

# Applications, Software and Hardware for Event-Based Vision



Kynan Eng



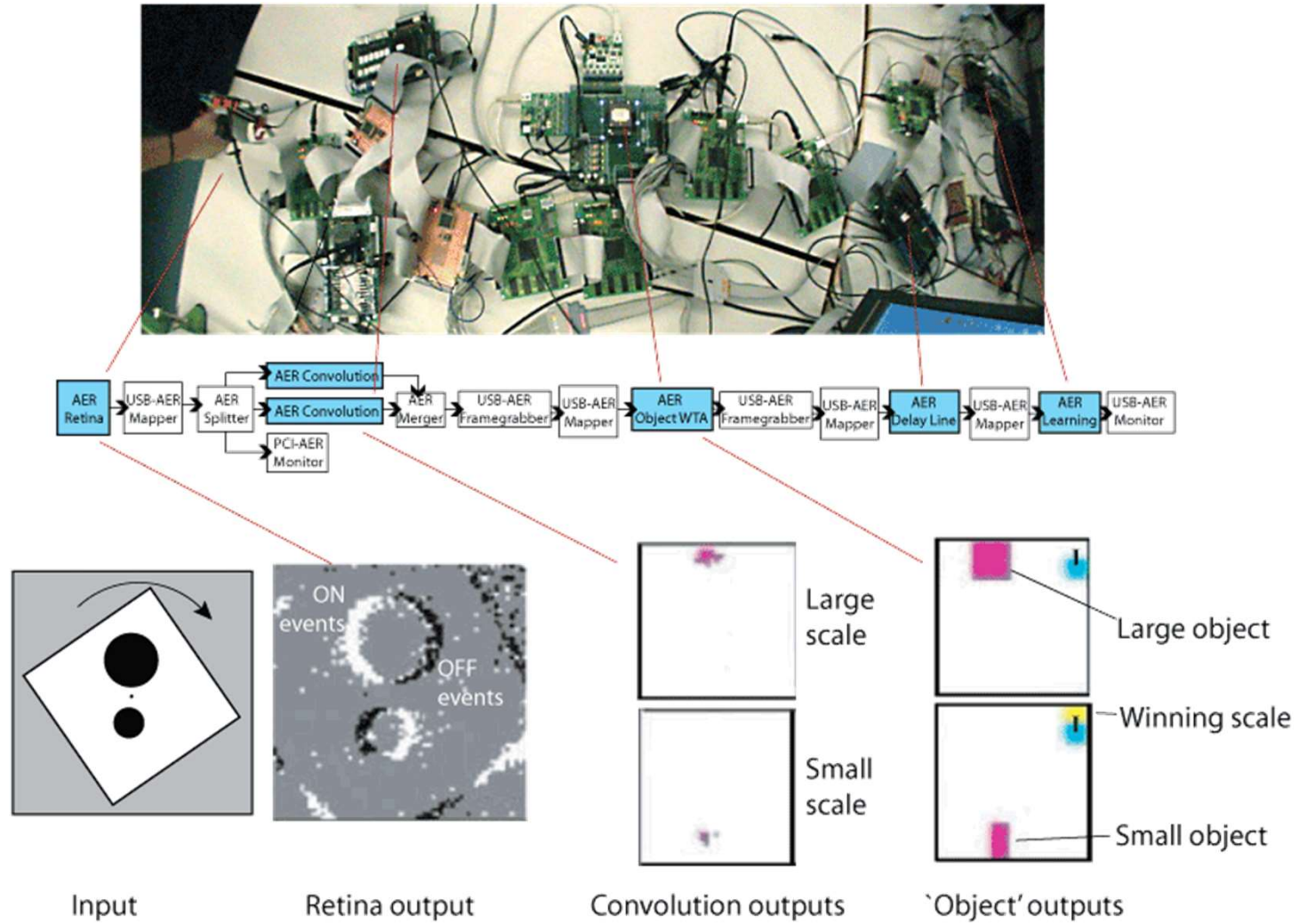
# Prelude

# Will Event-Based Vision Change the World (of vision)?

If yes, then we need:

