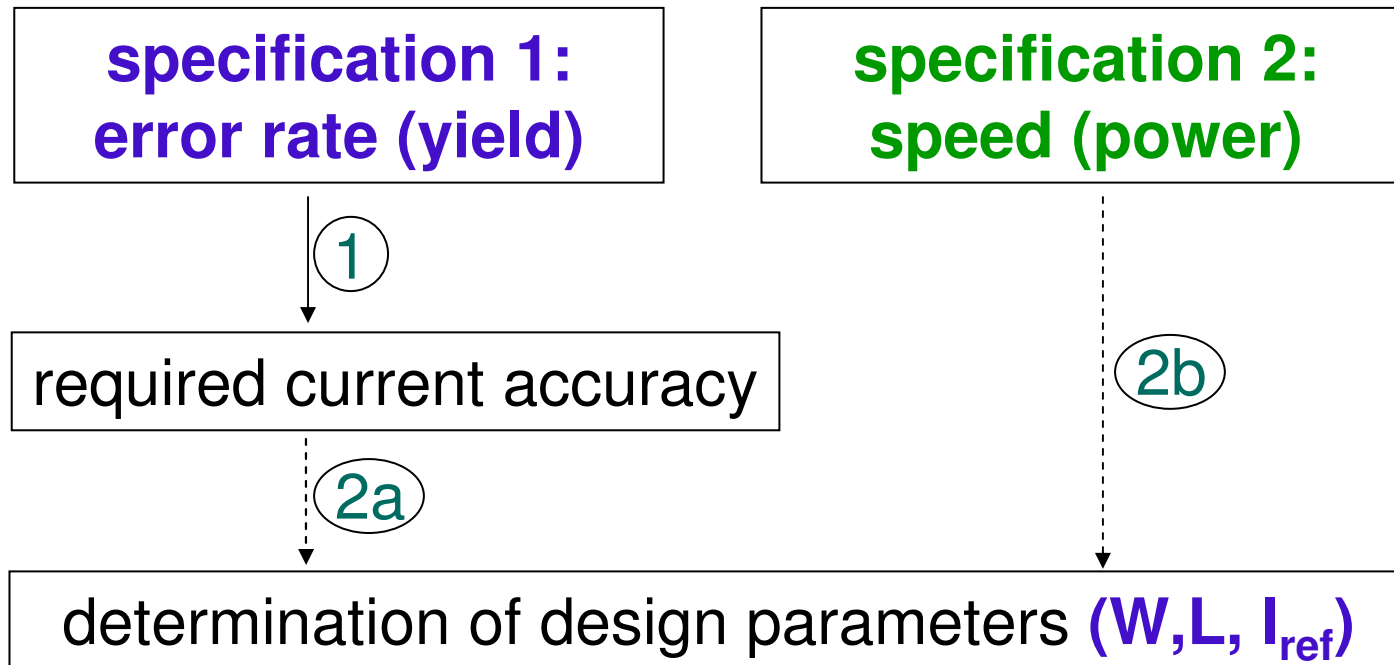
# Conceptual pixel architecture



# Schematic of the processing circuit



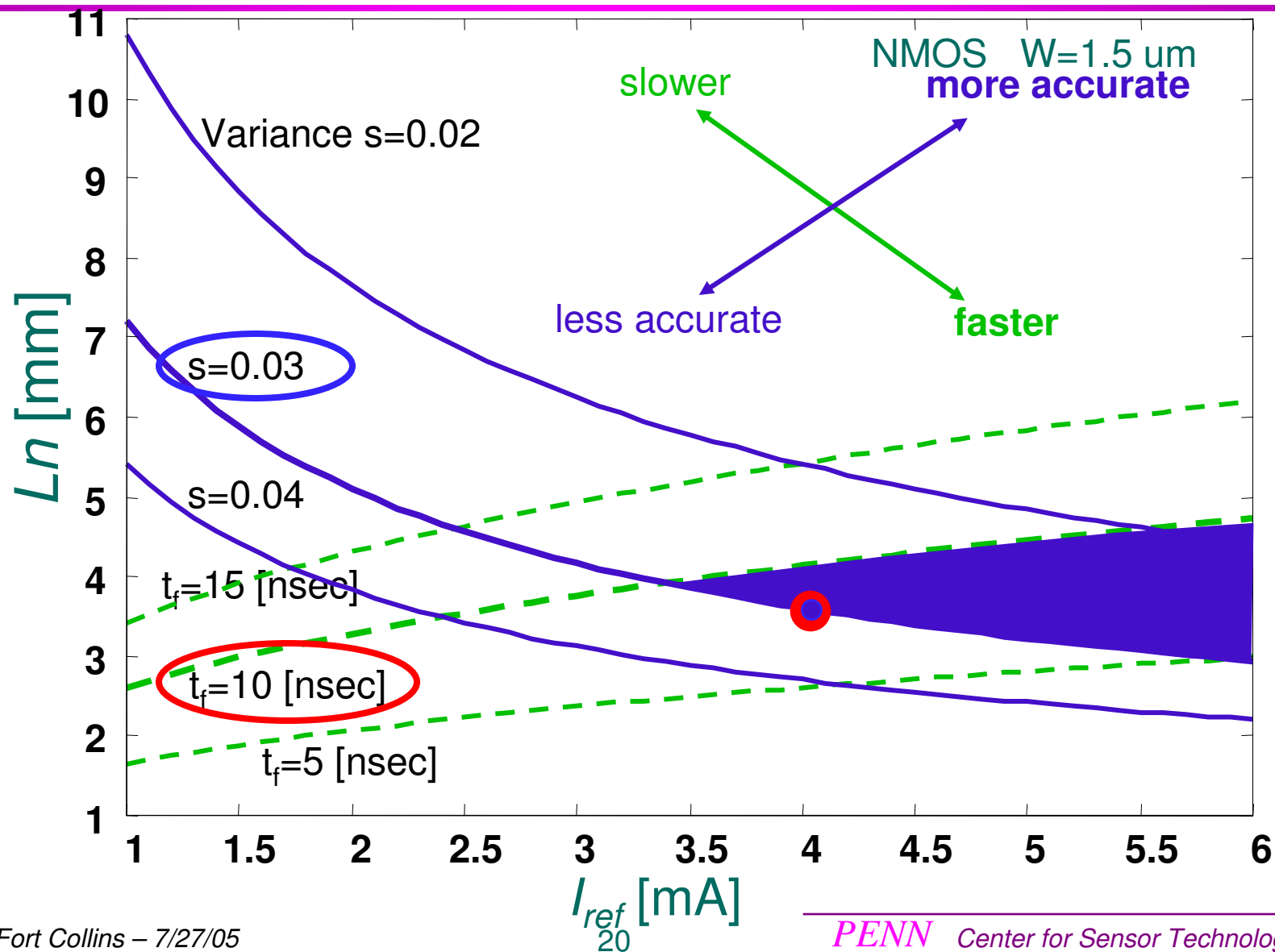
# Design procedure based on transistor mismatch analysis



