

# LARGE-SCALE INTRUSION DETECTION WITH LOW-COST MULTI-CAMERA WIRELESS IMAGE SENSORS

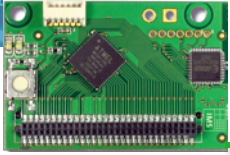
C. PHAM (UNIV. PAU, FRANCE)

IEEE WIMOB 2015  
ABOU DHABI, UAE  
OCTOBER 20TH, 2015



PROF. CONGDUC PHAM  
[HTTP://WWW.UNIV-PAU.FR/~CPHAM](http://www.univ-pau.fr/~cpham)  
UNIVERSITÉ DE PAU, FRANCE





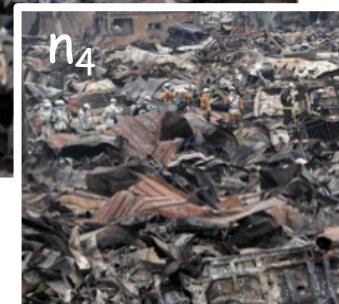
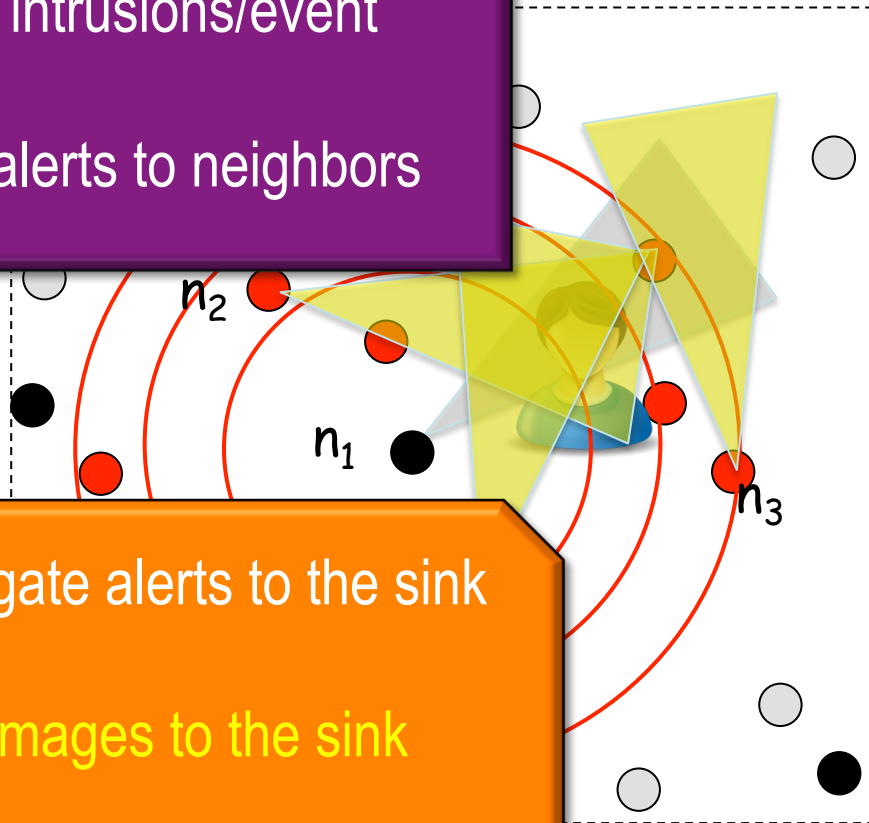
# IMAGE SENSORS FOR SURVEILLANCE