1. A community of developers  
(including workshops like this one)
2. Methods for quantifying benefits

# Event-Based Vision, 2005



Delbruck, Liu, et al. 2005. CAVIAR EU project

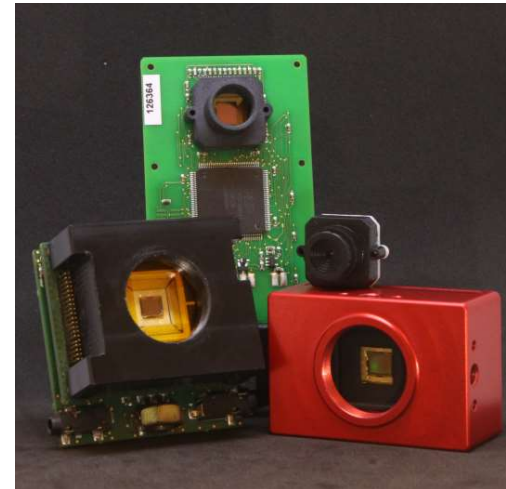
# Since 2008



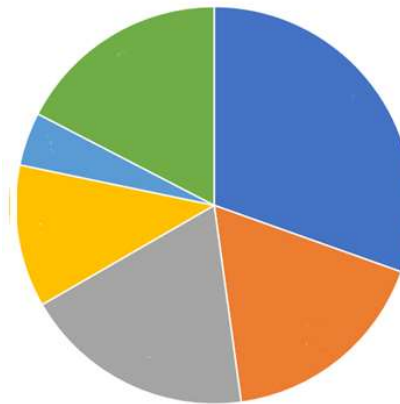
+Bias generator  
+USB cable



**2008**  
**DVS128**



Resolutions  
Form factors  
Greyscale / Color



- Industrial
- Consumer Electronics
- Automotive
- Aerospace
- Services
- Computing hardware

**2019**  
**>250 organizations**

# Today's Talk

## **Software**

- Making it easier

## **Applications**

- Does it make sense to do this with DVS?

## **Hardware**

- How to maximize DVS benefits

# Software

## Open DVS Development

# Problems with DVS Development

## Problems

- It's too hard
- I can't use OpenCV

## Solutions

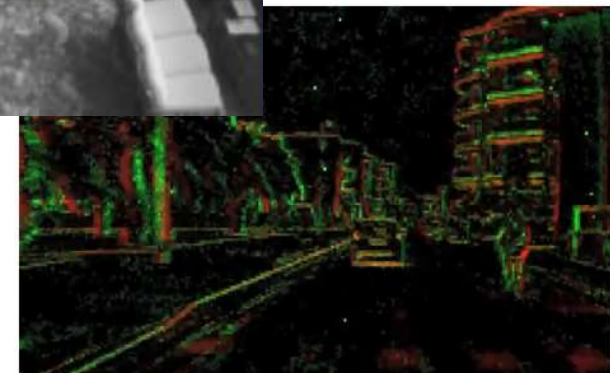
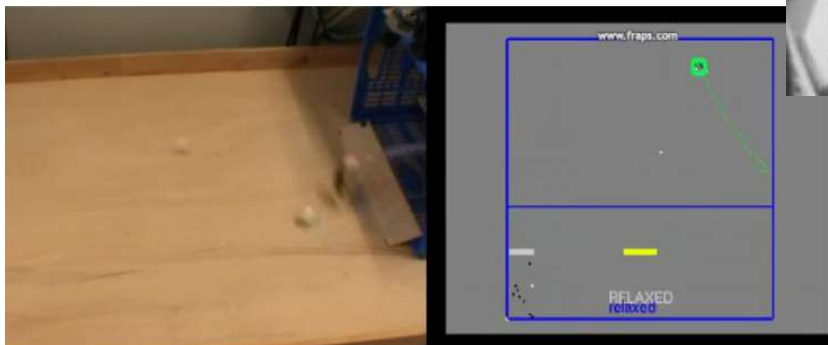
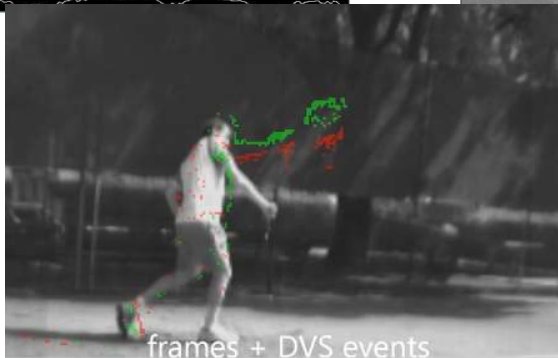
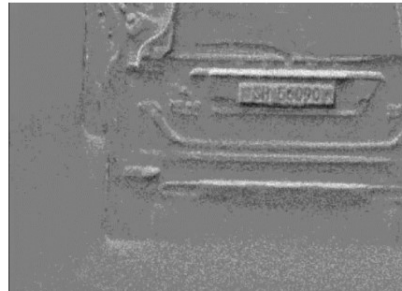
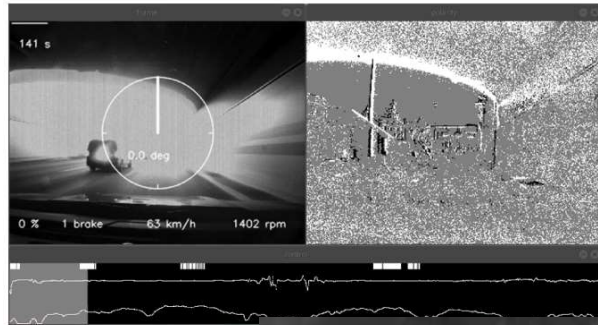
- Development environment
- Pre-built modules
- Interface to everything