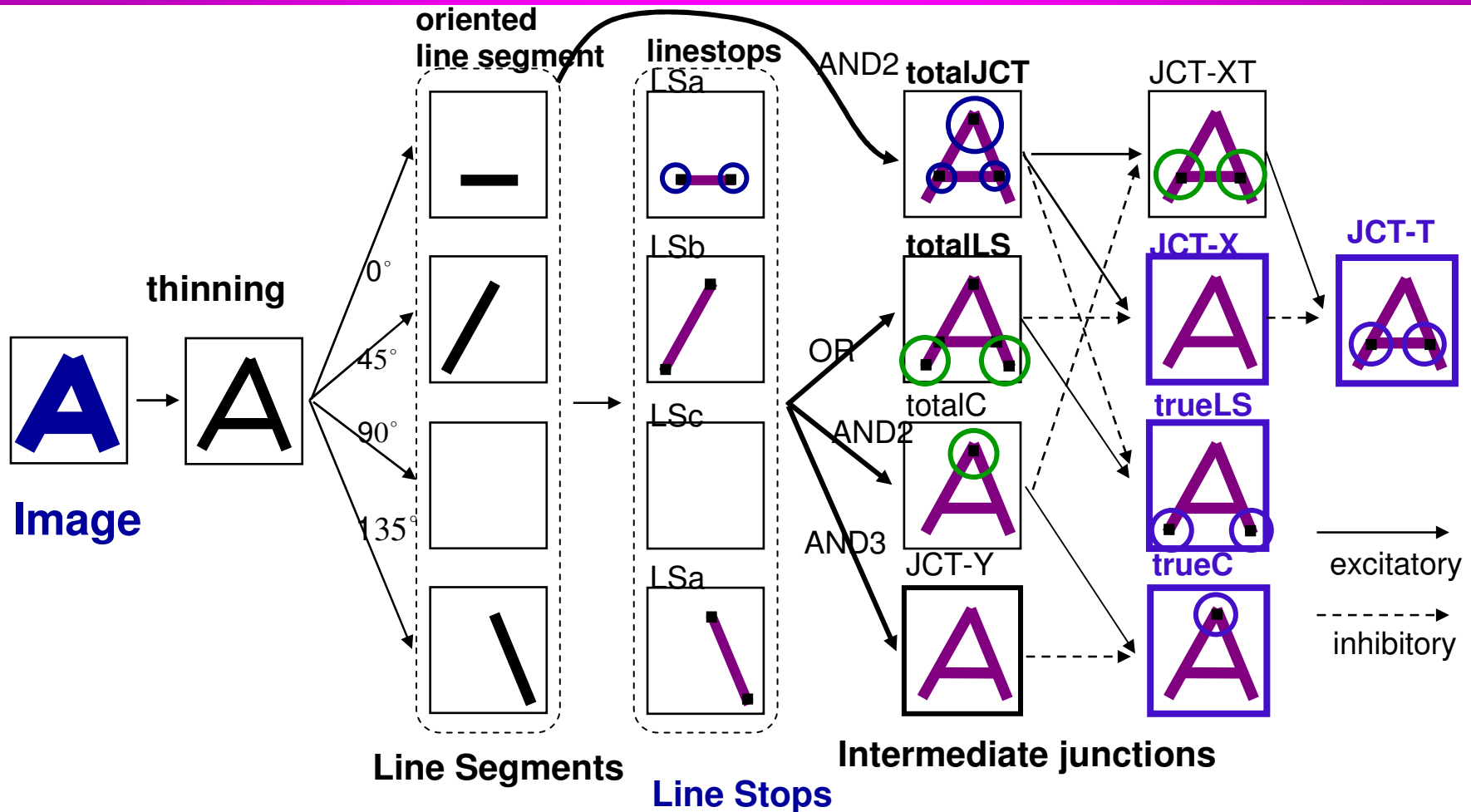
## Current variation is function of:

- design parameters ( $W, L, I_{ref}$ )
- mirroring operation
- summation and subtraction operations