Periodically capture to detect intrusions/event

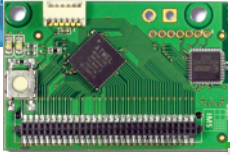
Send alerts to neighbors

Propagate alerts to the sink

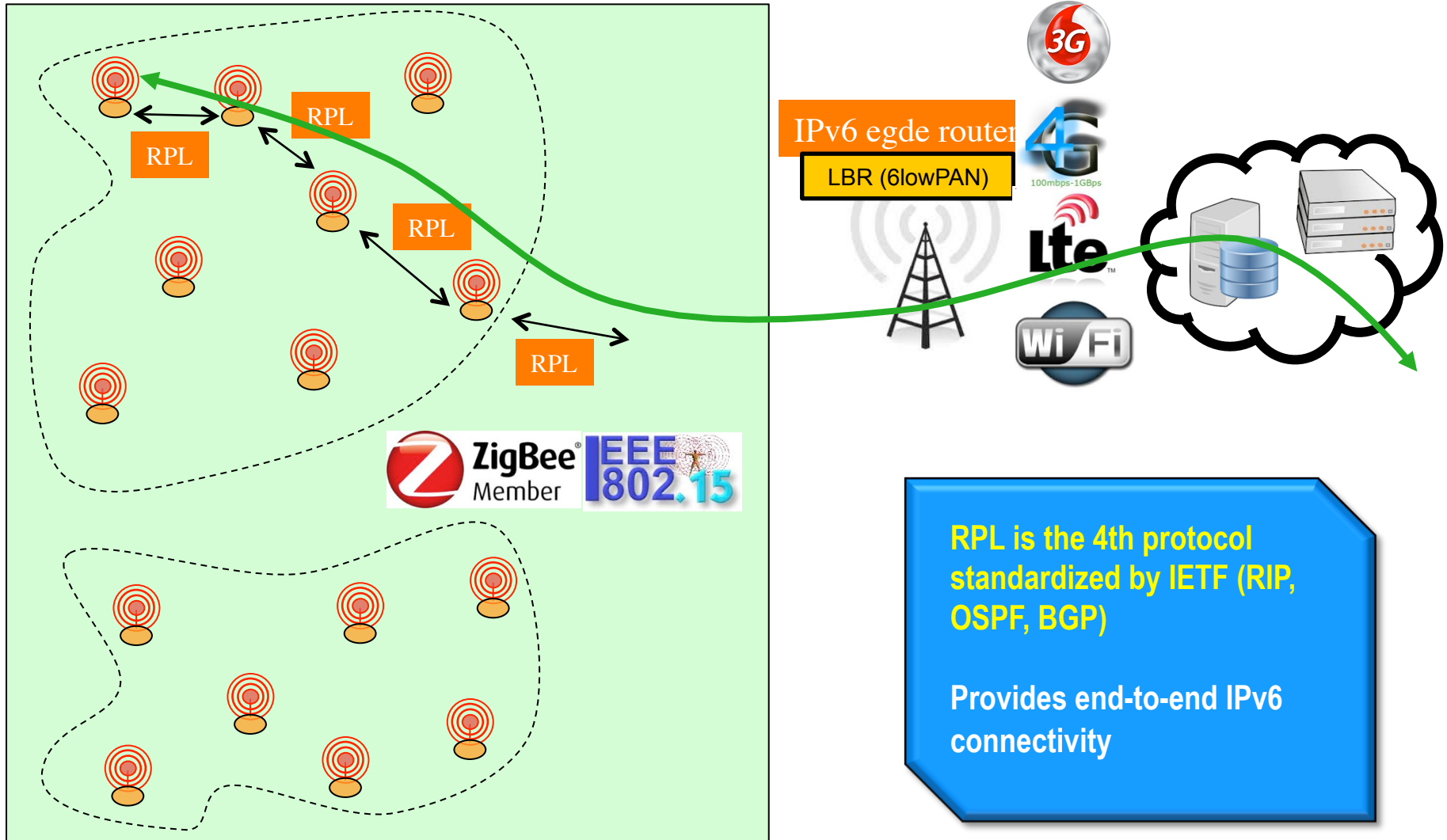
Send images to the sink

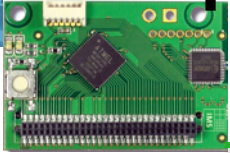


● alerted node

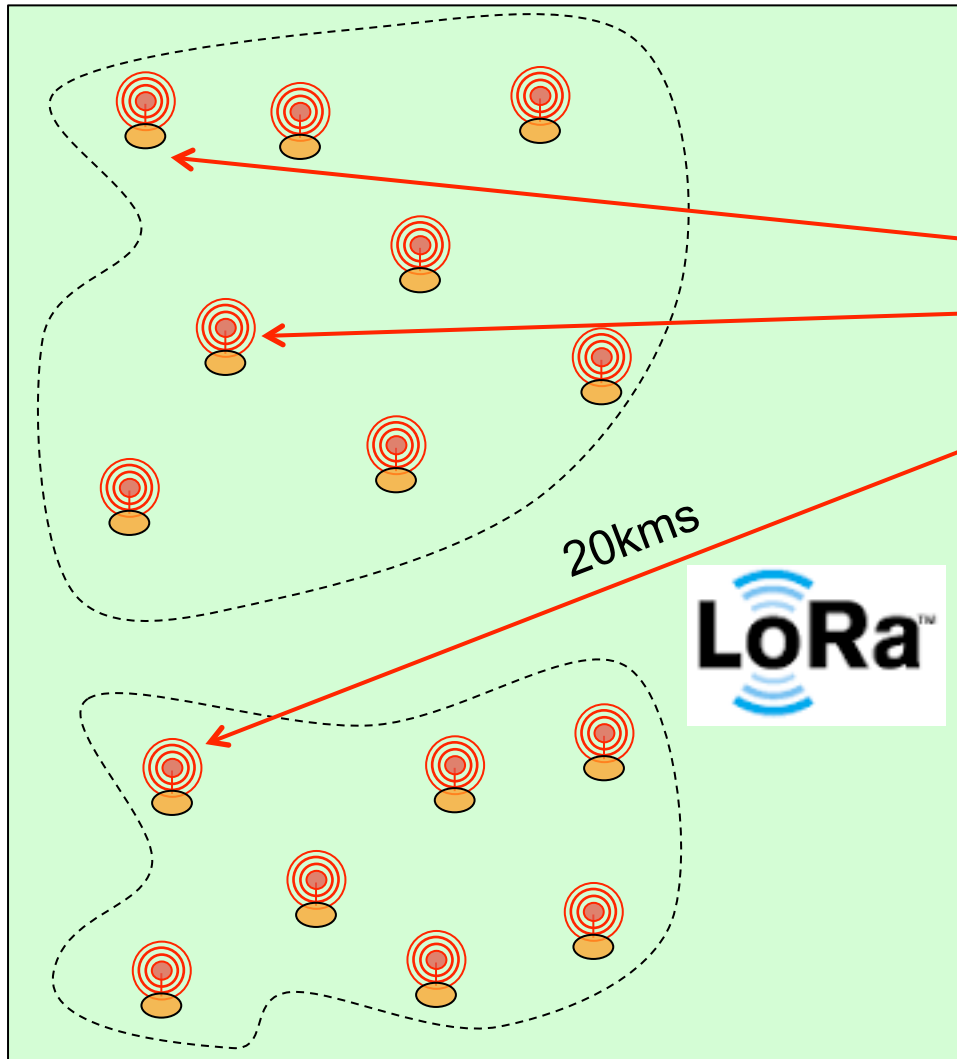


# MULTI-HOP TO SINK

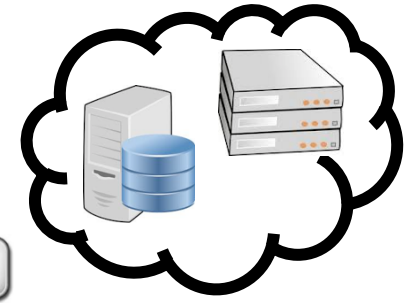




# 1-HOP TO SINK WITH LONG-RANGE TECHNOLOGY



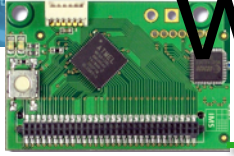
IPv6 edge router  
LBR (6lowPAN)



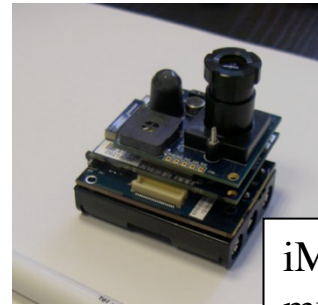
Long-range technologies (Semtech's LoRa™ for instance) reduces the cost of deployment

