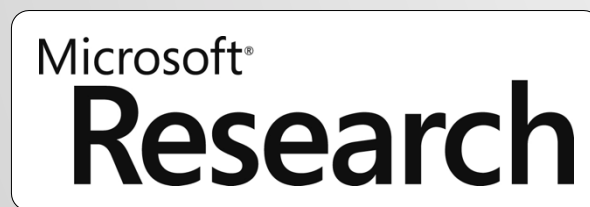


# ENERGY-PROPORTIONAL IMAGE SENSING FOR CONTINUOUS MOBILE VISION

Robert LiKamWa  
Bodhi Priyantha  
Matthai Philipose  
Victor Bahl  
Lin Zhong



<http://roblkw.com>

<http://research.microsoft.com>



The Devil Wears Prada

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

Face Recognition



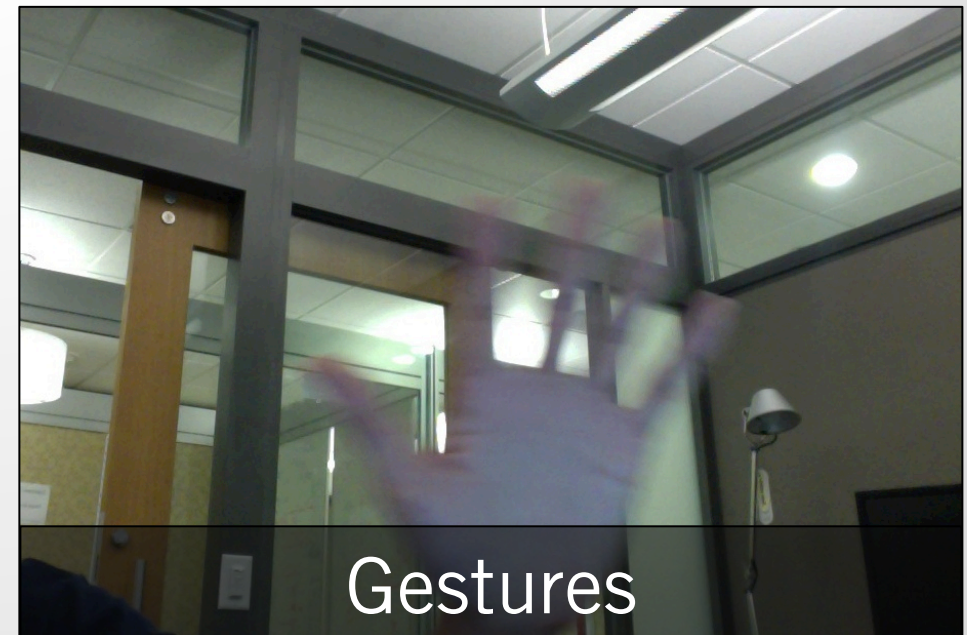
Object Memory



# CONTINUOUS MOBILE VISION



Fine-grained Localization



Gestures

# BATTERY DEATH

GoPro Hero

2-3 hours



LooxCie

2-3 hours



Google Glass

2-3 hours



Image Sensor  
Goal < 25 mW

Sensors  
~ 5 mW

Processor  
~150 mW

Network Stack  
~20 mW

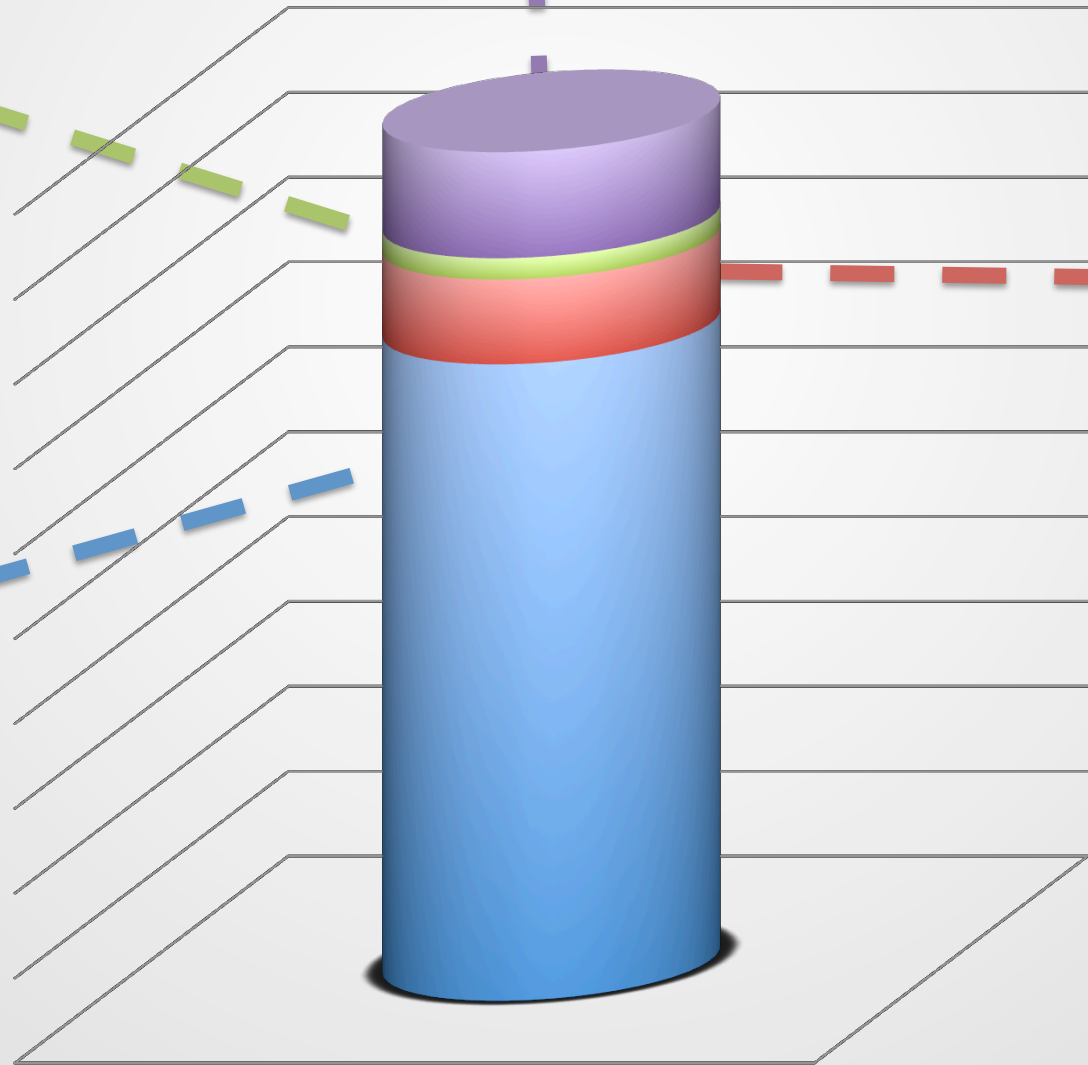
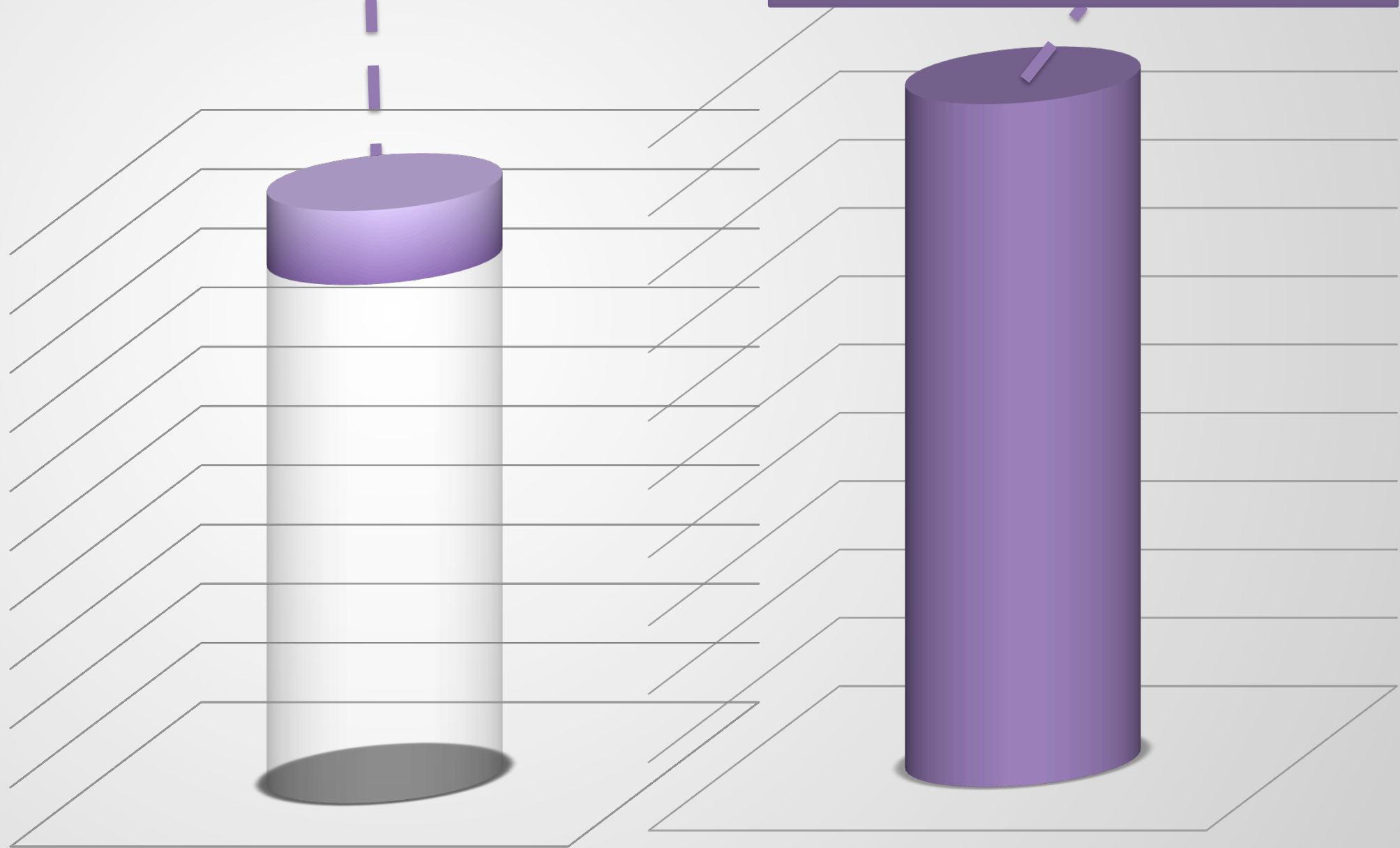
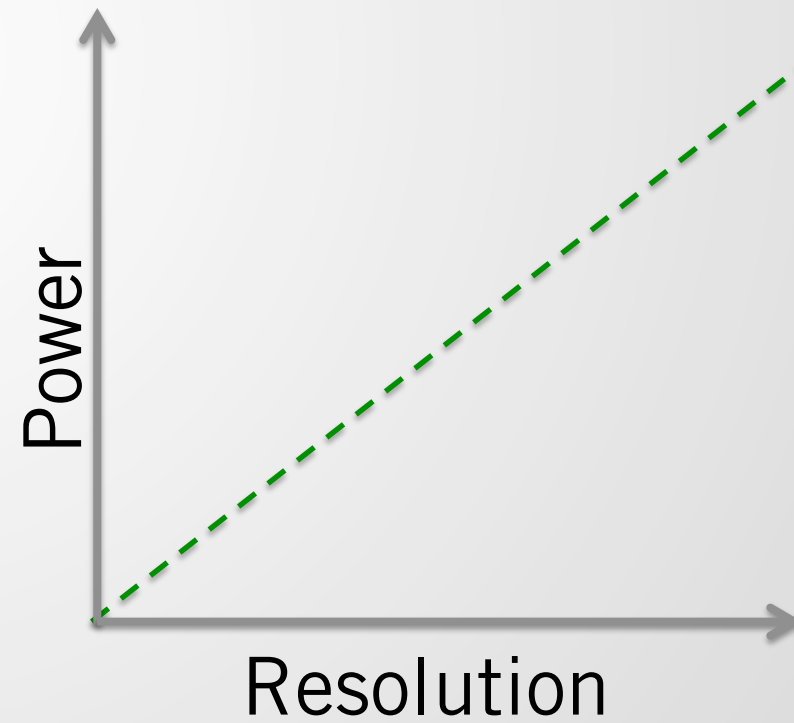
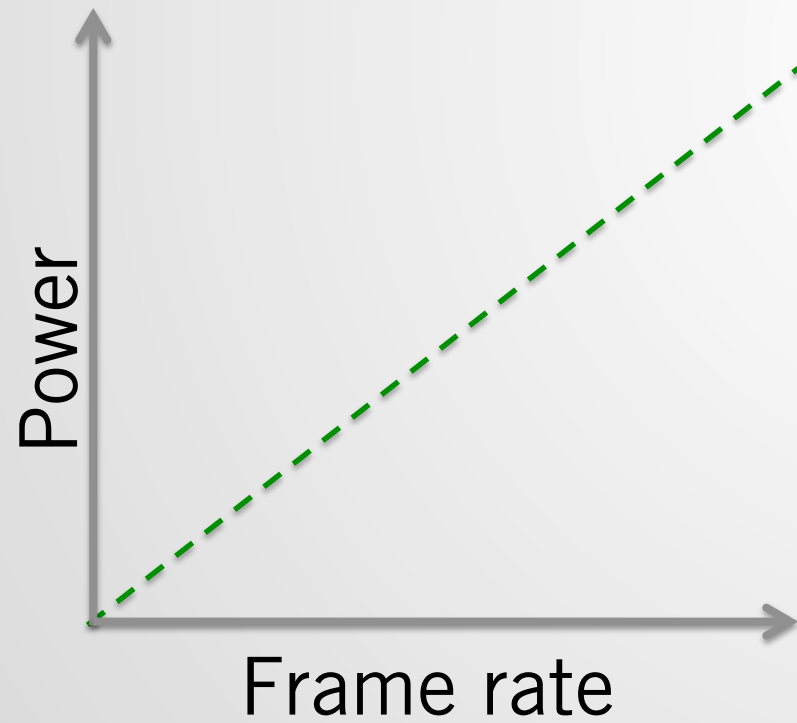