# Speed and Accuracy as a function of the reference current

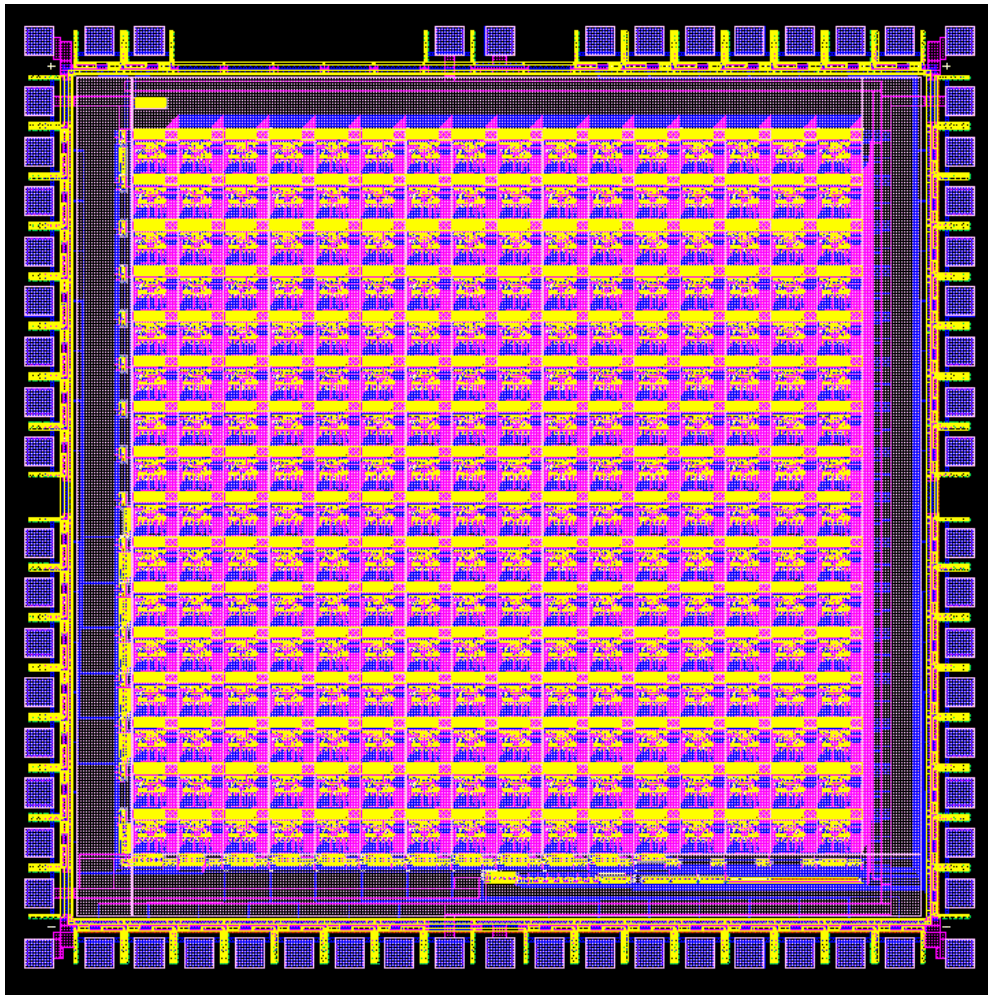


# Processing Flow on the Sensor



Additional operations: Line completion ; elimination of isolated points; line elongation

# Prototype Test Chip

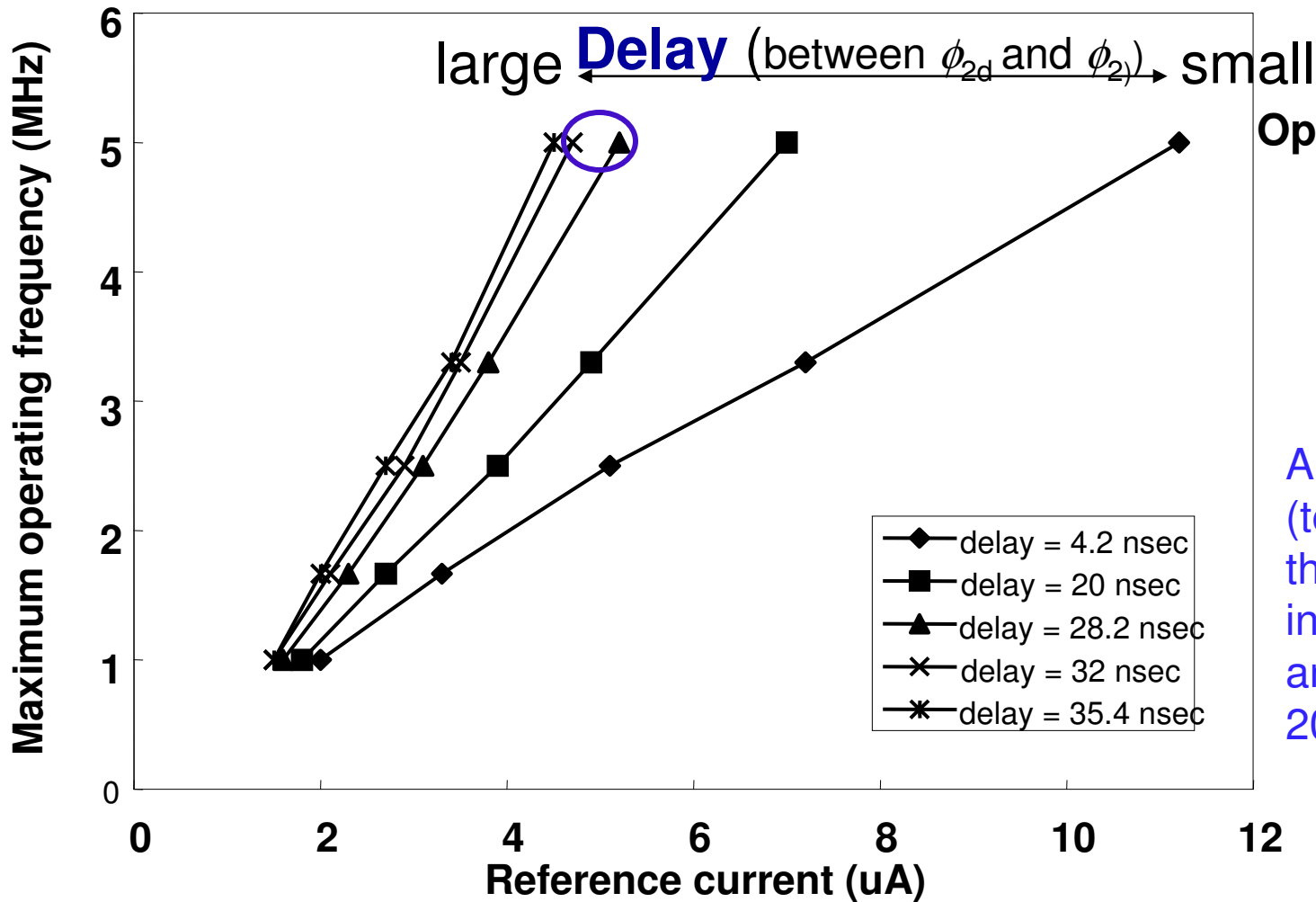


- technology: HP CMOS  
0.5 $\mu\text{m}$  (3 metal 1 poly)
- chip area: 3.2mm x 3.2mm
- pixel number: 16x16
- pixel area :154.5  $\mu\text{m}$  x 153.3  $\mu\text{m}$
- number of transistors:  
147tr/pixel
- fill factor: 12.5 %
- Each pixel is programmable:  
27 types of operations (30-bit  
word) involving up to 270  
individual steps