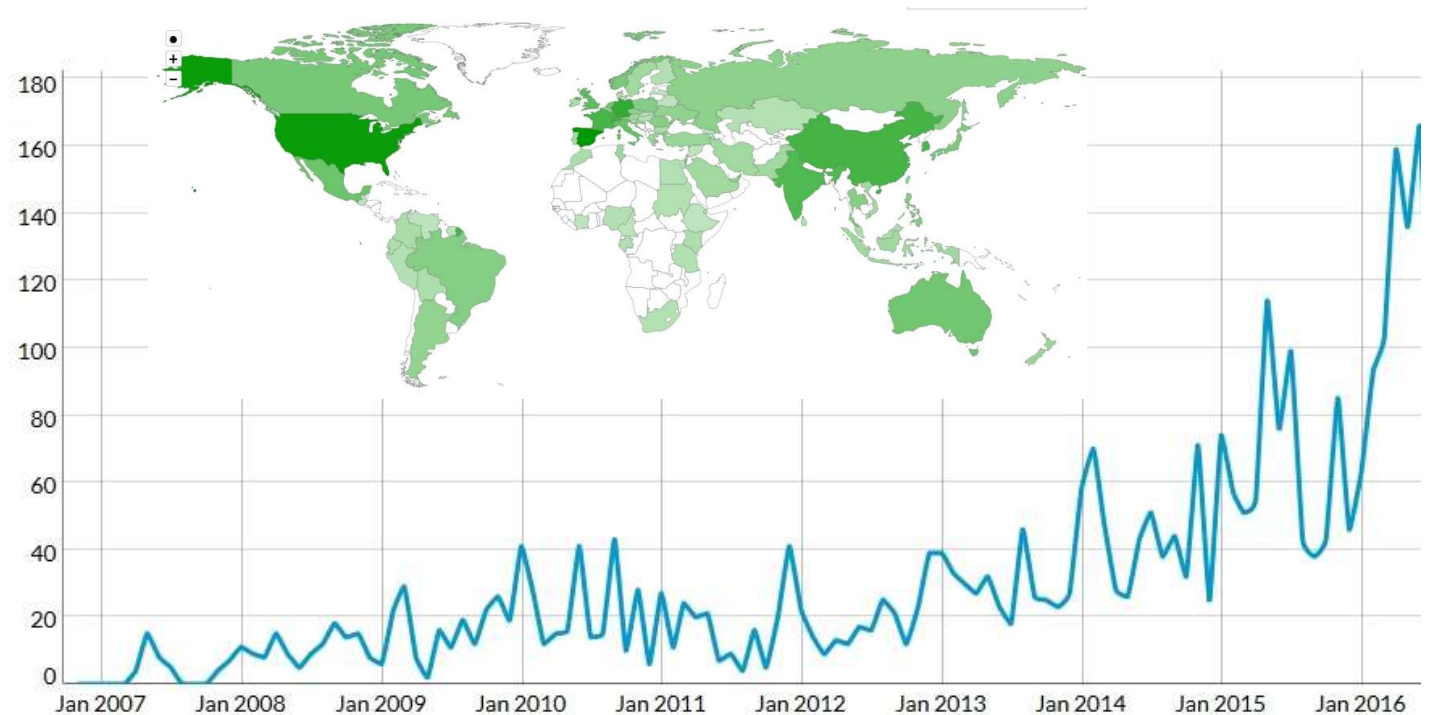
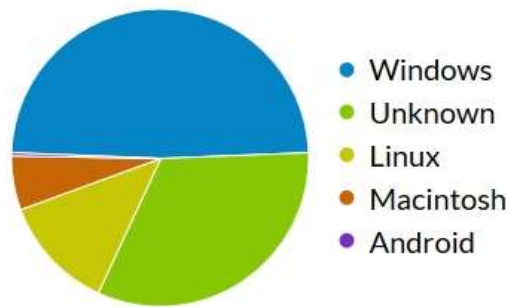
# Step 1: Prototyping with jAER + libcaer