6LowPan can be used on top of LoRa

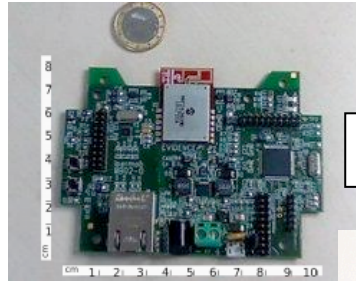




# WIRELESS IMAGE SENSORS



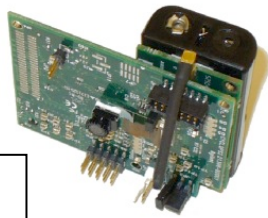
iMote2 with IMB400 multimedia board



Seedeye

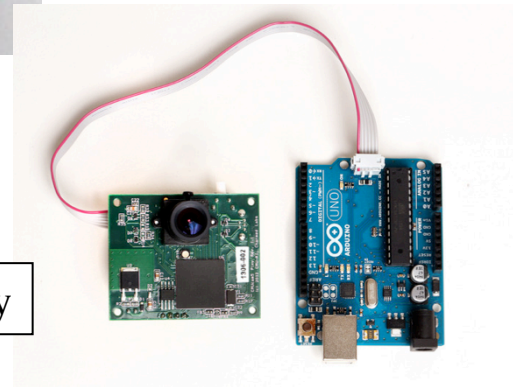
Cyclops camera

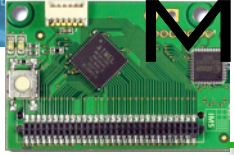
MicaZ mote



Cyclops

Pixy





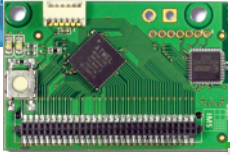
# MOTIVATIONS & OBJECTIVES

---

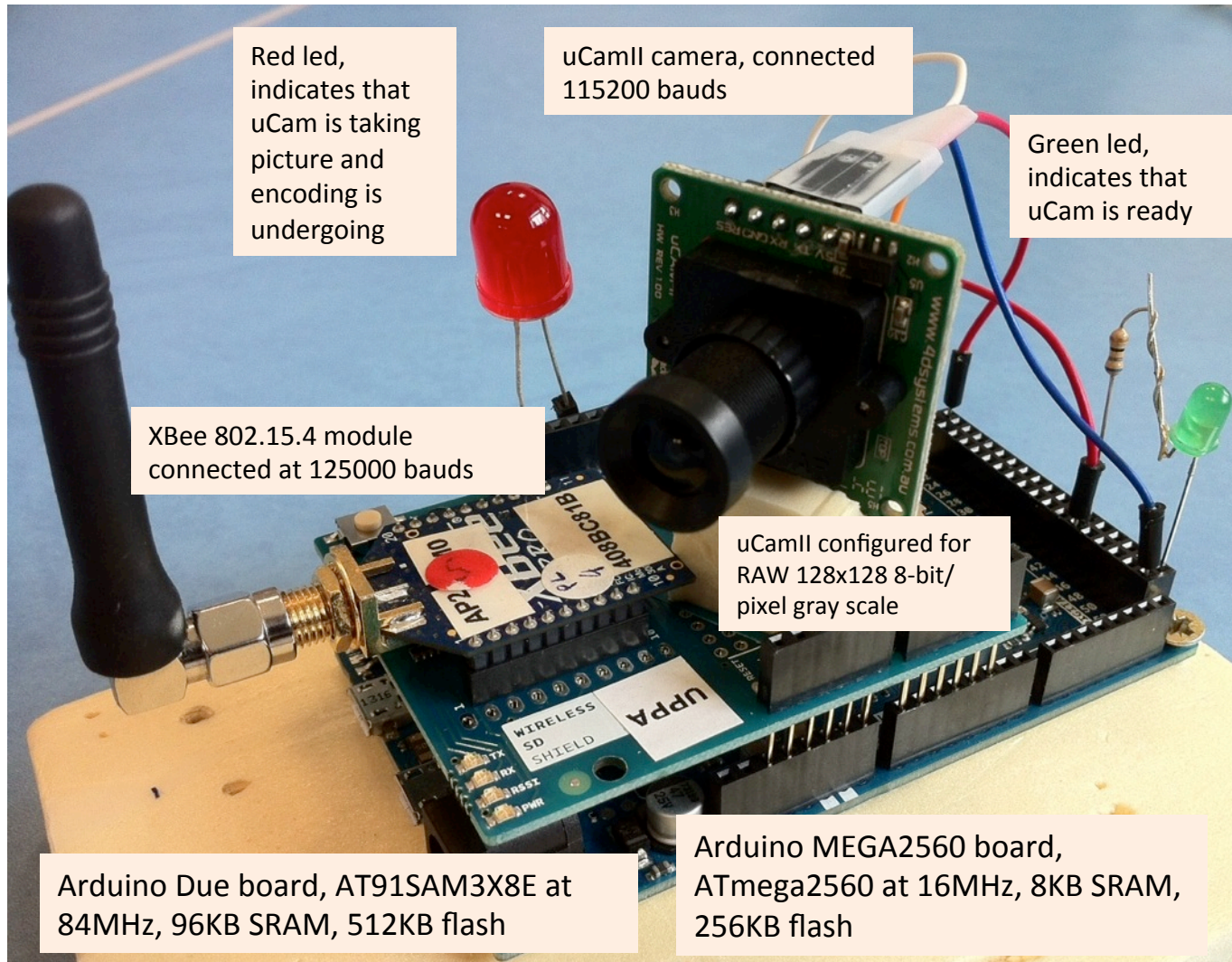
- ❑ Off-the-shelf solution for maximum reproducibility
  - ❑ Arduino-based solution for maximum flexibility and simplicity in programming and design;
  - ❑ Simple, affordable external camera to get raw image data, no soldering
- ❑ Fast and efficient compression scheme with the host  $\mu\text{C}$  (no additional nor dedicated  $\mu\text{C}$ )
  - ❑ Small size image
  - ❑ packet loss-tolerant bit stream
- ❑ Out of the box-surveillance
  - ❑ Run on battery
  - ❑ Image change detection



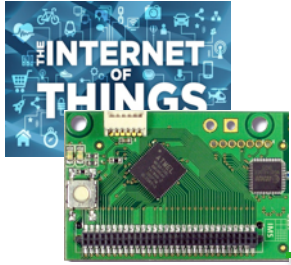
C. Pham, Deploying a Pool of Long-Range Wireless Image Sensor with Shared Activity Time. WiMob 2015.