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# Results

# Maximum operating frequency as a function of the reference current



Operating conditions

$V_{DD} = 4$  [V] and

$I_{ref} = 4.5$  [ $\mu\text{A}$ ]

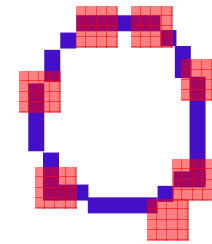
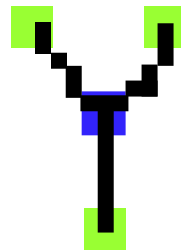
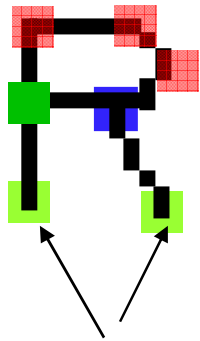
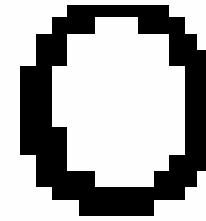
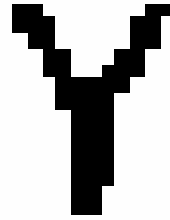
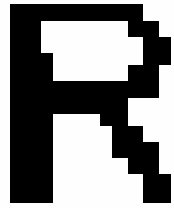
100 mW






5 MHz

An operation  
(template matching,  
thresholding, storing  
in memory) over full  
array takes only  
200ns.



# Sensor responses to letter images



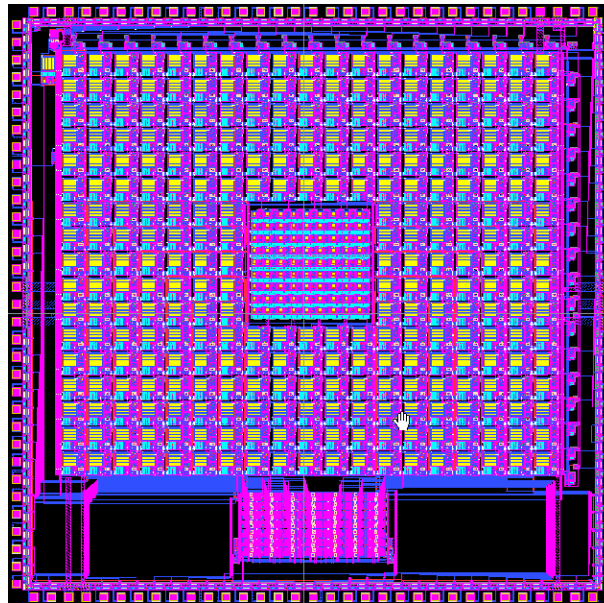
-  True LineStops
-  Corner
-  T-JCT
-  JCT-Y
-  JCT-X

Processing time @ 5MHz:  
54.2  $\mu$ sec (271 steps)

# Example 2

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## Silicon Retina for 2-D Tracking



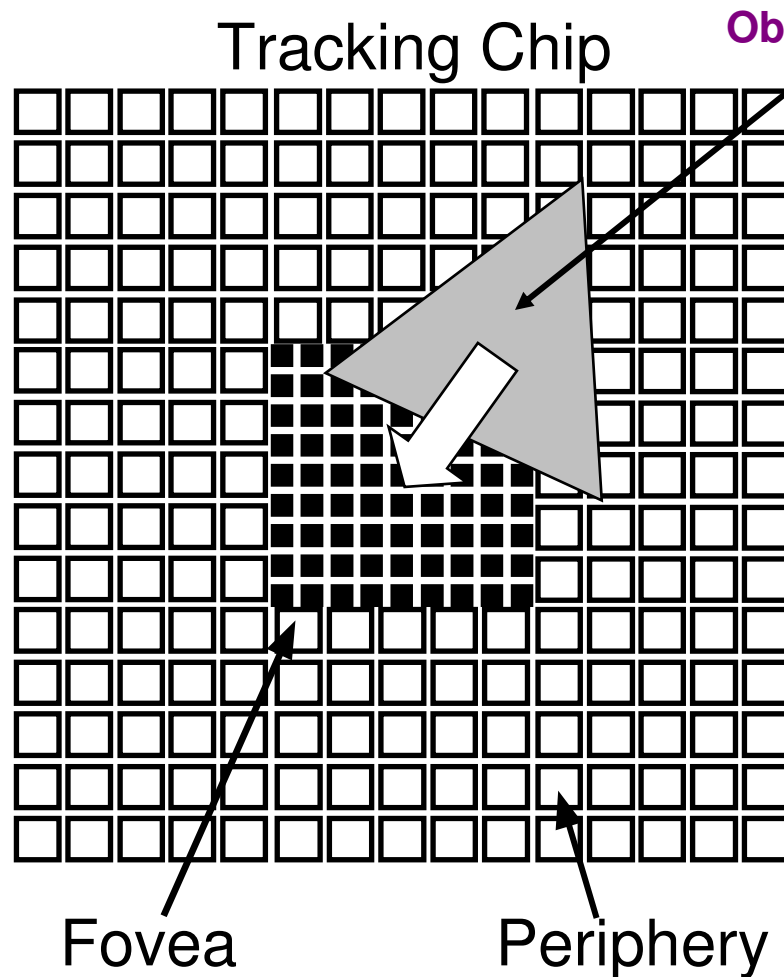
*(Ref: R. Etienne, J. Van der Spiegel, P. Mueller, M. Zhang, IEEE CAS II, June 2000)*