Image Sensor  
Goal < 25 mW

Image Sensor  
Reality > 250 mW



KEY IDEA: ENERGY  $\propto$  QUALITY



# ENERGY PROFILE OF AN IMAGE SENSOR

Goal: **< 25 mW**

1 MP, 15 fps  
**295 mW**

1 MP, 5 fps  
**250 mW**

0.3 MP, 15 fps  
**245 mW**

0.3 MP, 5 fps  
**232 mW**

Reality: **> 230 mW**



# ENERGY-EFFICIENT IMAGE SENSING

Image Sensor Characterization

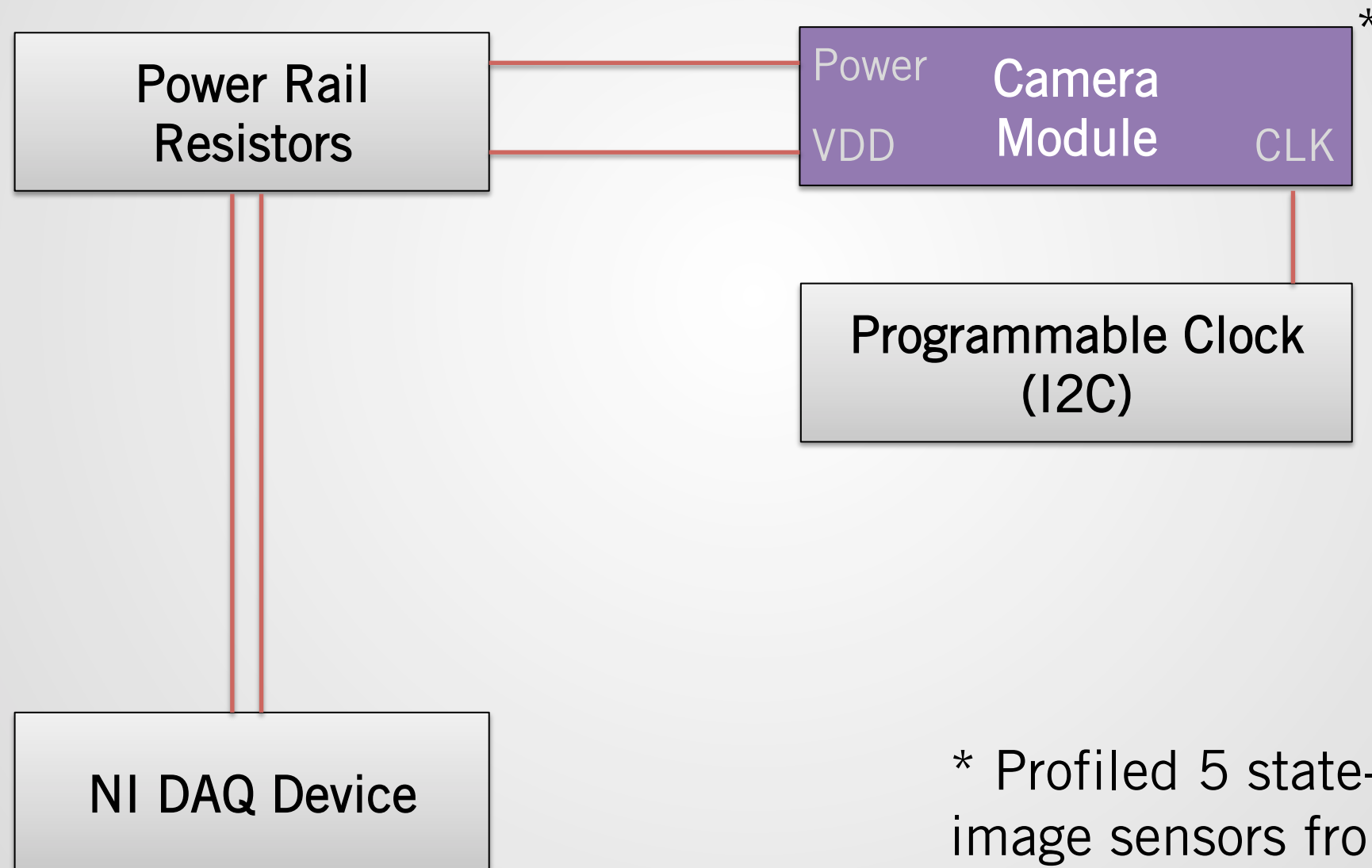
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Energy Reduction Techniques

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Energy vs. Vision Performance

