



## 鄭桂忠

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#### **Research Interests**

▶ 生醫及仿神經電路與系統

Biomedical and neuromorphic circuit and system

▶ 仿生嗅覺系統-電子鼻

Bio-inspired olfaction system - Electronic nose

▶ 醫用植入、腦機介面、神經輔具

Medical implant, brain-machine interface, neural prosthesis

#### ▶ 類比/混合積體電路

Analog/Mixed signal VLSI





# Enabling Technology of Object Recognition and Tracking for Mobile Devices

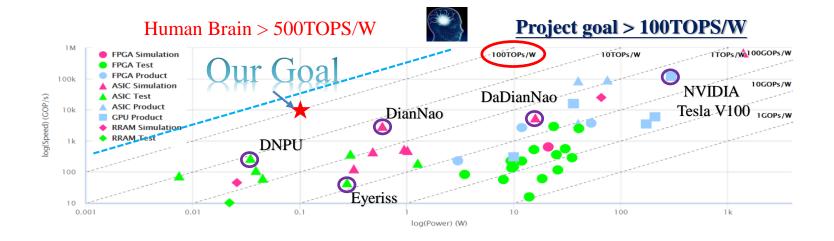
Neuromorphic Intelligent Vision System-on-Chip

PI: Kea-Tiong (Samuel) Tang, Dept. of EE, NTHU Co-PI: Chih-Cheng Hsieh, Chung-Chuan Lo, Ren-Shuo Liu, Hsin Chen





## **Goal: Approaching the Energy Efficiency of Human Brain**



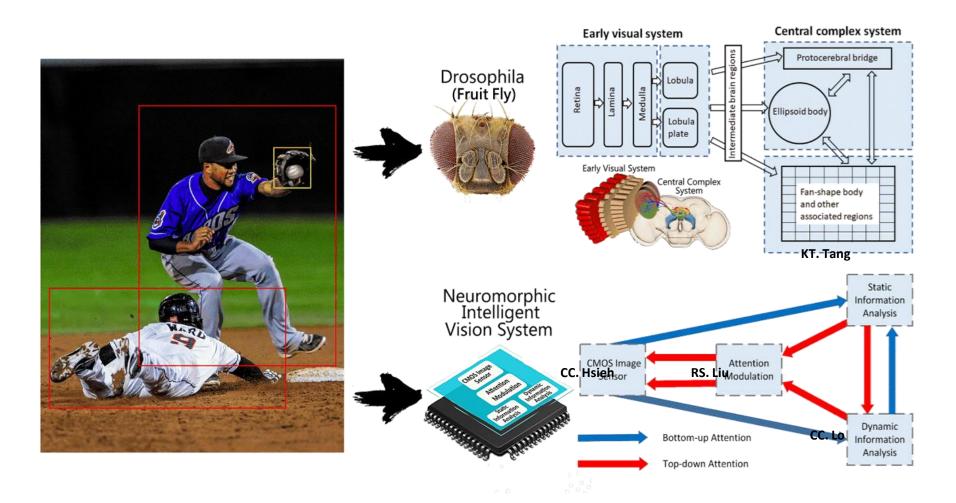
"To overcome the limitations of AI, we must build a bridge between computer science and biology ——Geoffrey Hinton"

- □ To achieve visual functions of recognition and tracking in mobile devices, the systems need 10 TOPS/s computation at low power.
- □ To approach the energy efficiency of human brain, we design the neuromorphic fruit fly visual system to develop next generation AI chip.





## Neuromorphic Realization of the Fruit Fly Visual System

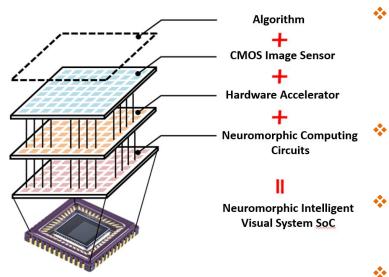






# **Project Summary**

- **%** Limitation: The massive computation, power consumption, and heat dissipation limit the feasibility of machine vision AI system at edge and mobile devices.
- **%** Solution: Develop neuromorphic intelligent vision system chip by mimicking biological visual systems.
- **\* Highlight** : <u>Low-power, real-time mobile recognition and tracking module</u>