# Proposed approach

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- **Loosely modeled after the primate oculomotor system:**
  - Retinal photoreceptor organization
  - Retinal photosensing and early processing
  - Visual cortex for smooth pursuit
- **Superior colliculus** for saccadic generation
- **Capture the *functions*** found in biology and use the most efficient way to implement it using hardware (vs. wet ware)

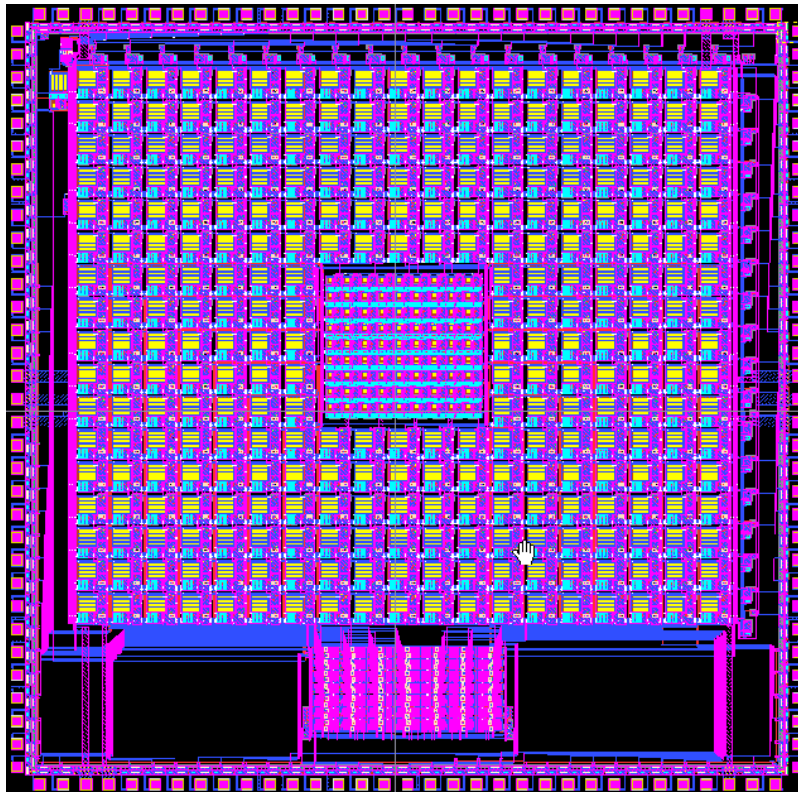
# Tracking Chip Architecture



- **Keep object centered on fovea**
- **Fovea:** smooth pursuit
- **Periphery:**
  - localization
  - saccadic generation
- **Interaction** fovea-periphery
- Select target based on **motion**

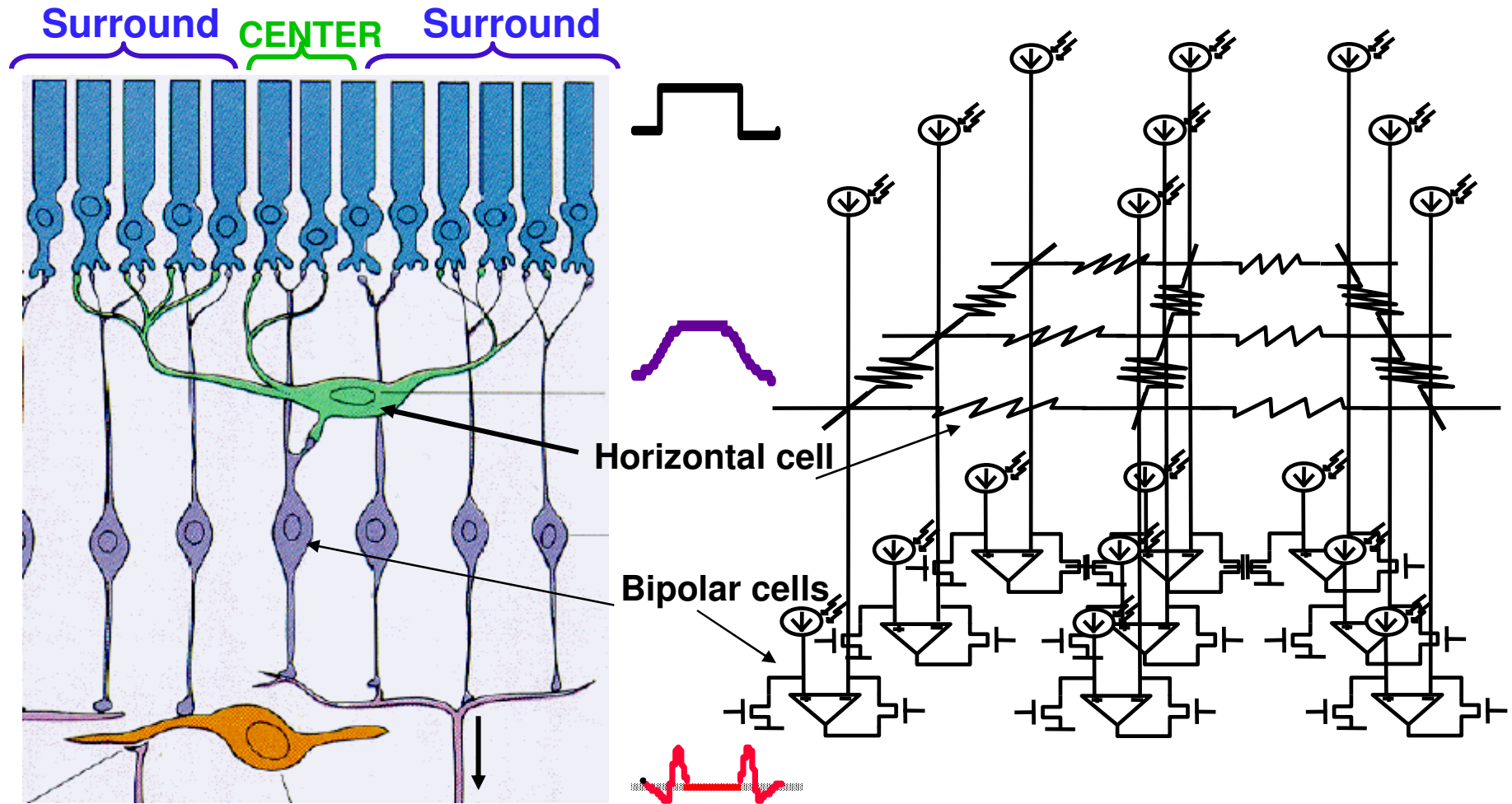
(After R. Etienne, J. Van der Spiegel, Mueller, M. Zhang, ISSCC 1997 and IEEE CAS II, June 2000)