# OUR LOW-COST IMAGE SENSOR







# VERY LOW-MEMORY PLATFORMS

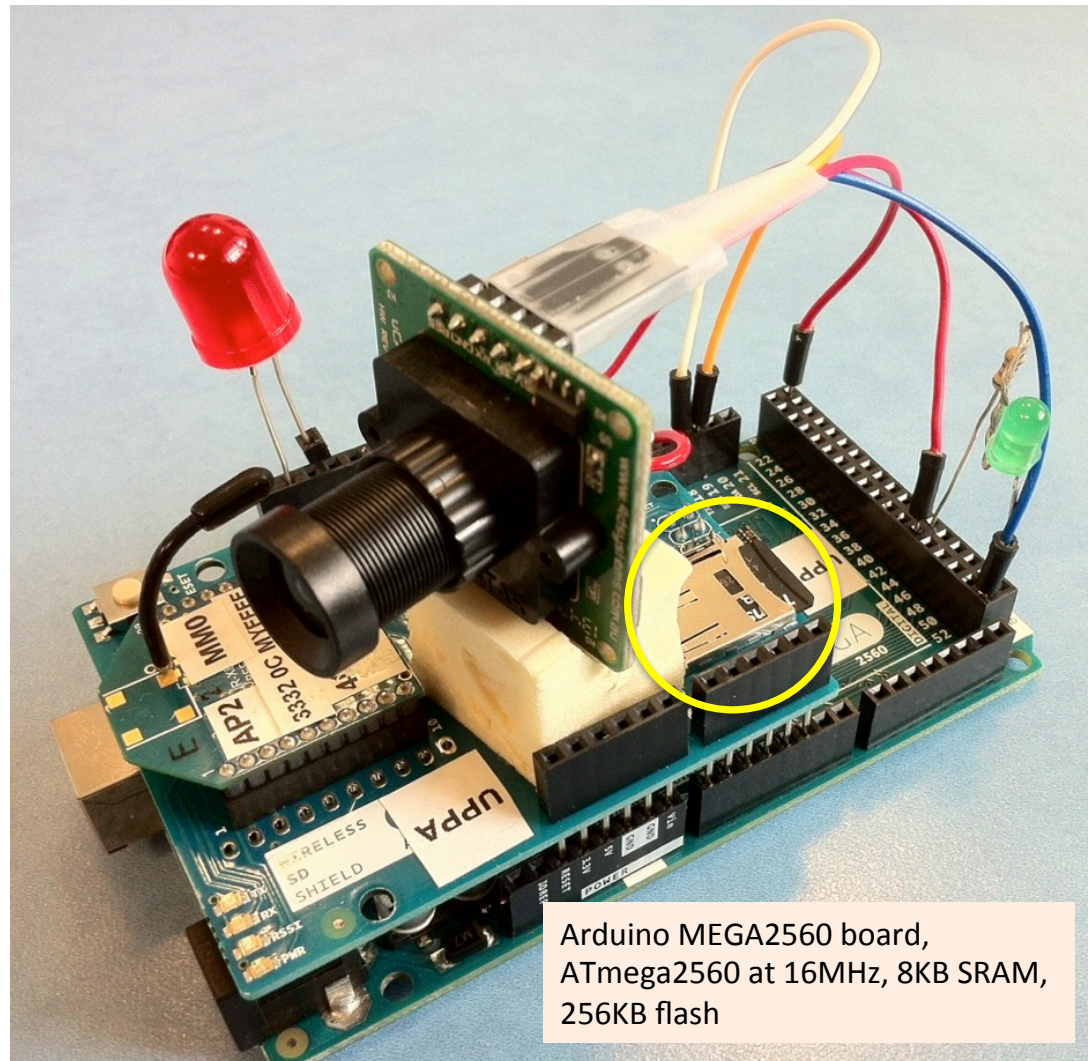
Arduino MEGA2560 at 16MHz, 8KB SRAM

Only 2KB SRAM available at runtime

Modified encoding algorithm to avoid having all the raw image in SRAM: encoding, packetization and transmission in a row per image packet

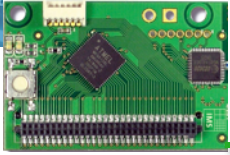
Reference image and current raw stored in an SD card