# IMAGE SENSOR MEASUREMENT



\* Profiled 5 state-of-the-art image sensors from 2 manufacturers

# IMAGE SENSOR MEASUREMENT

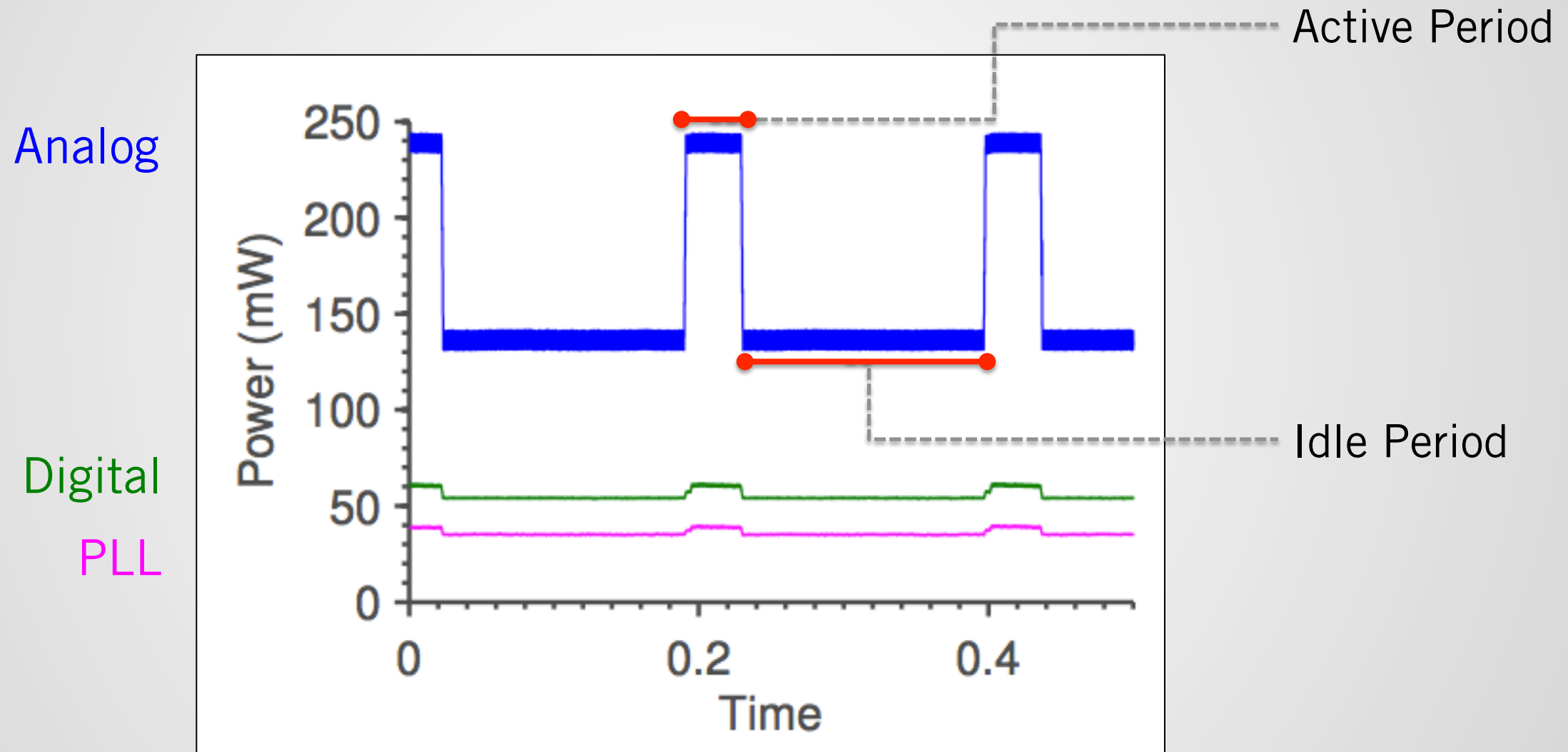
Power Rail  
Resistors

Camera  
Module

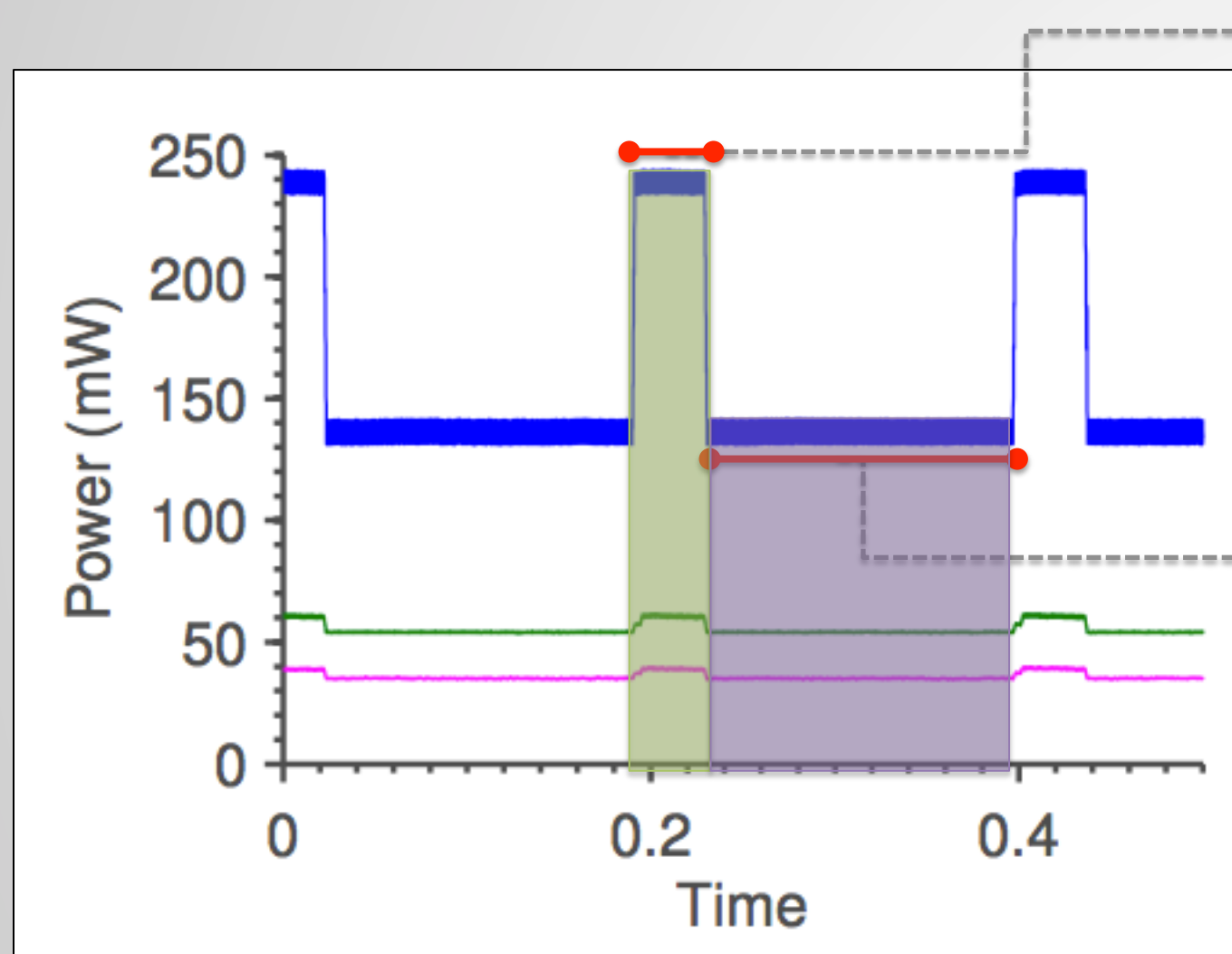
Programmable Clock  
(I2C)

NI DAQ Device

# IMAGE SENSOR WAVEFORMS



# IMAGE SENSOR WAVEFORMS



Active Period

$$T_{active} = \frac{N}{f}$$

Pixel Count  
divided by  
Clock Frequency

Idle Period

$$T_{idle} = \frac{1}{R} - T_{active}$$

Frame Time  
minus  
Active Time

$$E_{frame} = P_{active}T_{active} + P_{idle}T_{idle}$$

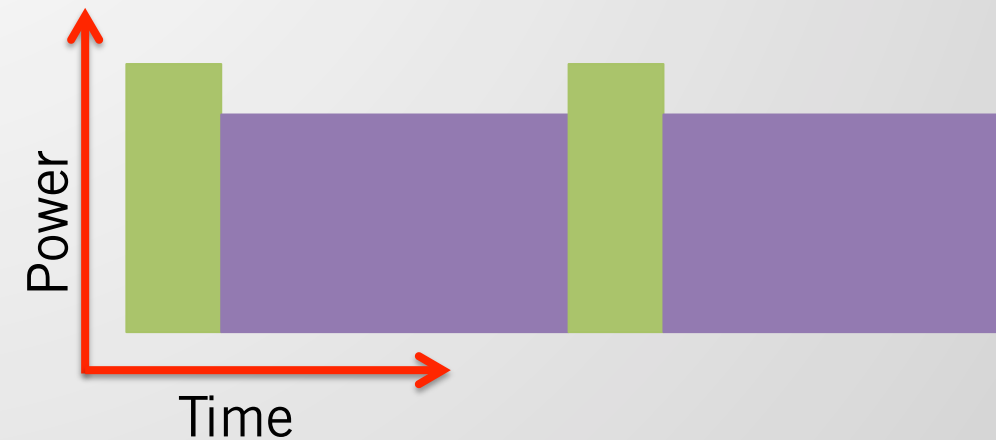
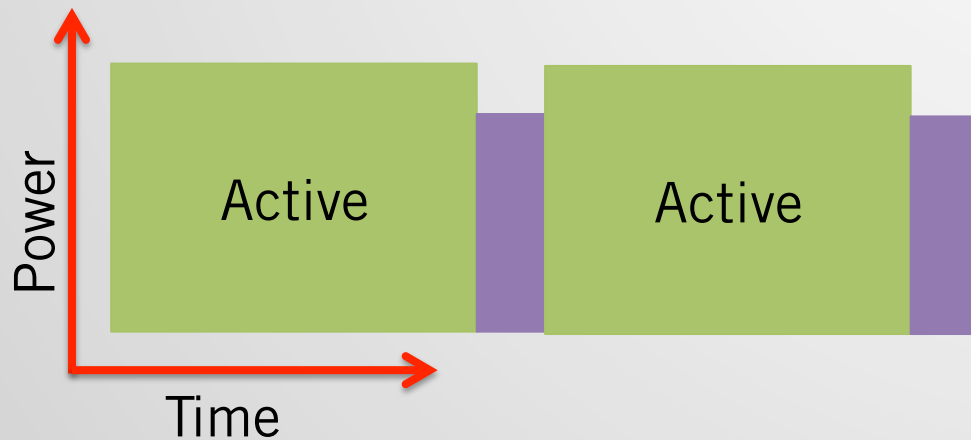
# IMAGE SENSOR PIXEL COUNT (N)



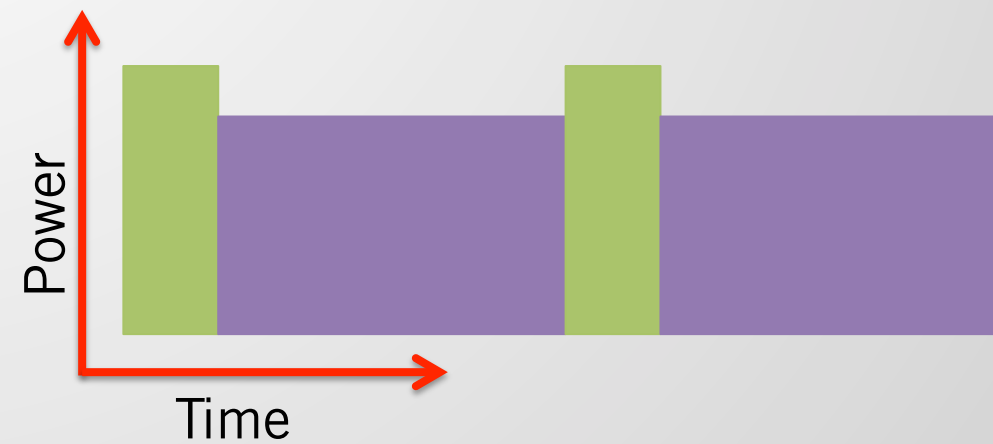
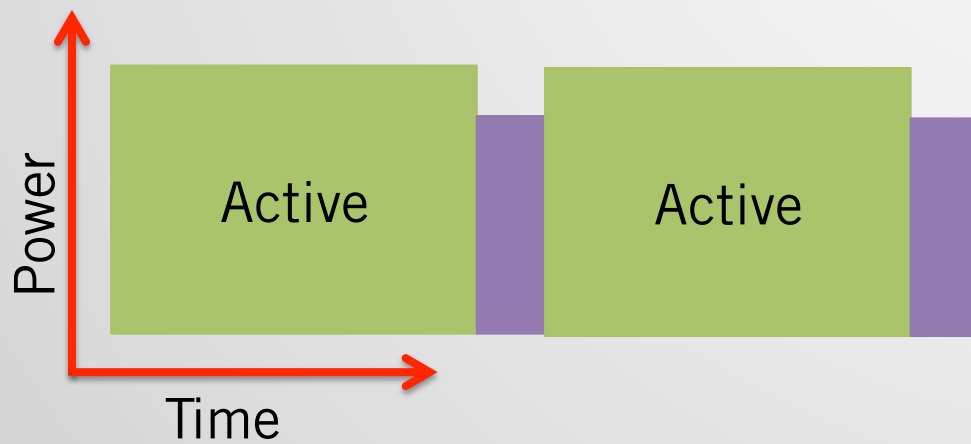
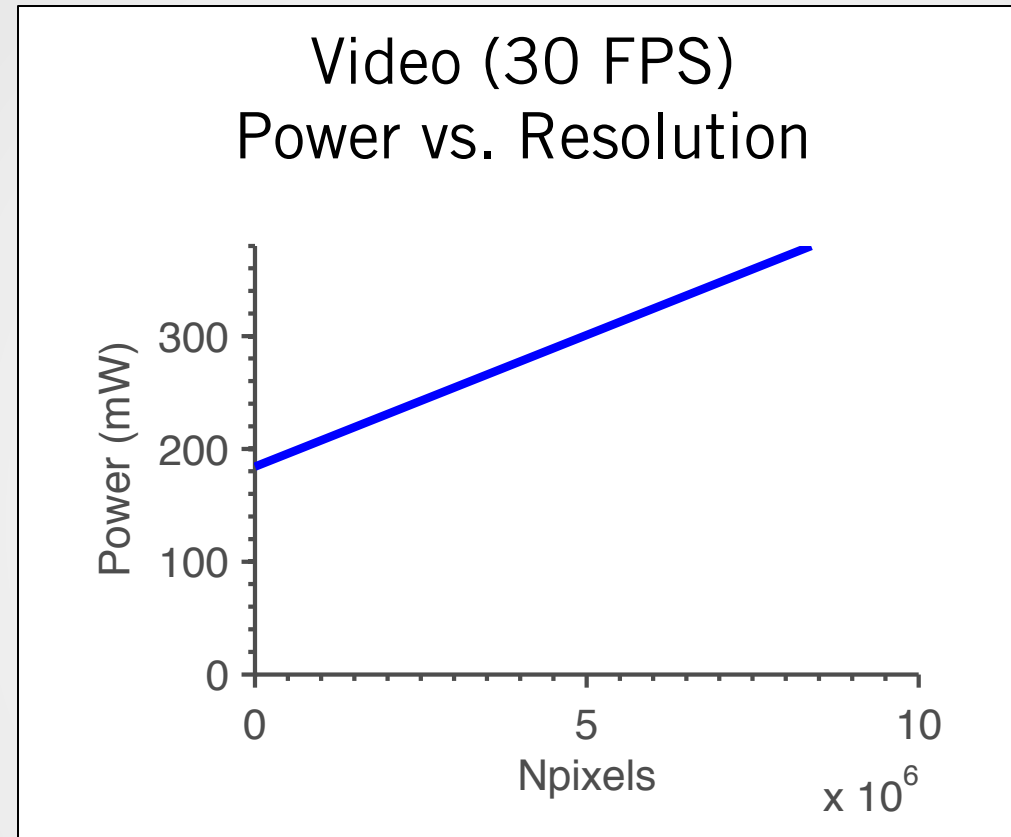
Scaled Resolution  
(Pixel Skipping)