>250 open-source  
modules contributed



# Step 1: Prototyping with jAER

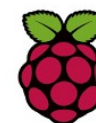


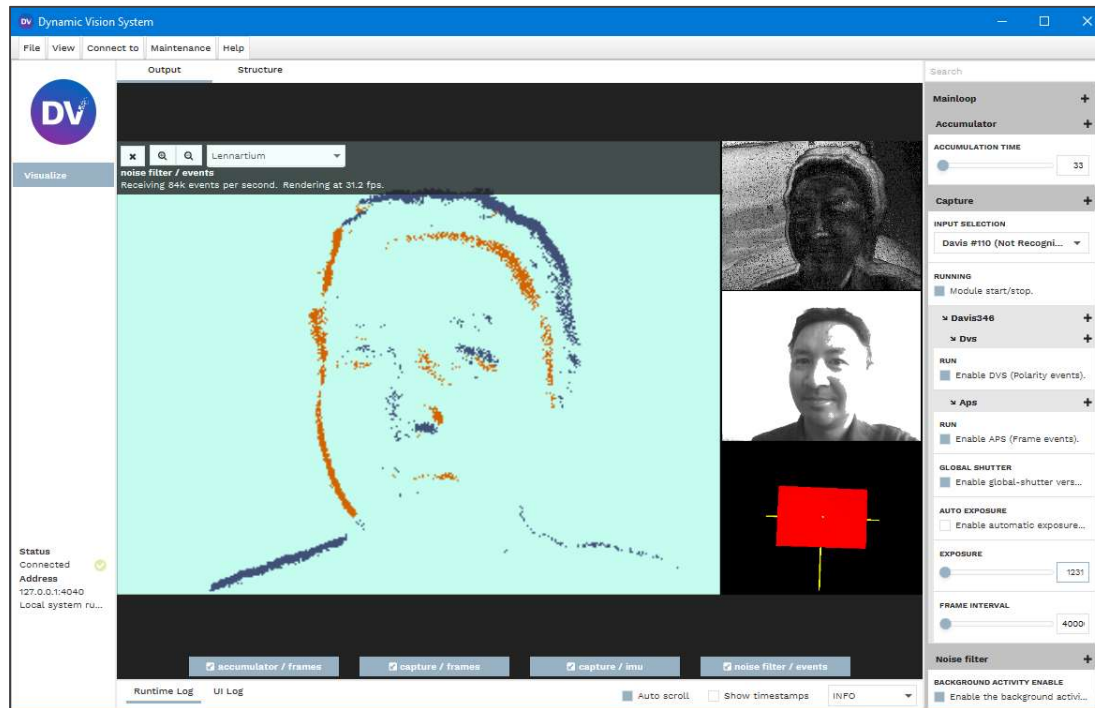
Up to 2016: >4000 downloads (Sourceforge, before switch to Git)

# Step 2: Robust Solution



- High-performance C/C++
- Open API
- Decoupled GUI and engine
- Cross-platform
- Works with different DVS cameras
- Interfaces to CNN hardware/software





Live Viewer

Network socket



Deployment

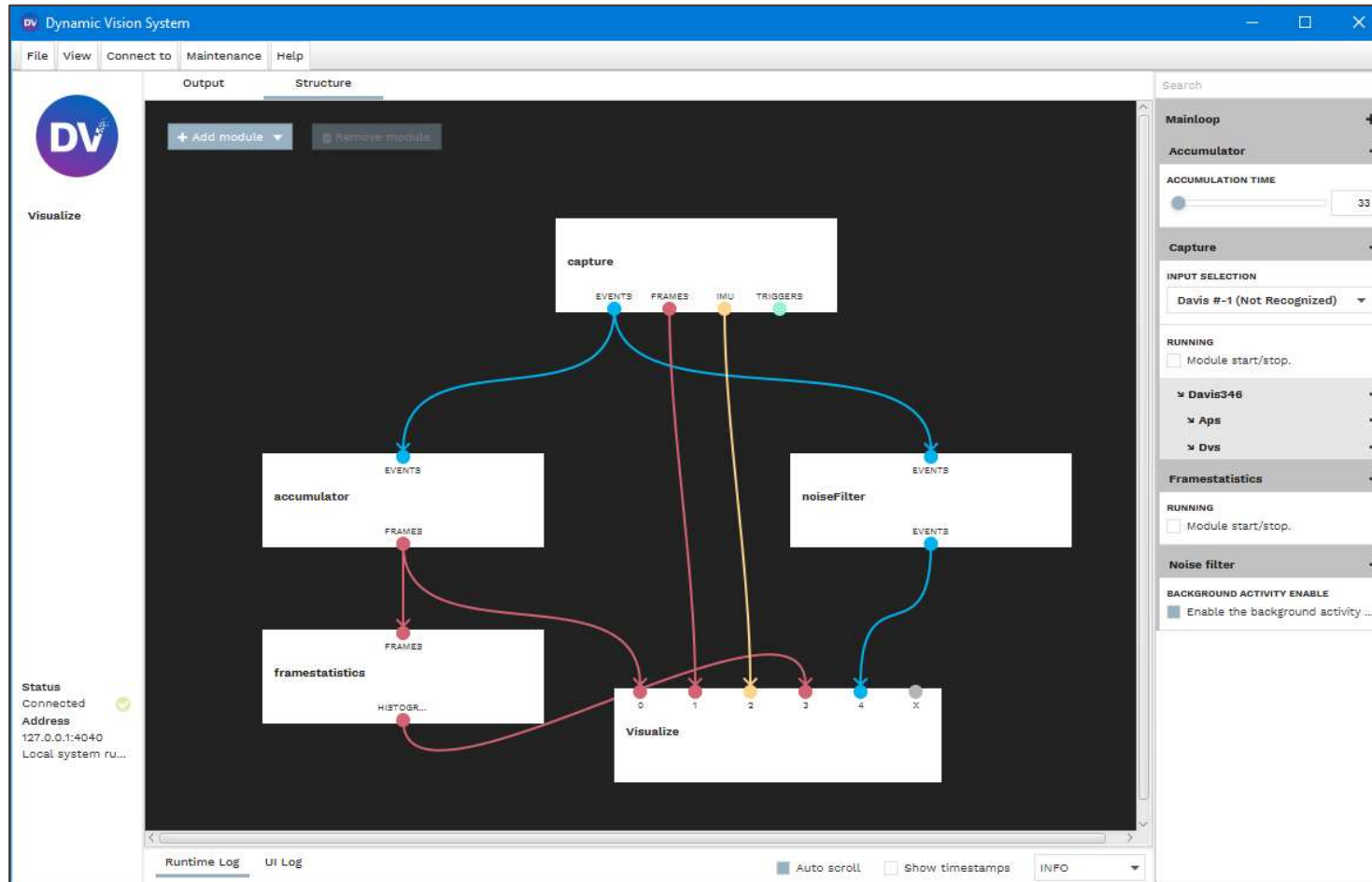
DV Instance  
(local or remote)