# Tracking Chip



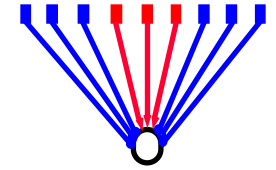
- Fovea: 9x9 cells
- Periphery: 19x17
- 2 $\mu$ m CMOS
- 6.4x6.8 mm<sup>2</sup>

# Retina with edge detection

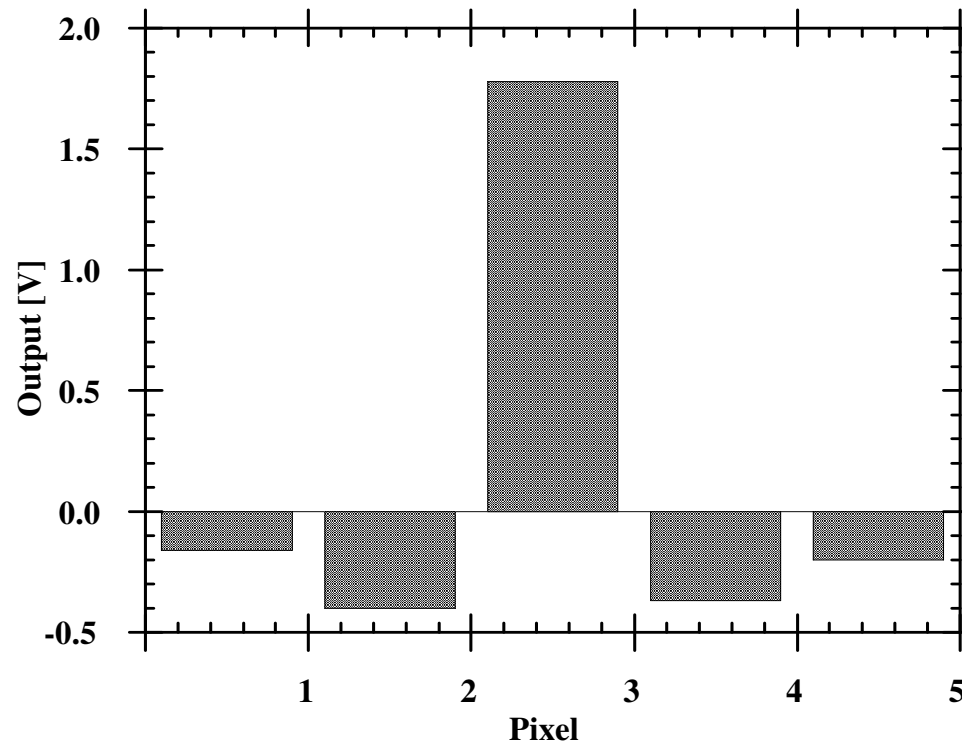


(after: [www.ini.unizh.ch/avlsi/](http://www.ini.unizh.ch/avlsi/))