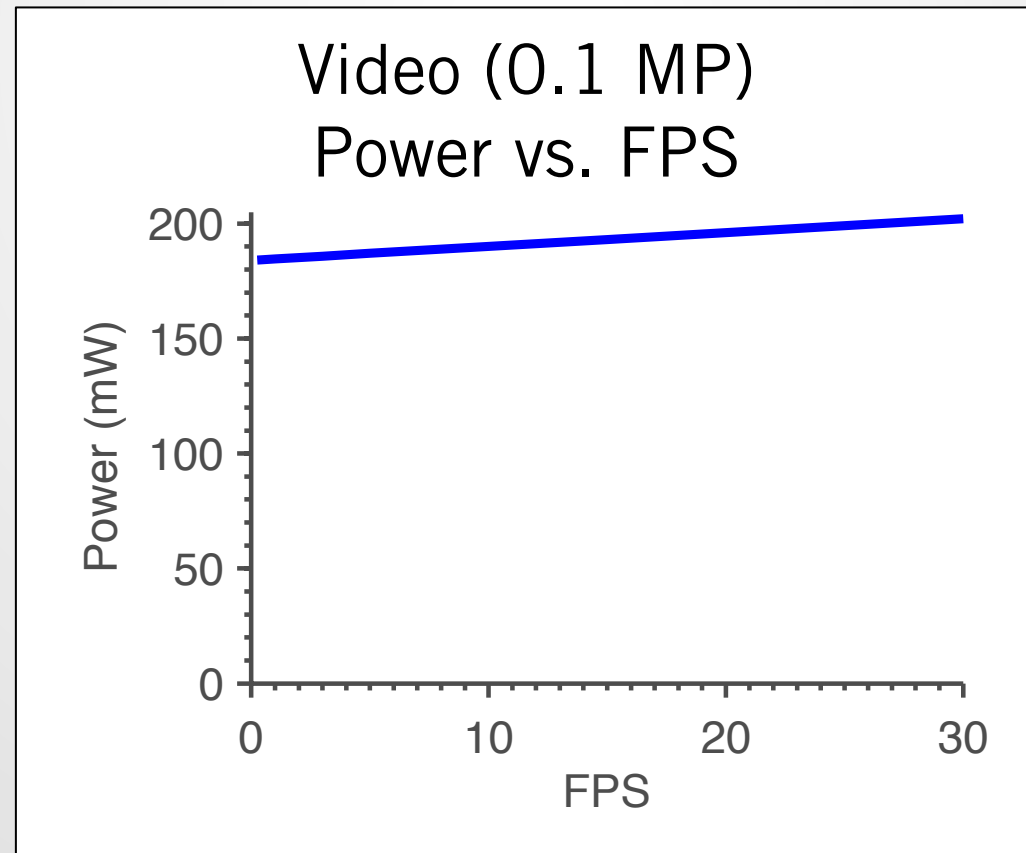
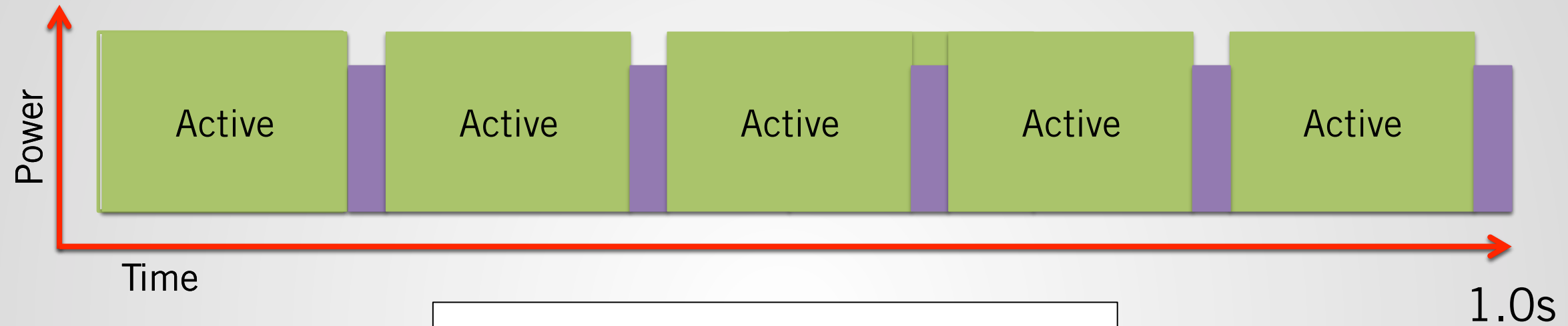
Region-of-Interest  
(Windowing)



# IMAGE SENSOR PIXEL COUNT (N)



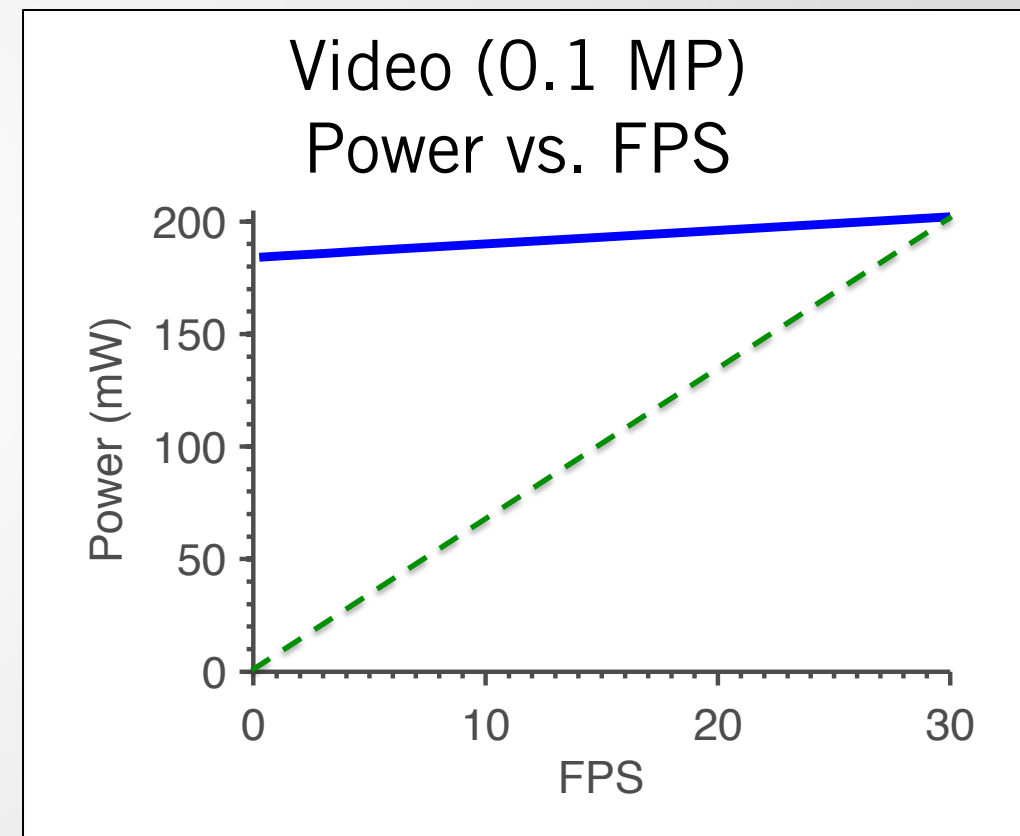
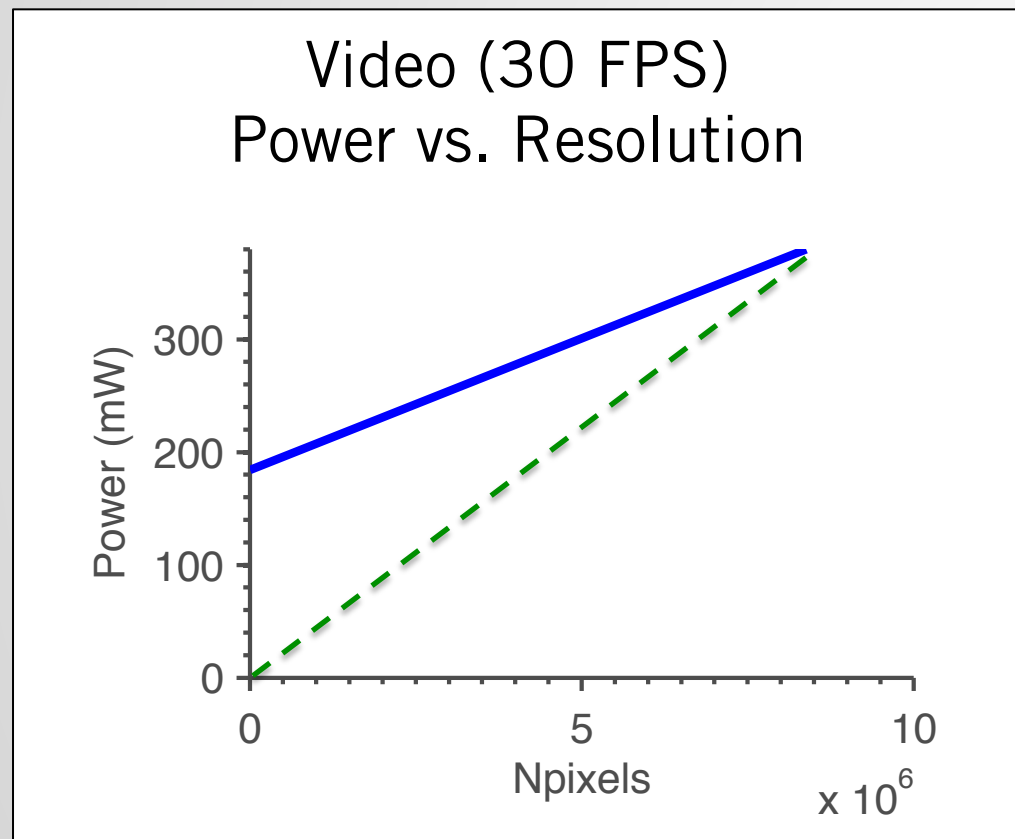
# IMAGE SENSOR FRAME RATE (R)





# CHARACTERIZATION CONCLUSION:

## **NO** ENERGY PROPORTIONALITY



# ENERGY-EFFICIENT IMAGE SENSING

Image Sensor Characterization

---

Energy Reduction Techniques

---

Energy vs. Vision Performance

# TECHNIQUE #1: AGGRESSIVE STANDBY

$$T_{idle} = \frac{1}{R} - T_{active}$$



$$T_{idle} = T_{exposure}$$

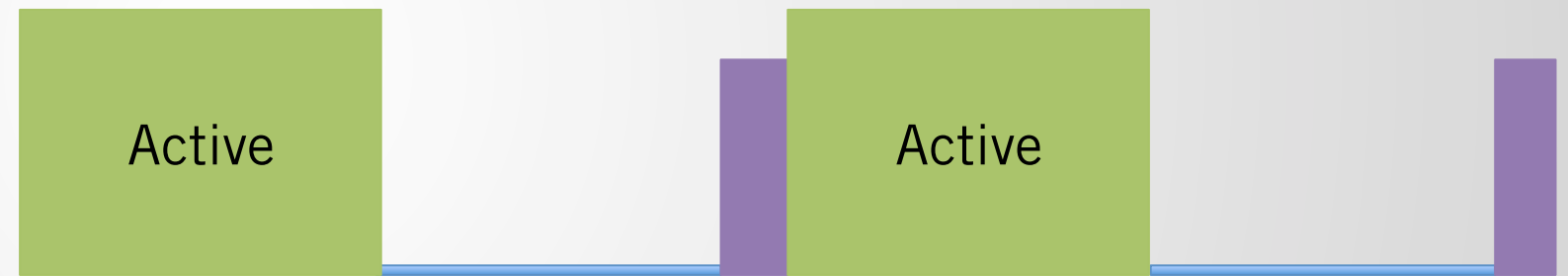


# CAVEAT TO AGGRESSIVE STANDBY

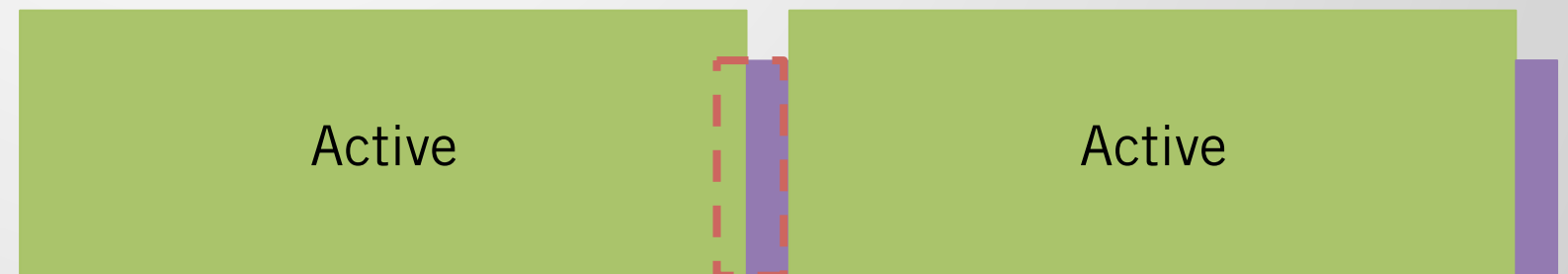
$$T_{idle} = \frac{1}{R} - T_{active}$$



$$T_{idle} = T_{exposure}$$



*This won't work for long active periods, i.e., high resolution, high frame rate.*