DVS



# Data Flow Definition



+ pre-built high-level modules

# Applications

## How to select DVS applications

# Questions & Assumptions

Where does DVS work best?

How can I decide?

## Possible answers

Low Latency

HDR

Energy efficiency?

# Questions & Assumptions

Where does DVS work best?

How can I decide?

**Single events vs Event frames vs Diff image**

Can we quantify how much DVS can beat frames?



# Problem Formulation



## Input Variables

$F$  = Target frame rate

$P_s$  = Total system power available

## Constants

$E_d$  = Energy per frame diff image

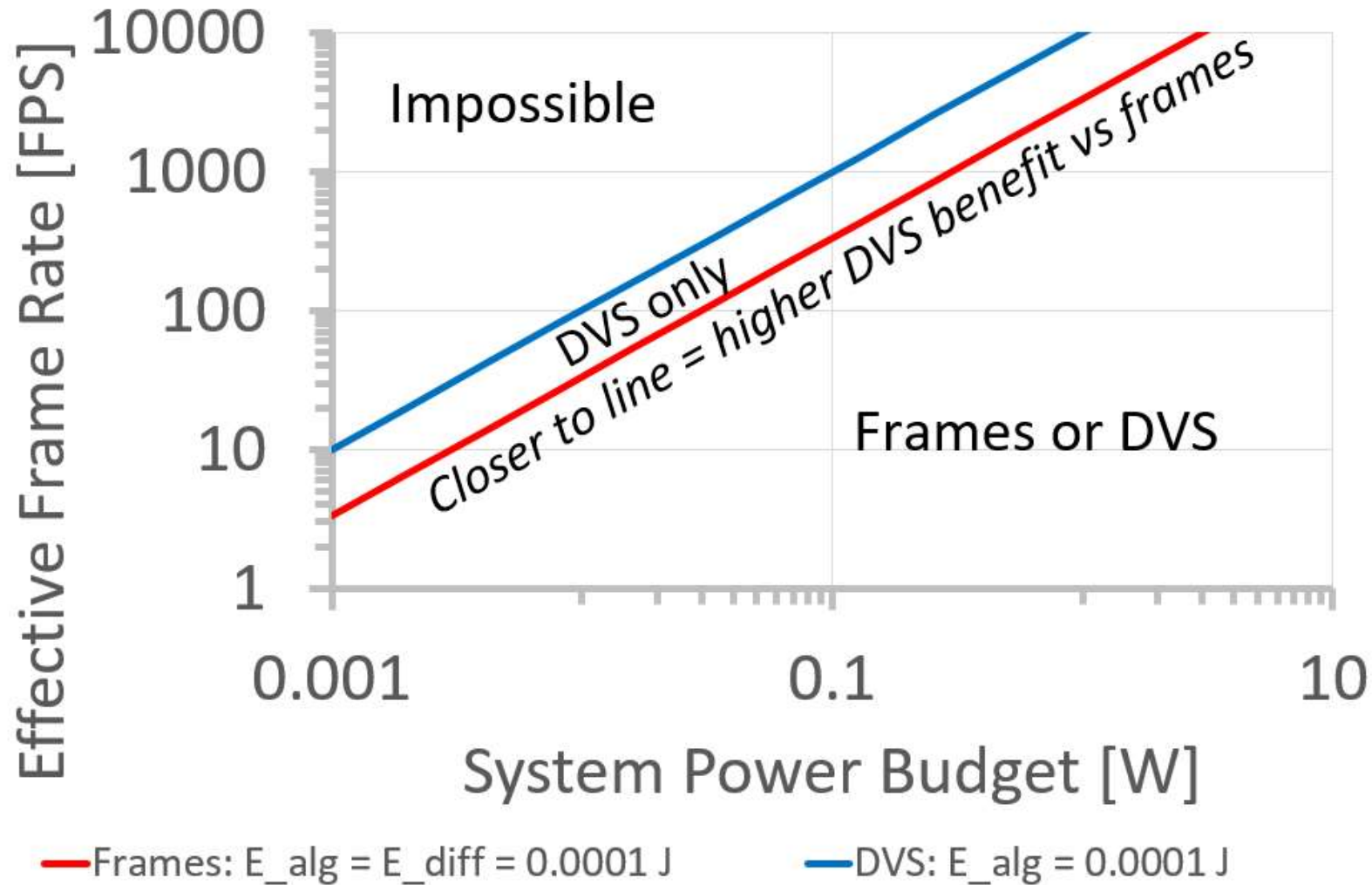
$E_a$  = Energy per processing algorithm update step