- Neuromorphic architecture: Compute the multiply-andaccumulate (MAC) operations using in-memory computing by memory crossbar architecture to avoid energy consumption due to data movement and improve energy efficiency at inference.
  - **Neuromorphic system:** Design an event-triggered asynchronous system as spiking neural network to improve energy efficiency.
- Neuromorphic action detection algorithm: Build an insect dynamic visual model to detect corresponding actions by temporal response.
- Neuromorphic circuits: Build the spiking neural network circuits including neurons, synapse, learning circuits, etc.



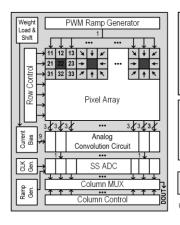


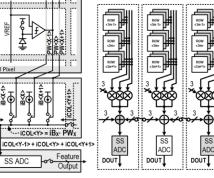
## **Technology Highlight No. 1**

### 0.5V Programmable 4-bit Weight Convolutional CMOS Image Sensor

#### Key Technology

- 0.5V CIS in TSMC 0.18um Technology 1.
- 2. 128x128 Linear-response PWM pixel array
- Programmable 3x3 kernel with 4-bit weights 3.
- Tunable-resolution column-parallel ADC 4.
- 5. Real-time analog-domain convolution-onreadout technique





COL<n-1>

COL<n>

COL<n+1>

Convolution Result = iCOL<Y-1> + iCOL<Y> + iCOL<Y+1> =  $\sum iB_{X}$  PW<sub>X</sub>

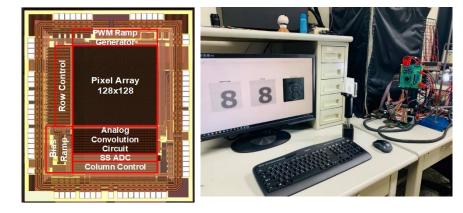










Image : Raw Data

Convolution A-B : Edge

Convolution : Positive Kernel Convolution : Negative Kernel

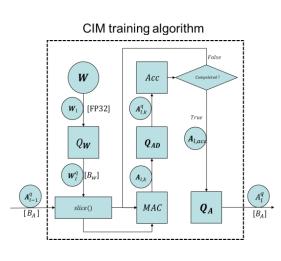


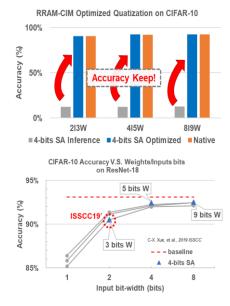


## **Technology Highlight No. 2**

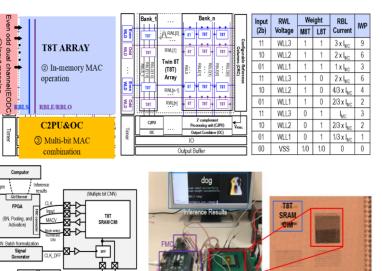
In-memory Computing Marco and Algorithm for Deep Neural Network

- Model compression based on In-memory computing
  - ResNet-18 model for CIFAR-10 dataset.
  - Optimization for ADC output resolution limitation.





 Twin-8T SRAM In-Memory Computing Macro



System set-up structure

T8T SRAM

CIM

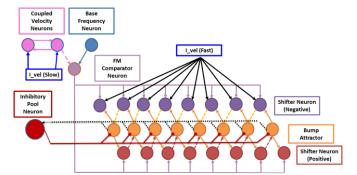


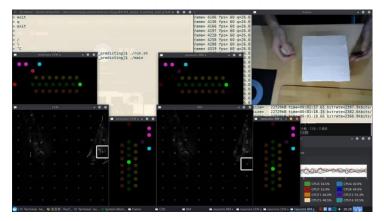


# **Technology Highlight No. 3**

Neuromorphic Object Tracking Algorithm Based on Insect Neural Model

• Sub-network model for object tracking





- Neuromorphic autonomous car
  - The central complex network in fruit flies