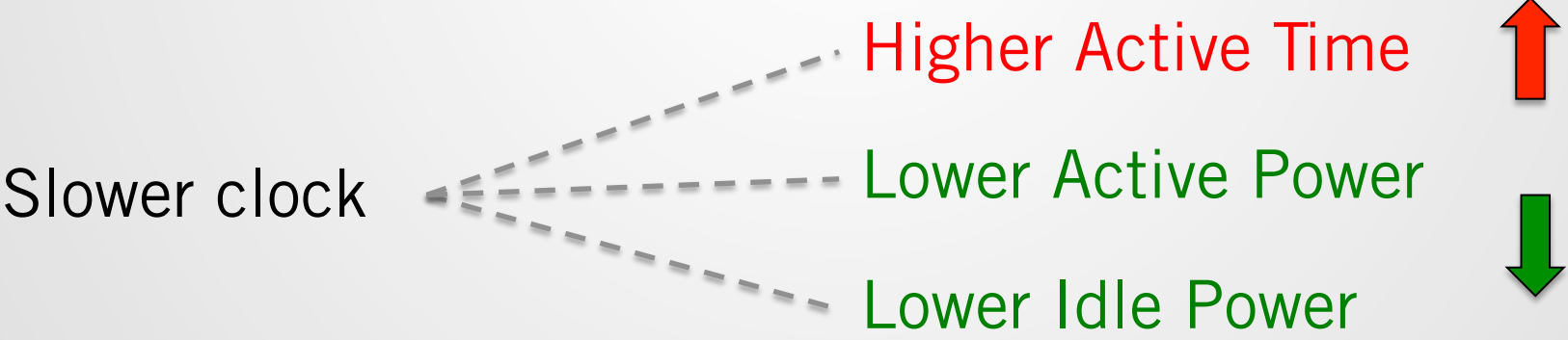
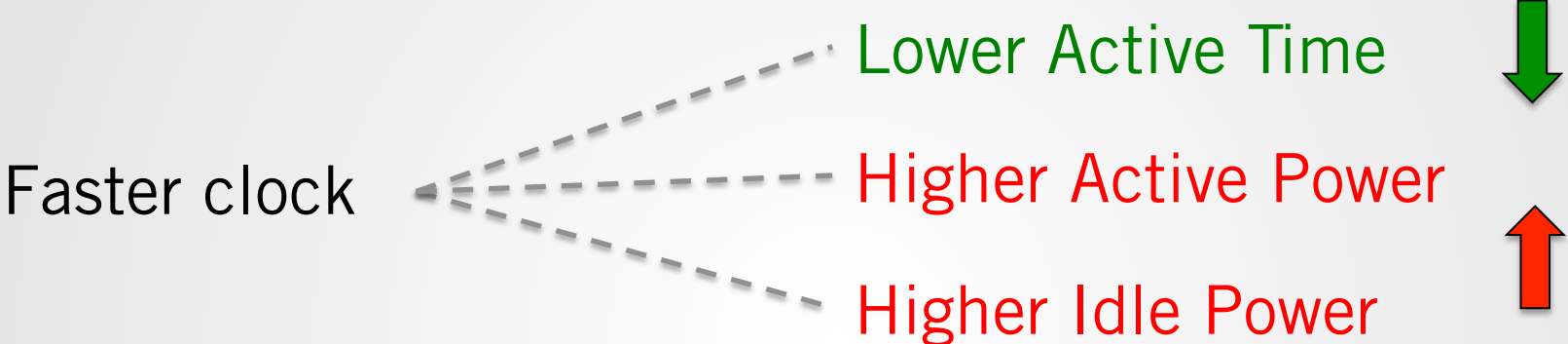


Not enough exposure time

# TECHNIQUE #2: CLOCK SCALING (f)

One pixel per clock period

# TECHNIQUE #2: CLOCK SCALING (f)

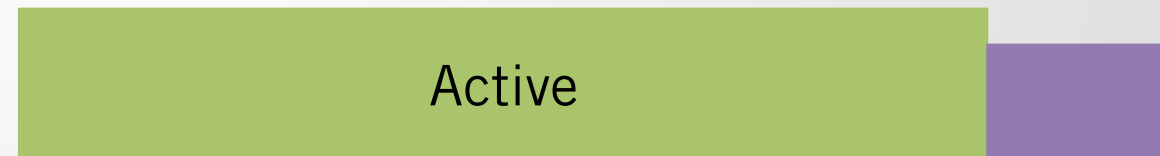


# TECHNIQUE #2: CLOCK SCALING (f)

Low Pixel Count  
Low Frame Rate



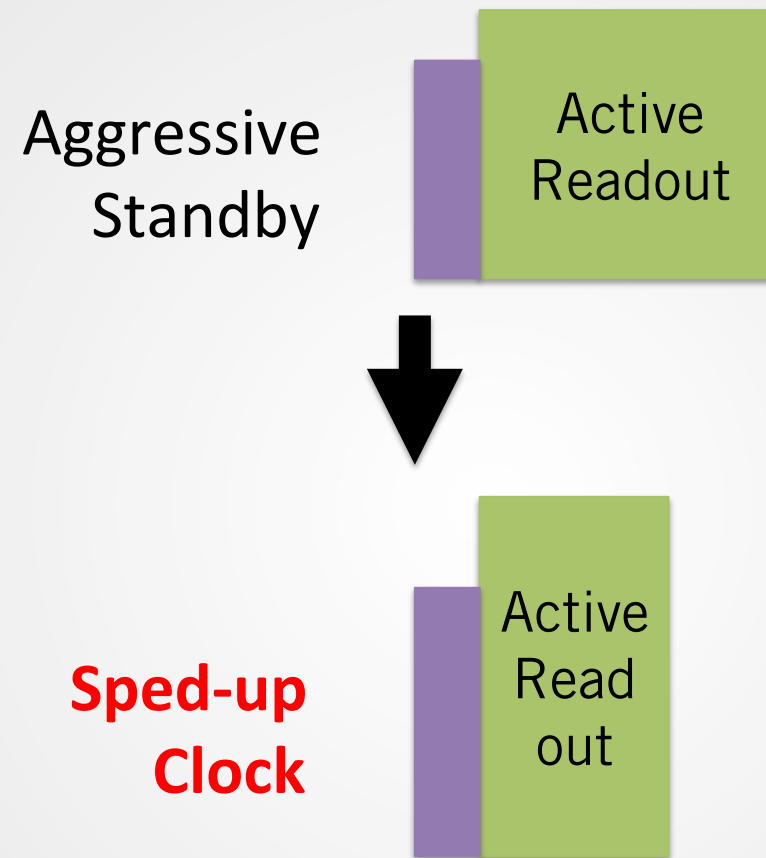
**Slowed Clock**



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*Optimal clock frequency depends on  
Pixel Count & Frame Rate*

# AGGRESSIVE STANDBY + CLOCK OPTIMIZATION



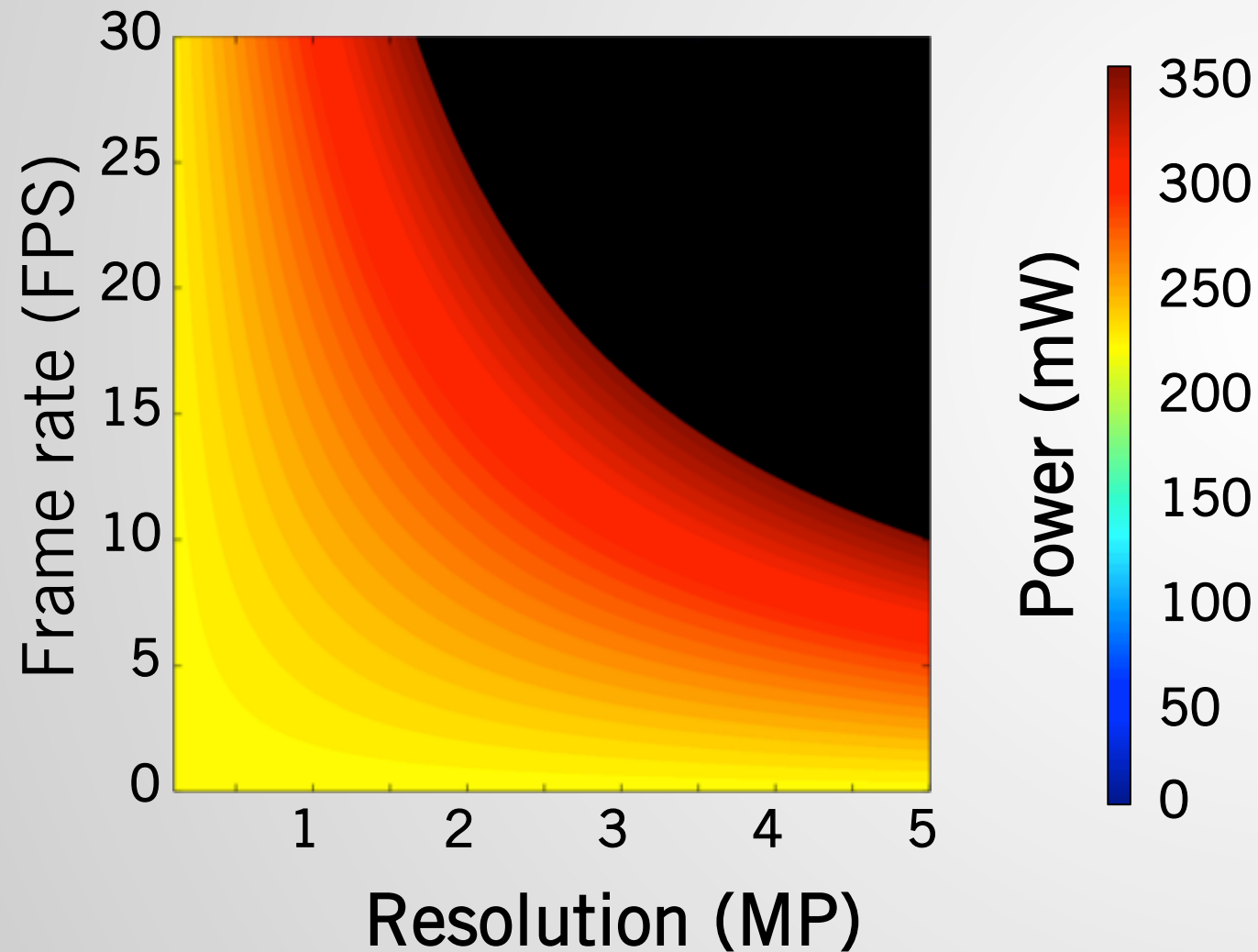
---

*Optimal clock frequency depends on  
Pixel Count & ~~Frame Rate~~  
Exposure Time*