(note: assume algorithms need the same energy)

## Output

$P_a$  = Power margin available per frame for algorithms

# Result: Where DVS Works Best



# Hardware

## Maximizing DVS Benefits

# Questions, Principles

## **Question**

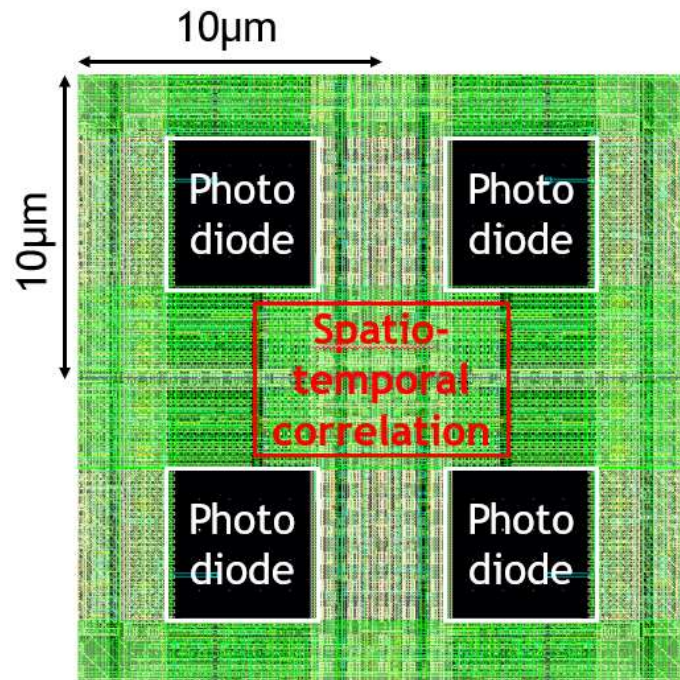
What hardware works best with DVS?

## **Principles**

Minimal power budget ASICs

Activity-dependent computation

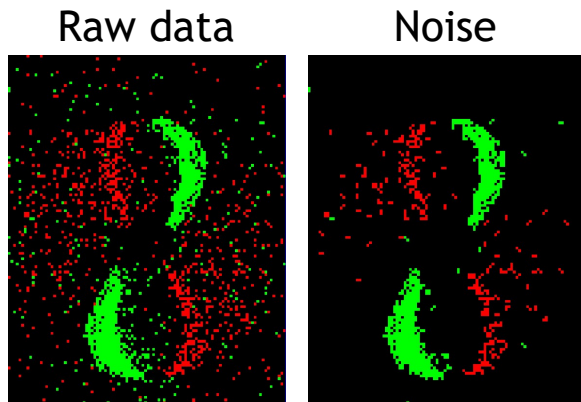
# In-Array Noise Filtering



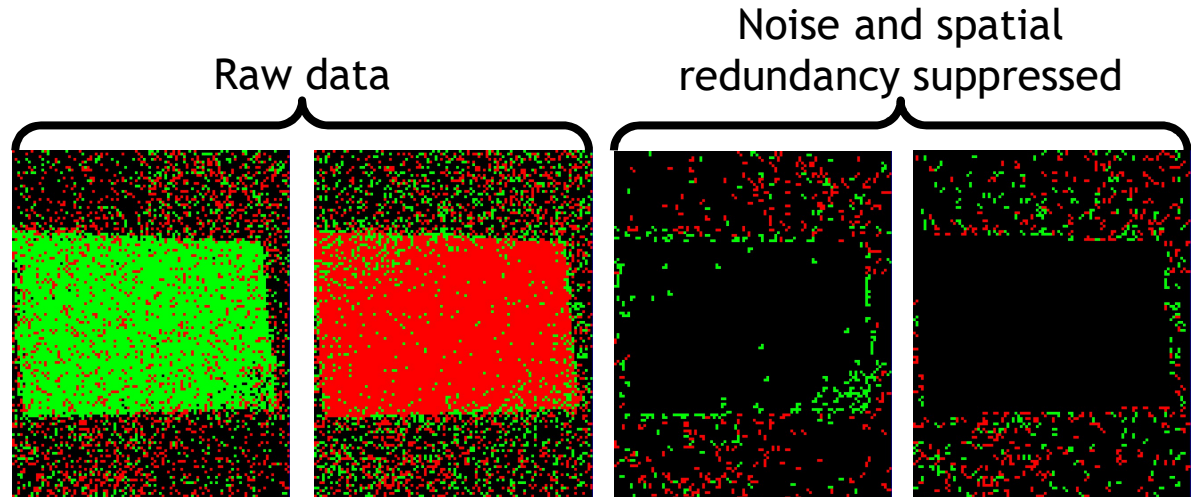
2x2 pixels  
10µm pitch, 20% fill factor,  
65nm 1P9M (non-CIS)