Encoding and packetization will read image blocks from SD card

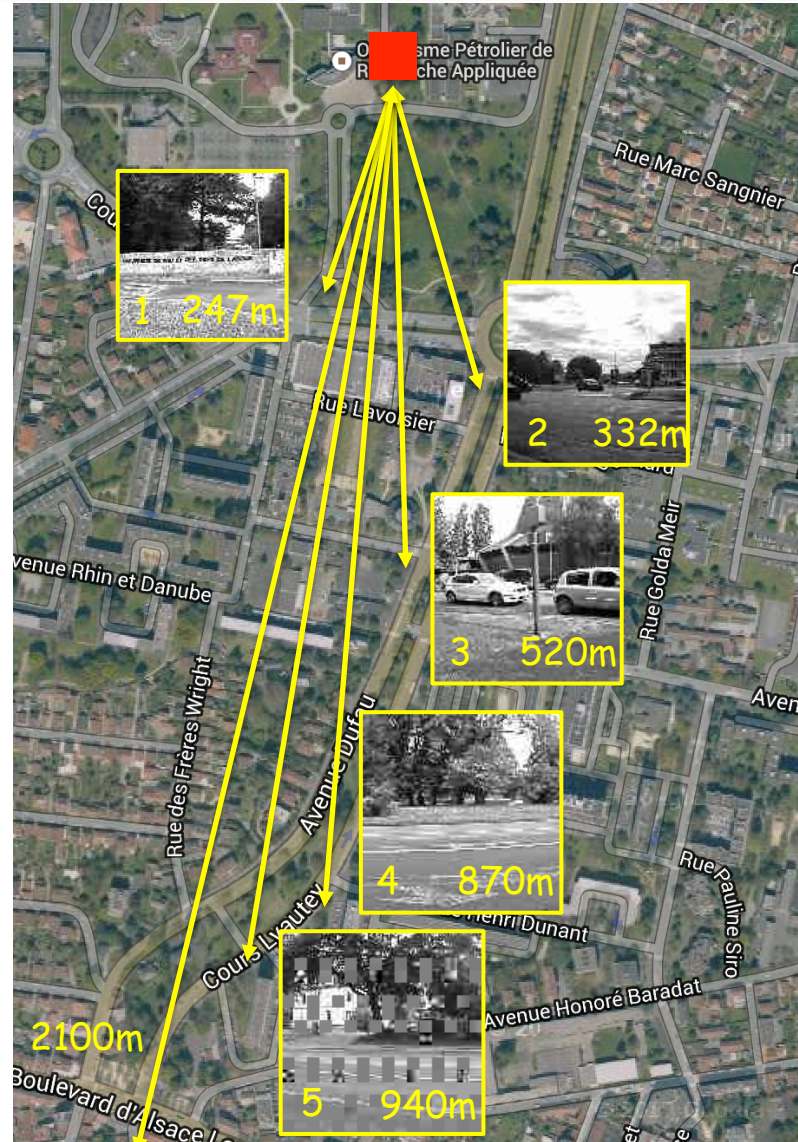
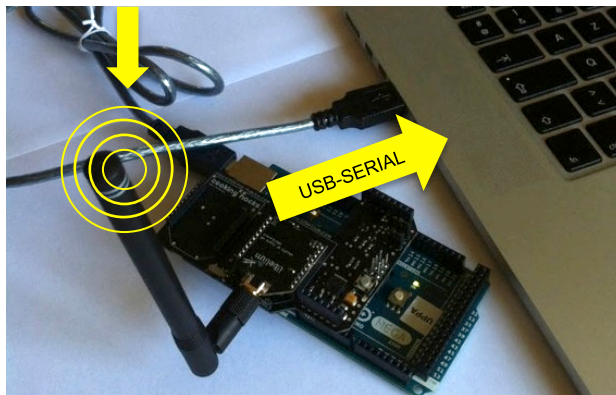
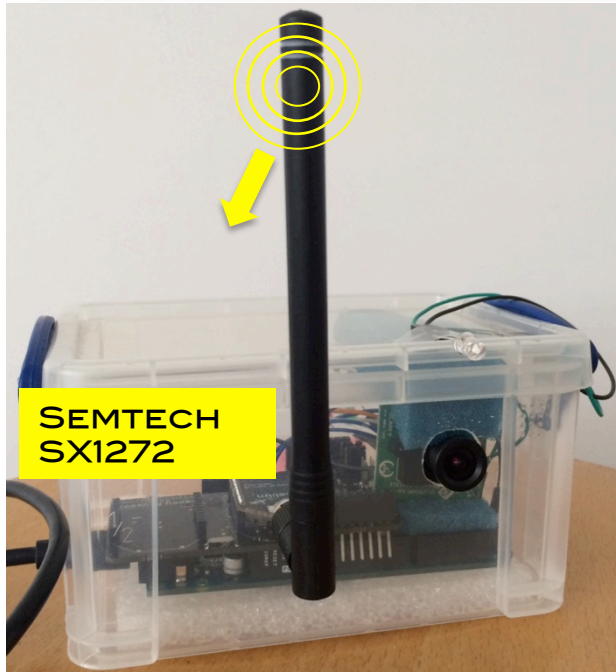