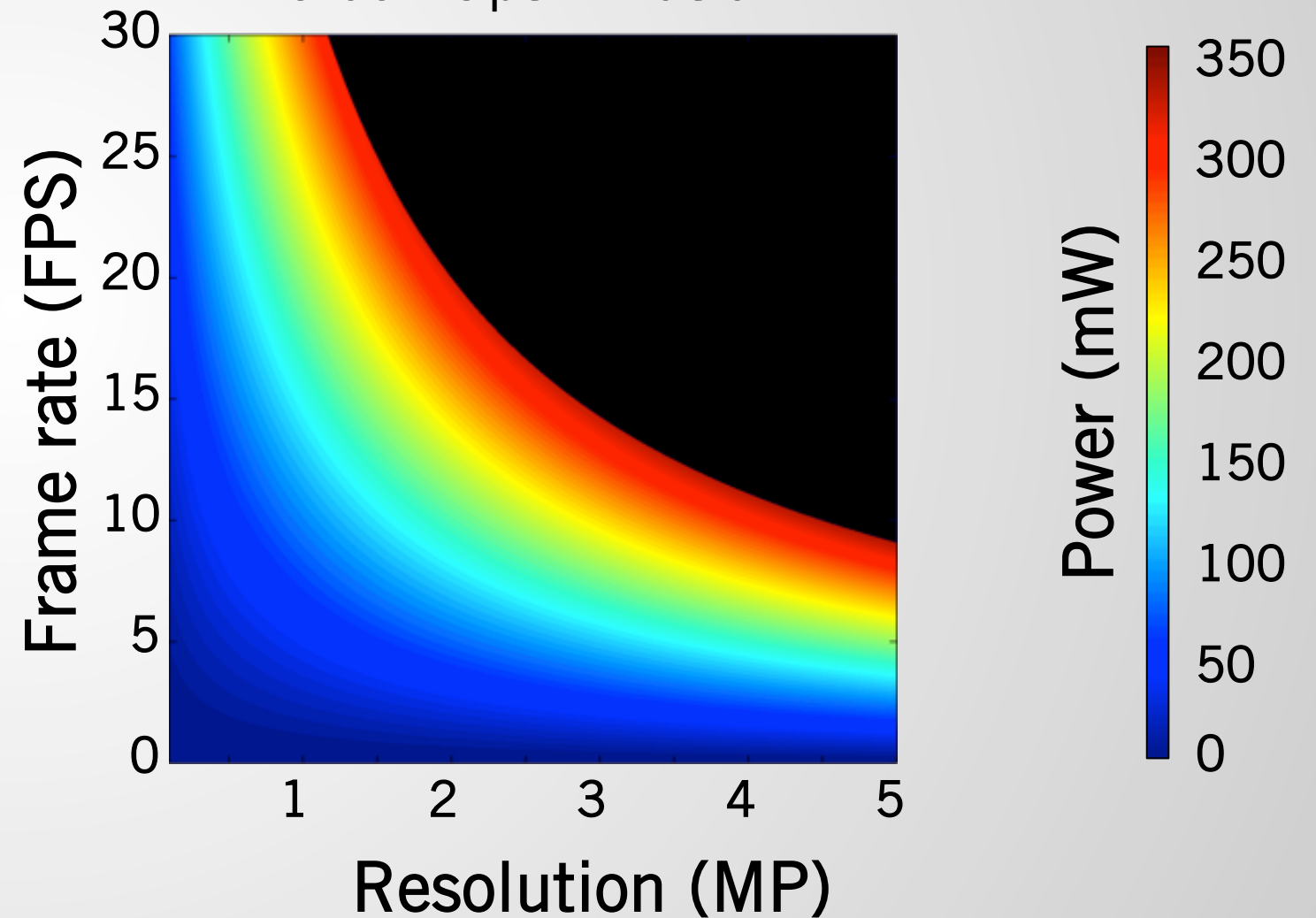


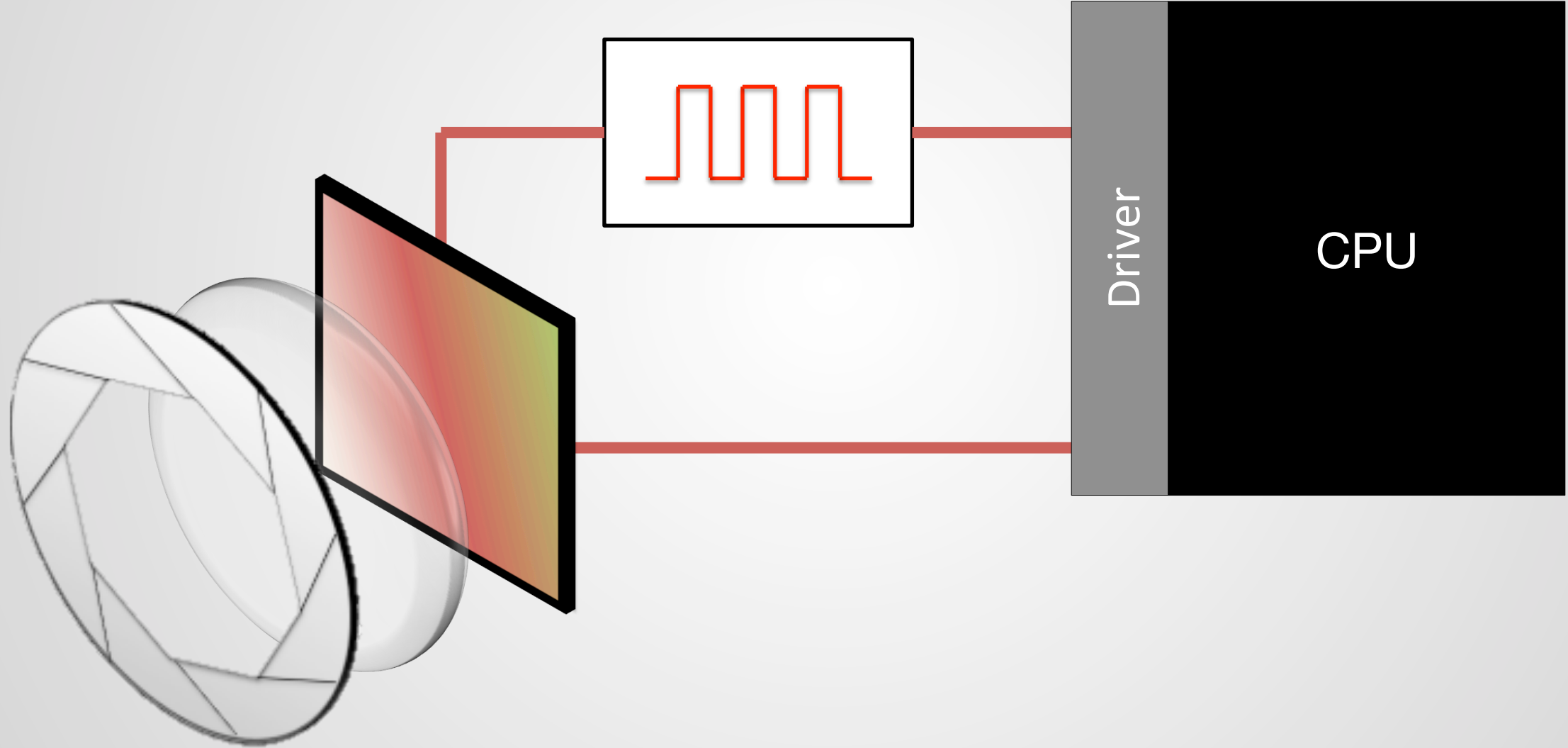
# ENERGY $\propto$ QUALITY

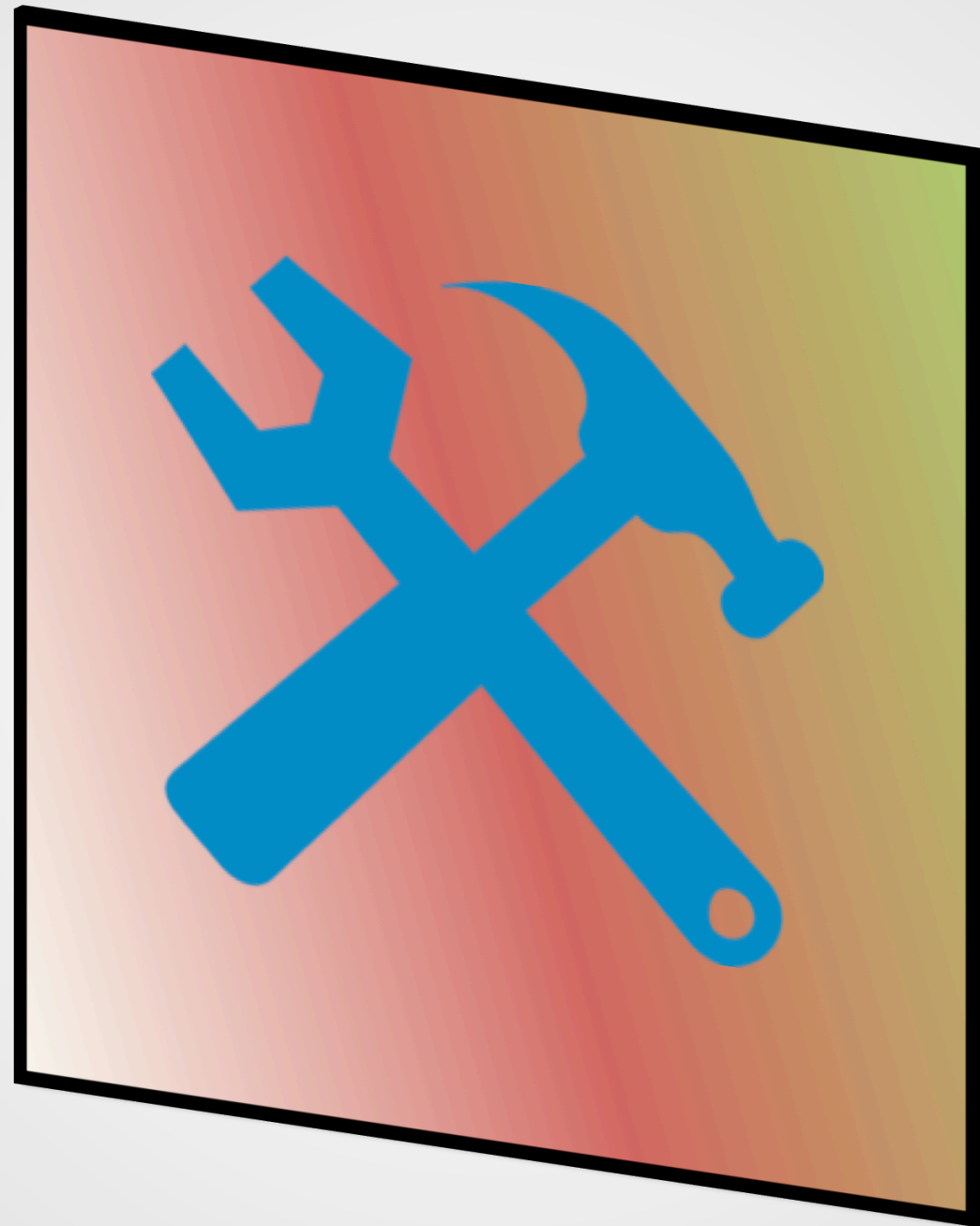
Unoptimized



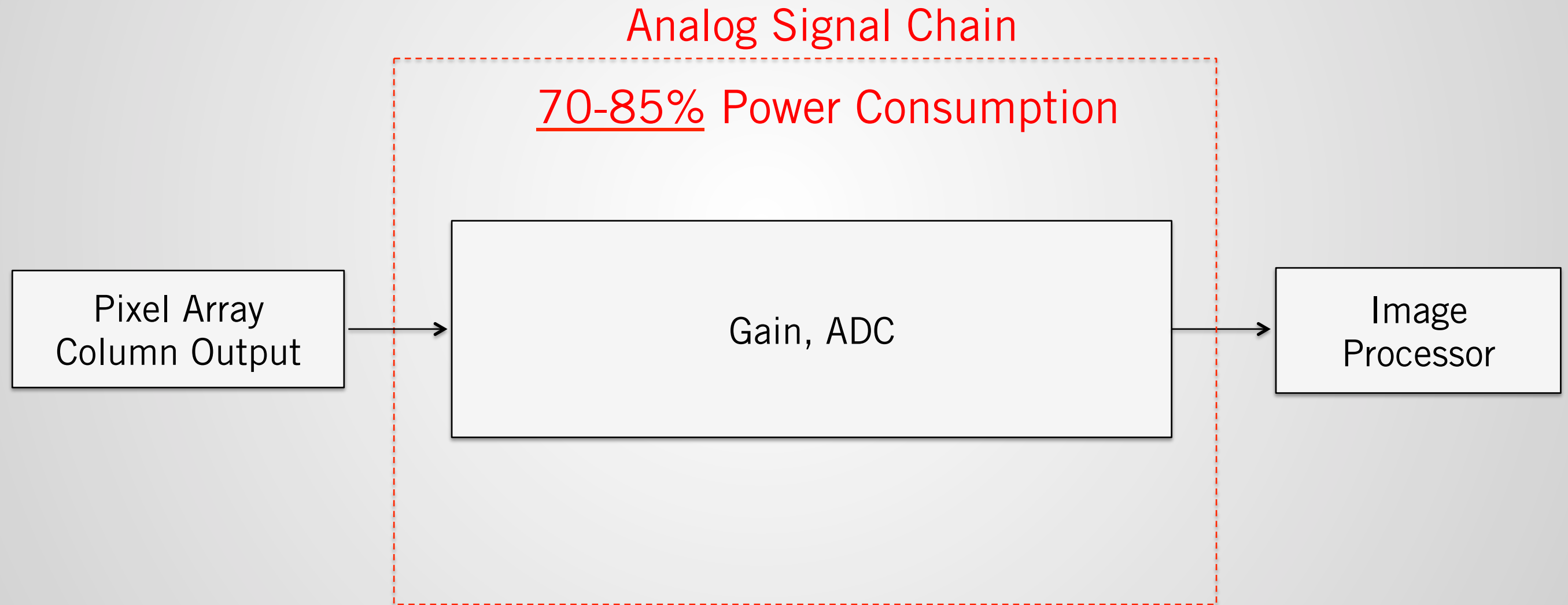