Technology		65nm
Pixel size (µm)		10
Max Readout Speed (Meps)		180
Readout Efficiency (event/clock)		Best: 4, worst: 0.25
Power Supply (V)		1.2
Power (mW)	High activity	180Meps: 4.9
	Low activity	100keps: 0.25
Normalized	Dynamic energy (pJ/event)	26
	Static power (nW/pixel)	18

# In-Array Noise Filtering



1804 events    1070 events  
40% less data



8199 events    8764 events    1034 events    1067 events  
87% less data



1800 rpm USB fan  
1 kefps  
300 lux



Flickering monitor  
200 efps  
300 lux

*Li C, IISW 2019*

# Dynap-SE by aiCTX

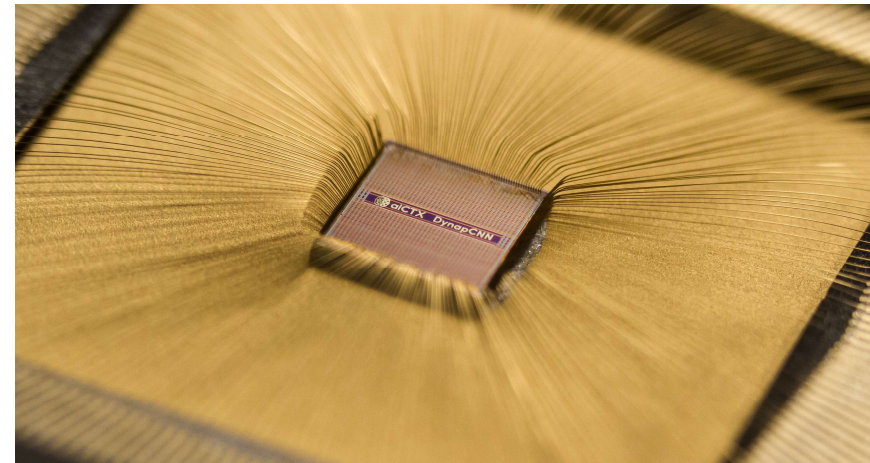


Technology	28 nm FDSOI
Supply Voltage	0.73 V
<b>Neuron Type</b>	<b>Analog</b>
Neurons per core	256
Core Area	0.36 mm <sup>2</sup>
Fan In/Out	2k/8k
Synaptic Weight	(4+1) bits
Energy per SOP	<2 pJ <sup>*2</sup>
Energy per spike	<1.68 nJ <sup>*3</sup>