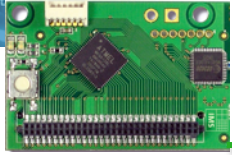
Arduino MEGA2560 board, ATmega2560 at 16MHz, 8KB SRAM, 256KB flash





# LONG-RANGE VERSION



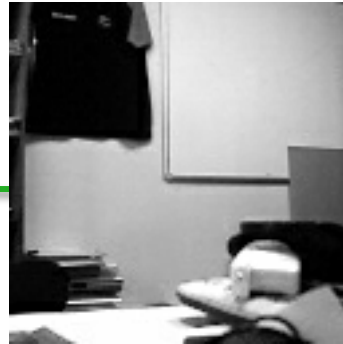


ADJUSTABLE  
IMAGE QUALITY  
FACTOR Q

raw 16384b

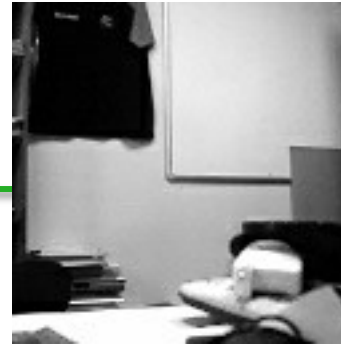


Q=100; 9768b (1.67)



PSNR=51.344

Q=90; 5125b (3.2)



PSNR=29.414

Q=80; 3729b (4.4)



PSNR=28.866

Q=70; 2957b (5.5)



PSNR=28.477

Q=60; 2552b (6.4)



PSNR=28.024

Q=50; 2265b (7.2)



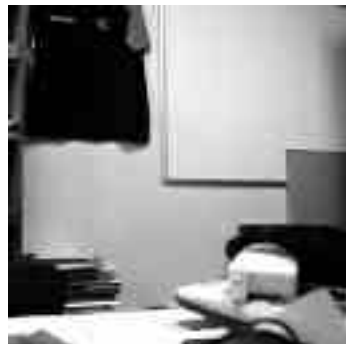
PSNR=27.912

Q=40; 2024b (8.1)



PSNR=27.423

Q=30; 1735b (9.5)



PSNR=26.933

Q=20; 1366b (12)



PSNR=26.038

Q=10; 911b (18)



PSNR=25.283

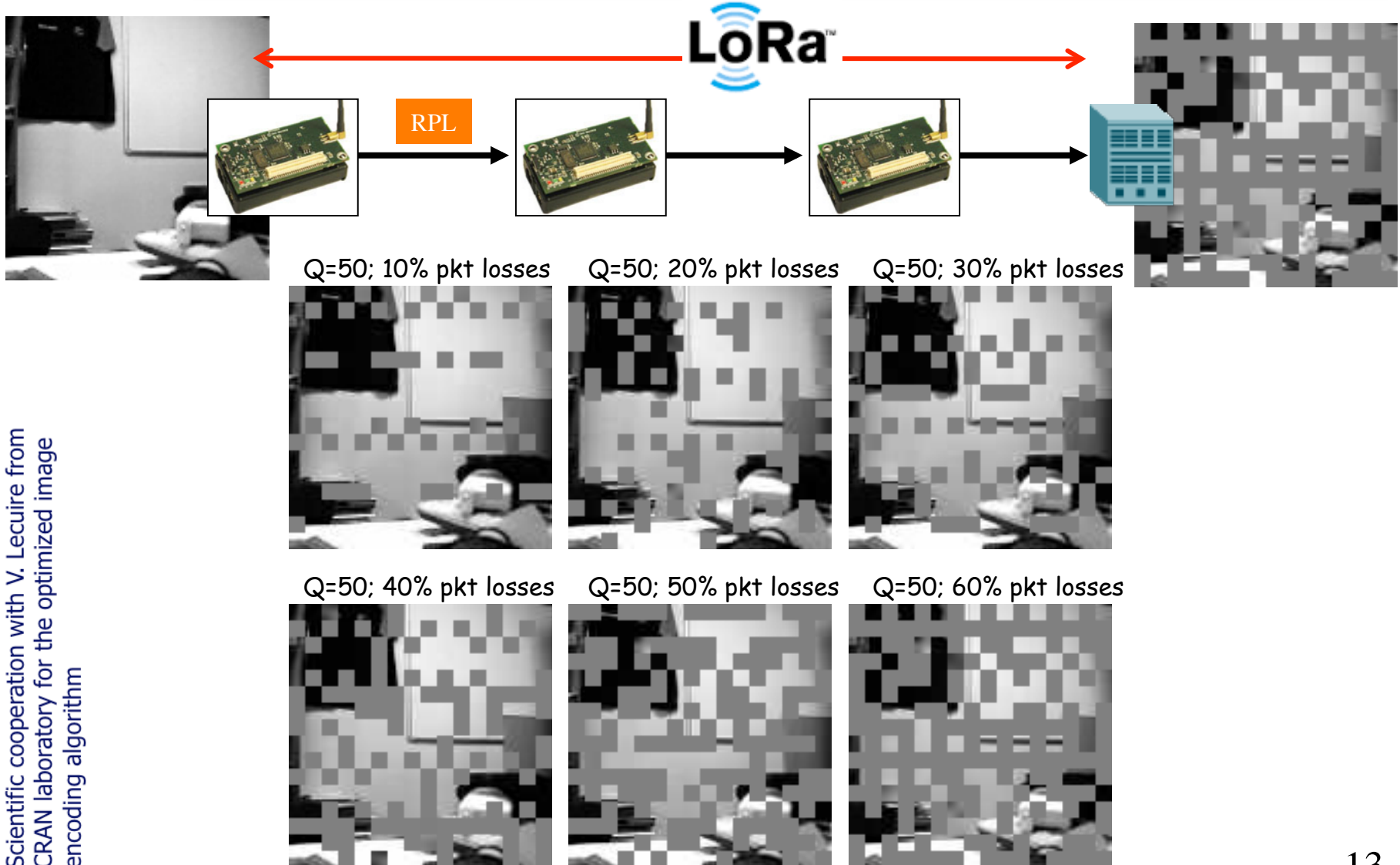
Q=5; 576b (28.44)