Aggressive Standby & Clock Optimization





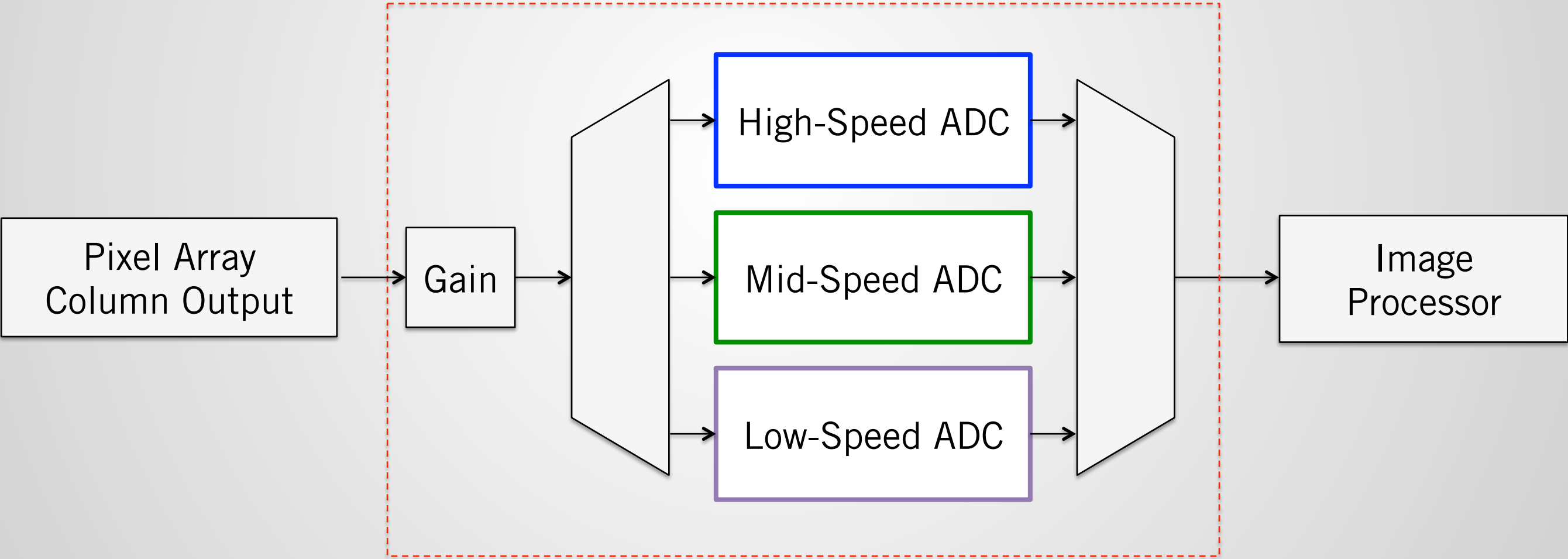


# CURRENT IMAGE SENSOR DESIGN

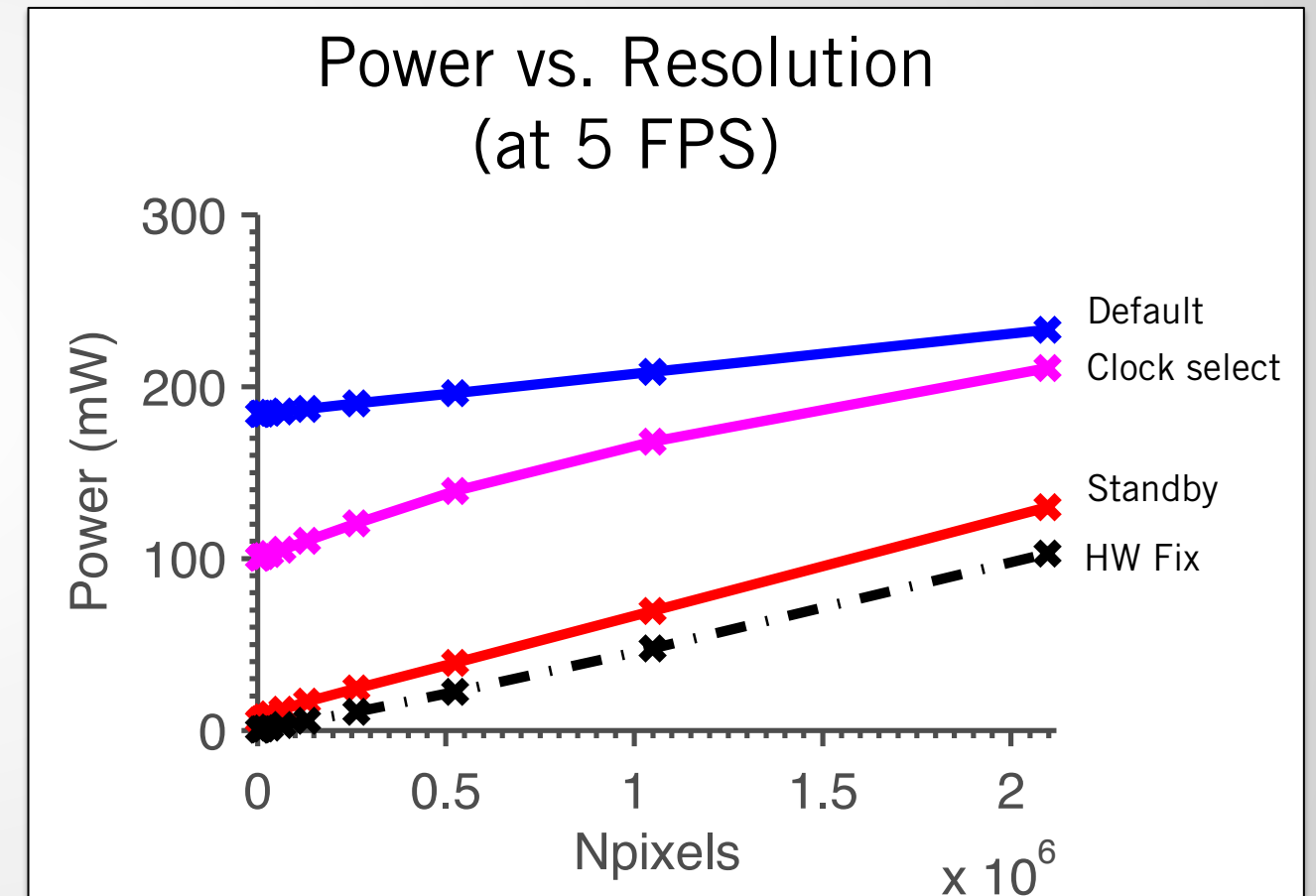
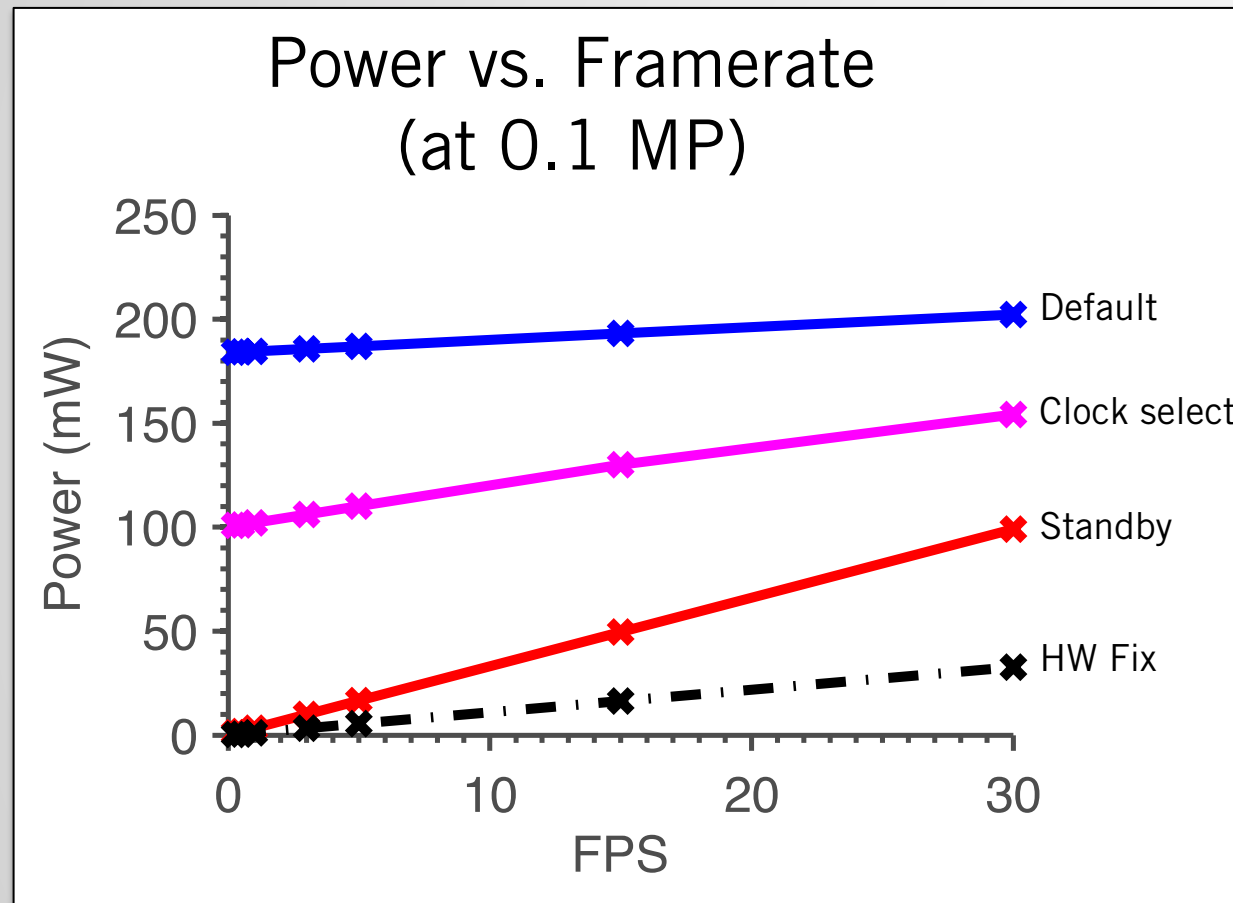