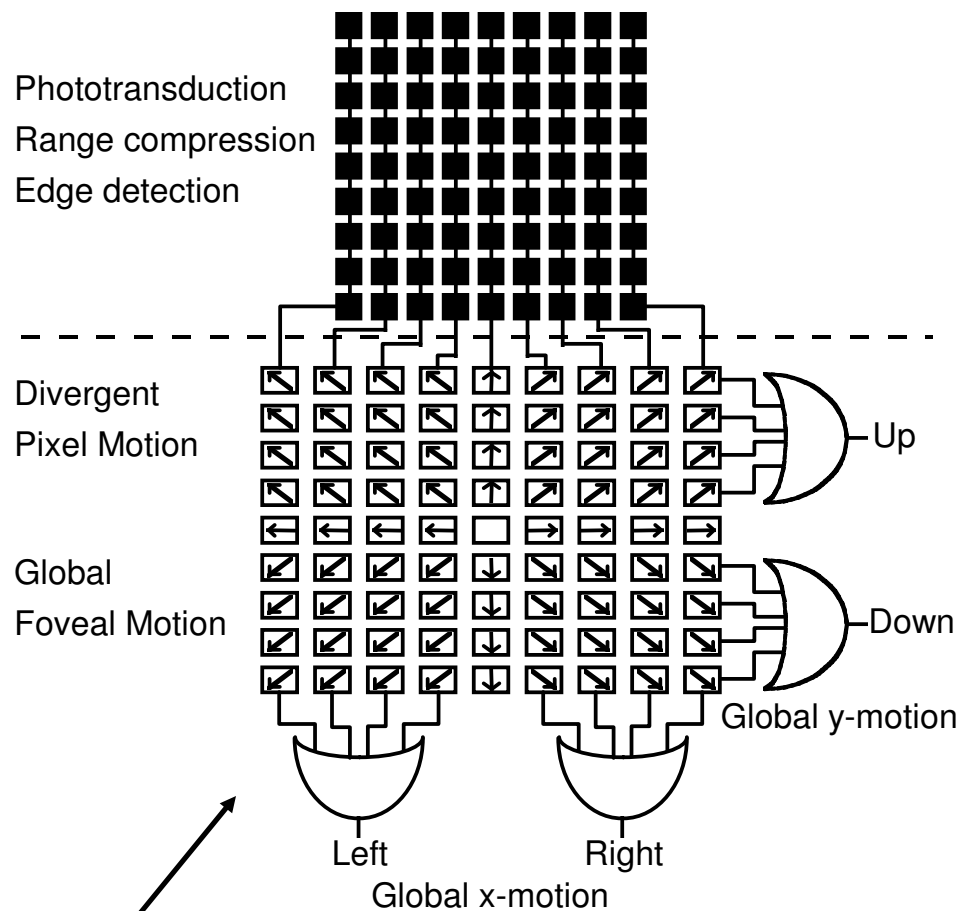
# Result of edge detector



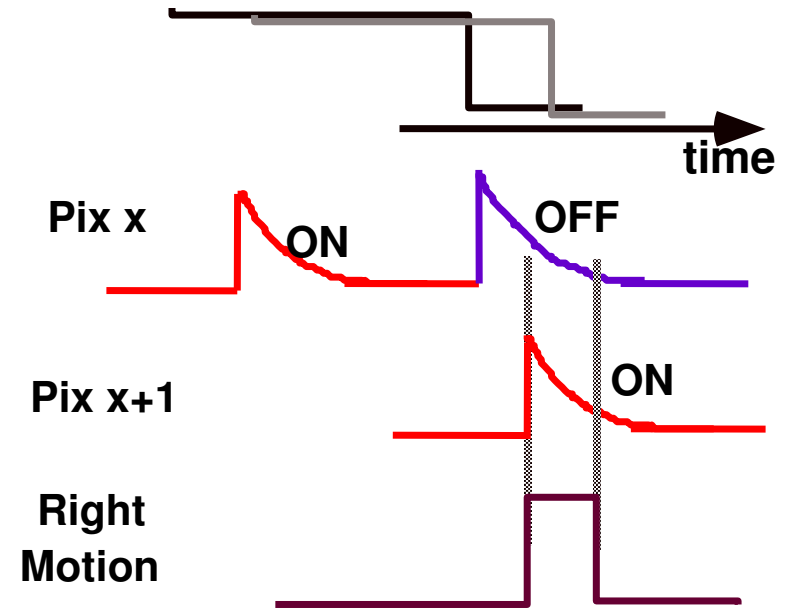
**Impulse Response of the Edge Detection Circuit:  
Bright Spot at Center Pixel**



# Motion detection in the fovea: smooth pursuit



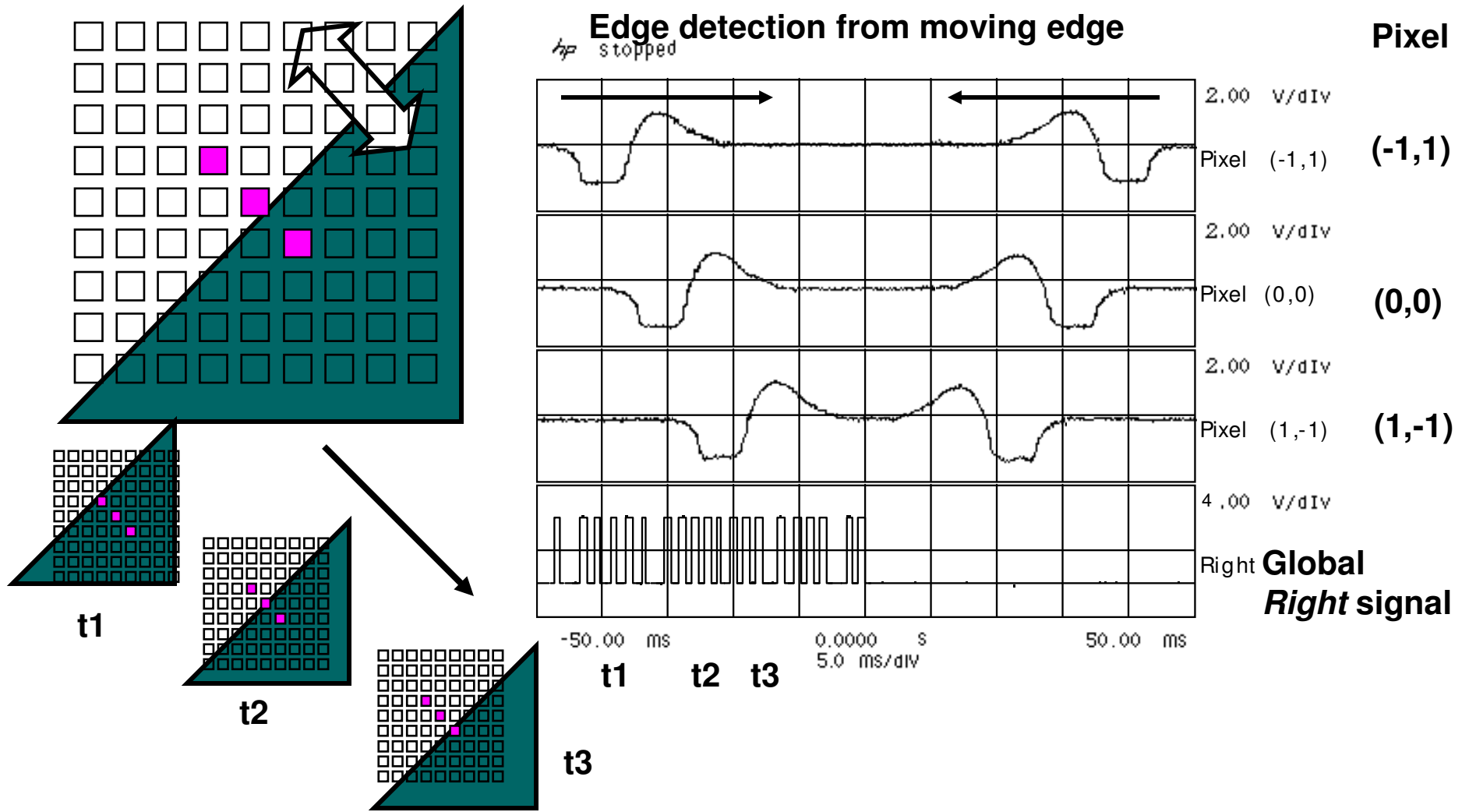
- **Correlation based**
- **X-motion (conceptual):**