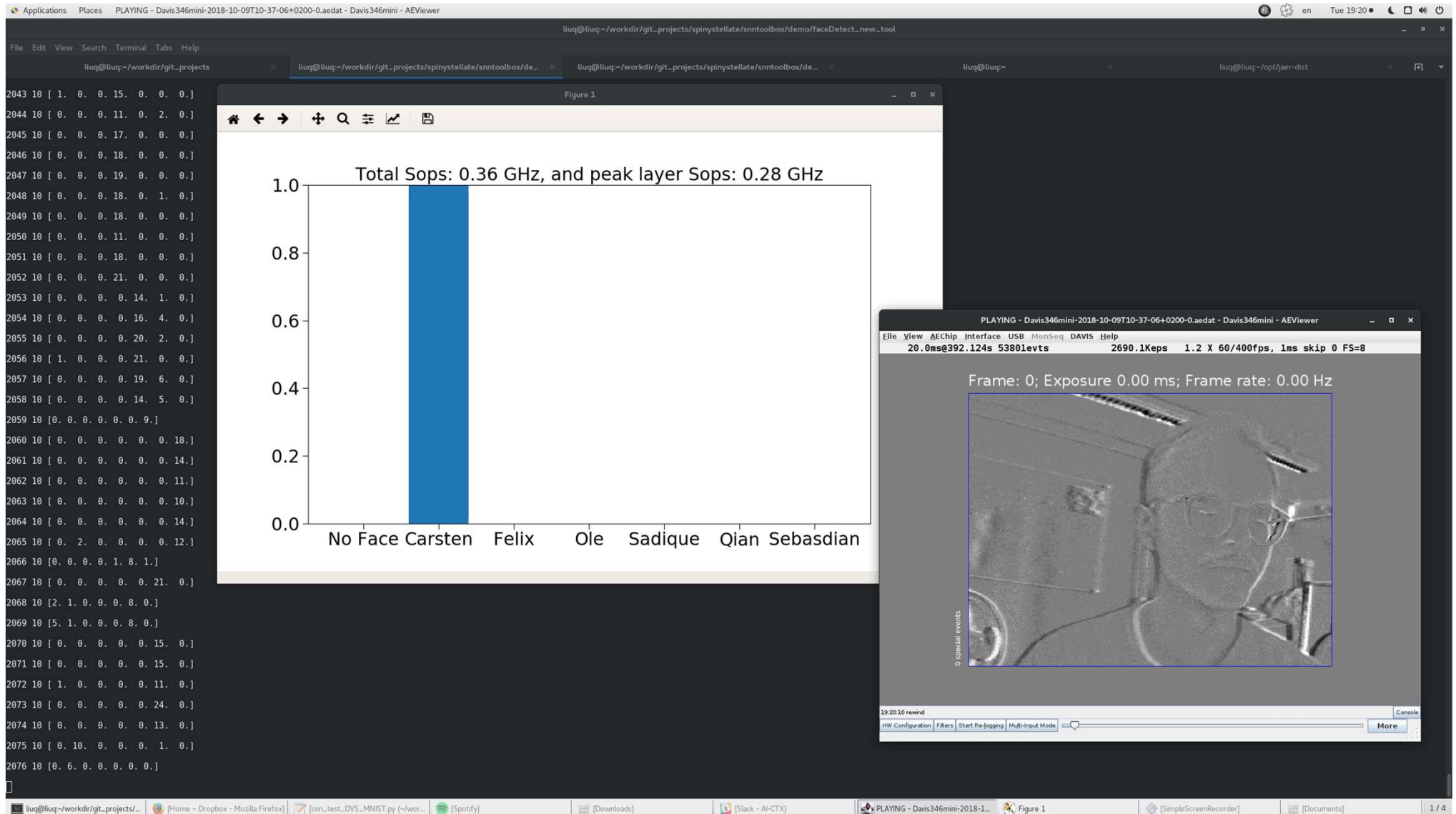
# DynapCNN by aiCTX



Technology	22 nm
<b>Neuron Type</b>	<b>Digital</b>
Neurons	1 M
Core Area	12 mm <sup>2</sup>
Parameters	4 M
Input sync	Fully event-driven
Power	< 1 mW (typical)







The terminal window displays a list of test results for various categories. The bar chart, titled 'Figure 1', shows the total Sops for each category. The chart is titled 'Total Sops: 0.36 GHz, and peak layer Sops: 0.28 GHz'. The categories are: No Face, Carsten, Felix, Ole, Sadique, Qian, and Sebasdian. The 'Carsten' category has the highest Sops value, approximately 0.28 GHz.

Category	Total Sops (GHz)
No Face	0.00
Carsten	0.28
Felix	0.00
Ole	0.00
Sadique	0.00
Qian	0.00
Sebasdian	0.00

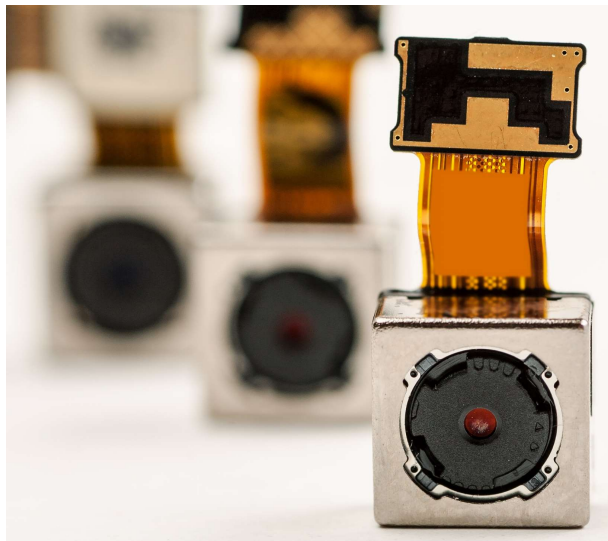
The inset window shows a grayscale image of a person's face with a bounding box. The text above the image reads: 'Frame: 0; Exposure 0.00 ms; Frame rate: 0.00 Hz'. The text below the image reads: '0 special events'.

# DVS + DynapCNN



# SPECK

Micropower  
intelligent scene analysis  
for mobile and IoT



- Announced CES 2019
- Single-chip DVS + CNN processor
- Ultra-low-power classification
- <1 mW power (typical)
- Low latency
- Sampling Q3 2019

# Talk to Us



[www.iniVation.com](http://www.iniVation.com)

Live demos @ CVPR: Booth 1554