# HETEROGENEOUS SENSOR DESIGN

## Heterogeneous Analog Signal Chain



# ENERGY $\propto$ QUALITY



# ENERGY-EFFICIENT IMAGE SENSING

Image Sensor Characterization

---

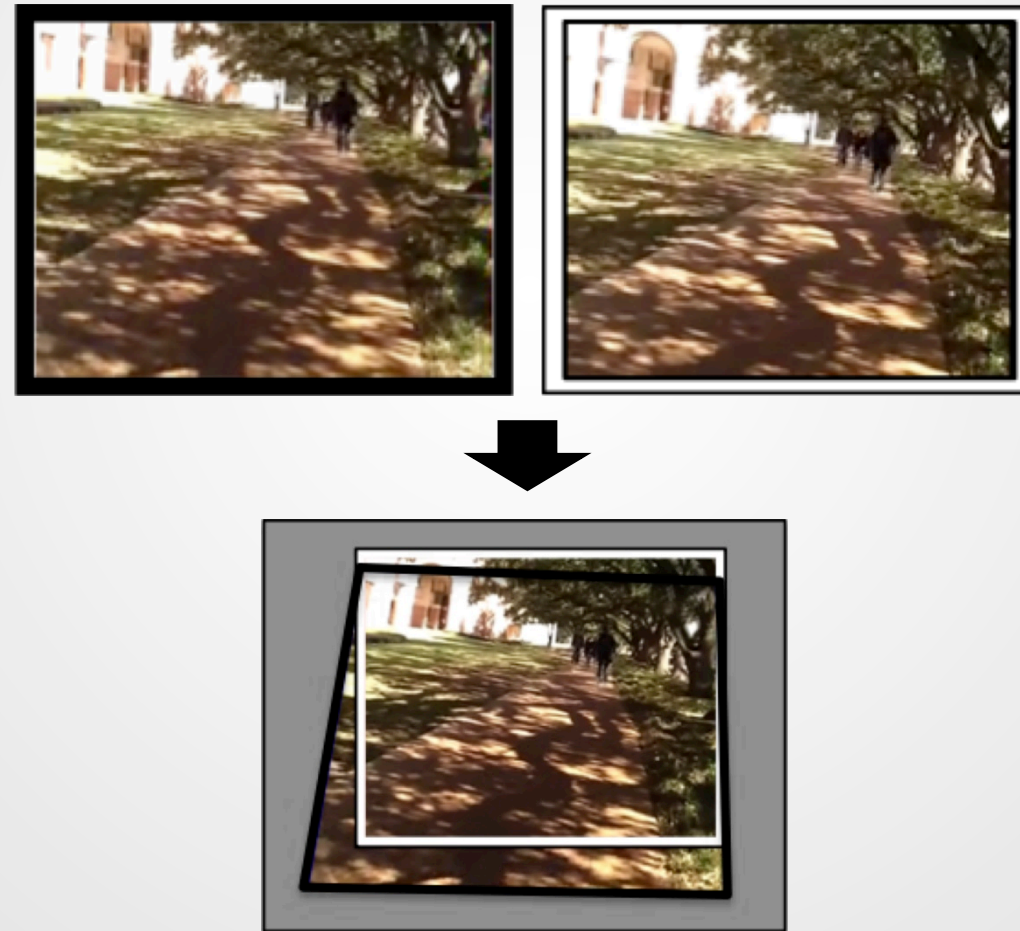
Energy Reduction Techniques

---

Energy vs. Vision Performance

# ENERGY vs. VISION: VISION TASK

## IMAGE REGISTRATION





# ENERGY vs. VISION: PERFORMANCE

	Image Registration Success	Power Reduction with software assist	Estimated Power Reduction with hardware assist
Full VGA Resolution <i>0.1 MP, 30 FPS</i>	99.9%	51%	84%
Frame Rate Reduction <i>0.1 MP, 3 FPS</i>	<b>95.7%</b>	<b>95%</b>	98%
30% Window <i>0.06 MP, 30 FPS</i>	96.5%	63%	91%
Subsampled by 2 <i>0.3 MP, 30 FPS</i>	91.8%	71%	94%

*Typical  
Average Power*

**185 mW**



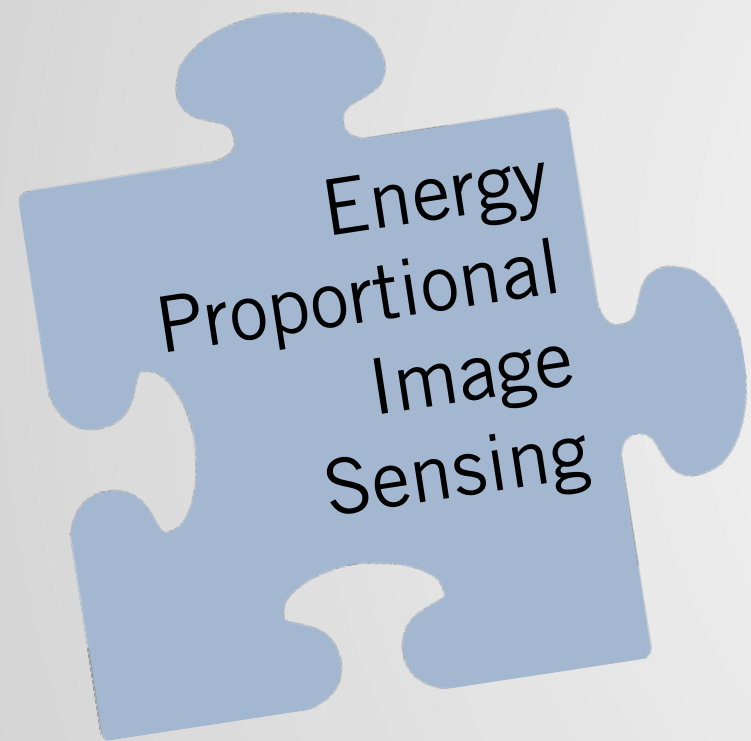
*With aggr. standby  
& optimal clock*

**10 mW**

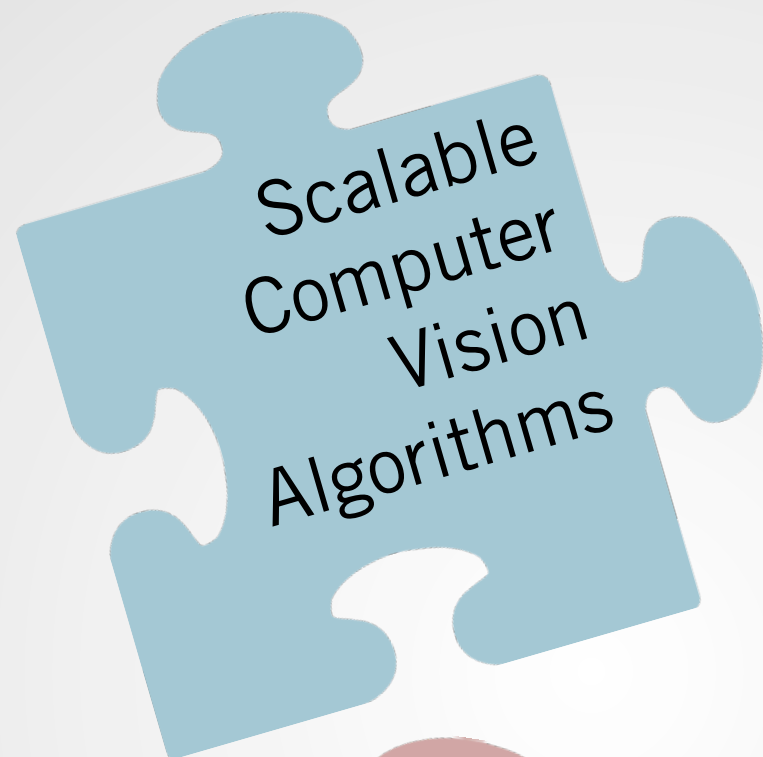


*With heterogeneous  
analog signal chain*

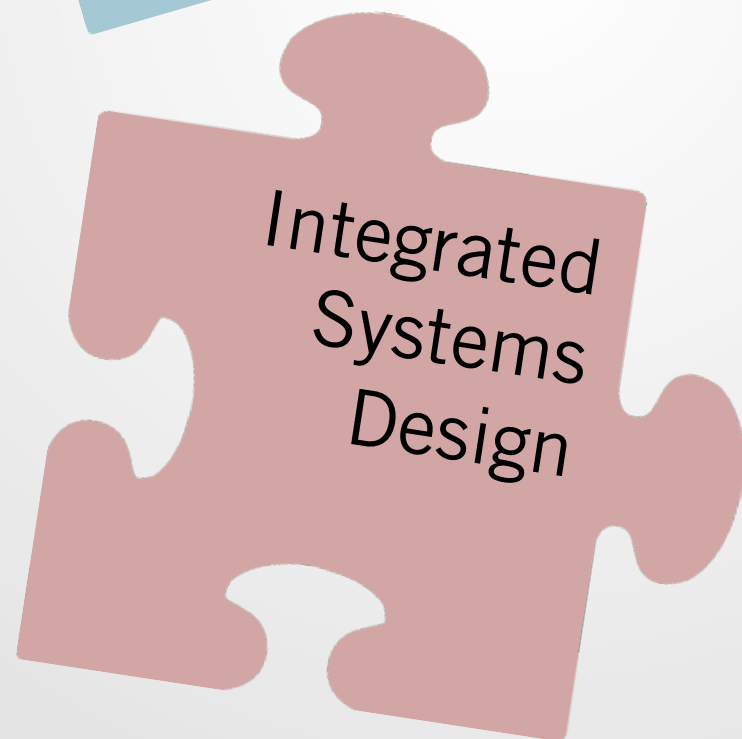
**3 mW**



Energy  
Proportional  
Image  
Sensing



Scalable  
Computer  
Vision  
Algorithms



Integrated  
Systems  
Design



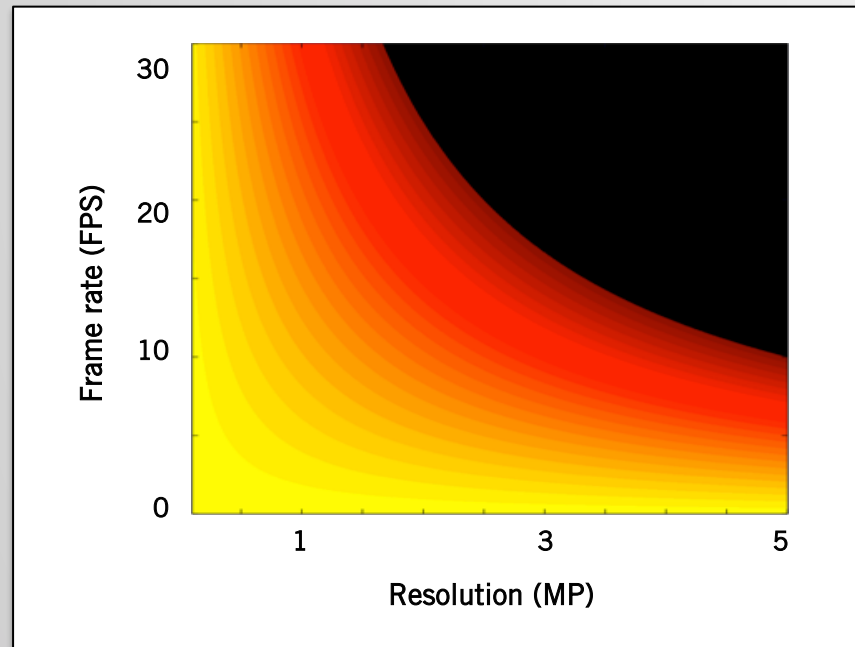
Developer  
Support



**Continuous  
Mobile Vision**

# ENERGY-PROPORTIONAL IMAGE SENSING FOR CONTINUOUS MOBILE VISION

*Image sensors are  
not energy-proportional...*



*...but we can make them  
energy-proportional...*

Aggressive Standby  
Clock Optimization  
Sensor Modifications

*... and this is just the  
beginning.*