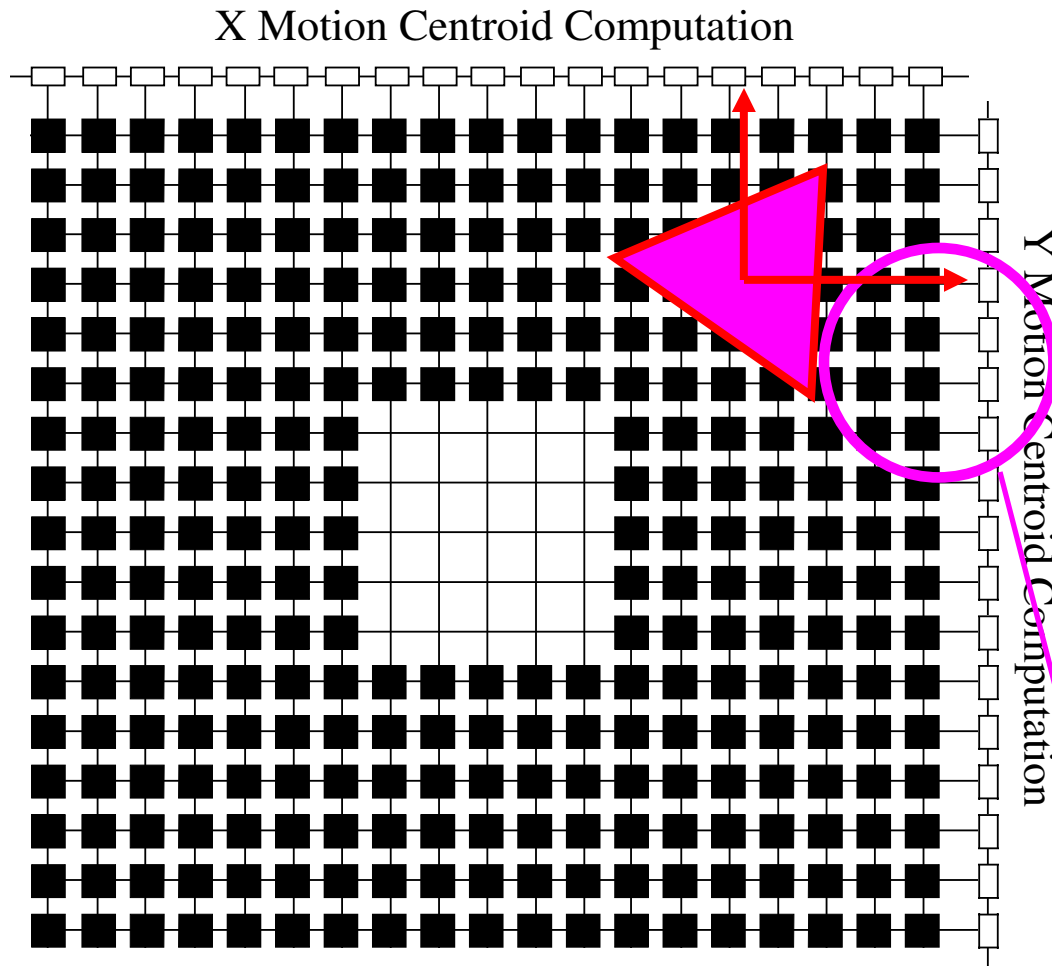
Performed outside array



# Measurement of the Foveal Motion detection

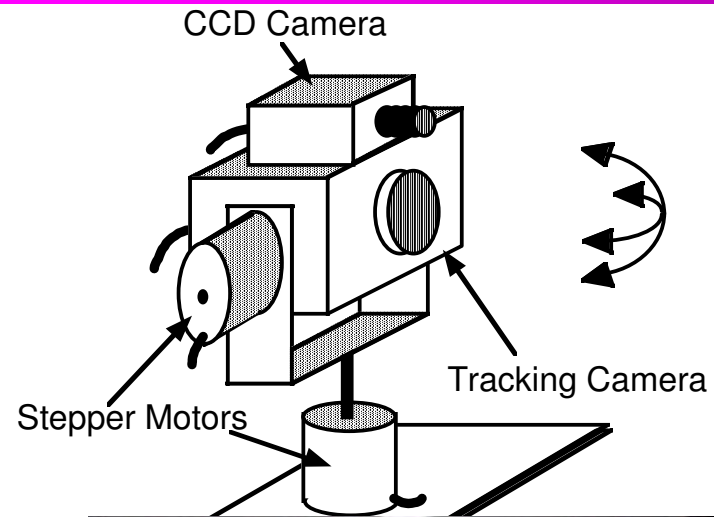
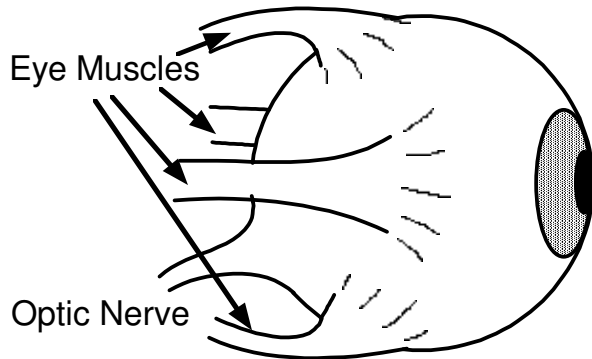


# Periphery: Target Acquisition



- Lower resolution
- Edge-detection
- ON-set detection (temporal differentiation but No motion detection)
- Localization of centroid in relation to the spatio-temporal boundaries
- Row & column labeling: X and Y

# Tracking Experiments



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# Conclusions

# Summary

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- **Biological systems provide a viable paradigm for building vision sensors:**
  - Compact, low power, robust under different conditions
  - Massively parallel pixel-level processing
- **Two Vision sensors:**
  - Higher level features (X-, Y, and T-type) : Incorporates processing functions found in area V1
  - Target tracking: space variant (foveal and periphery) for smooth pursuit and saccadic motion generation
  - Implements the **functions** and **algorithms** of biology.
  - Optimized for **information extraction**, not image rendering
  - Limitations: limited resolution, large pixel size and small fill factor.

# Thank you

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