PSNR=23.507

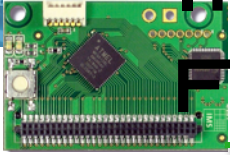


# PACKET LOSS-TOLERANT BIT STREAM, ANY RECEPTION ORDER

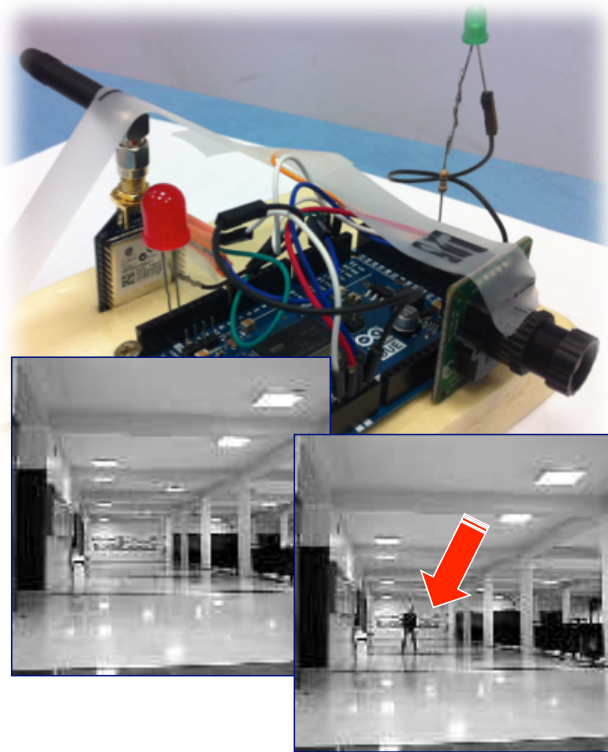


Scientific cooperation with V. Lecuire from CRAN laboratory for the optimized image encoding algorithm

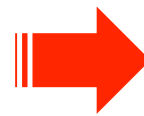




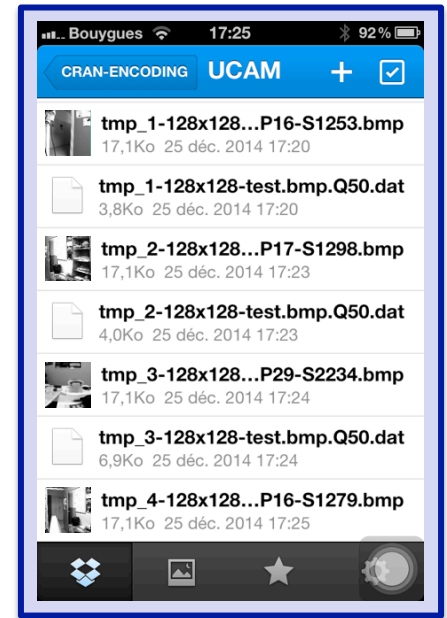
# IMAGE CHANGE DETECTION FOR INTRUSION DETECTION



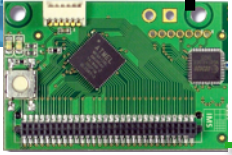
Sends image to gateway on intrusion detection



Real-time synchronization with your smartphone through cloud applications, e.g. DropBox



Very lightweight « simple-differencing » method, takes into account modification in image luminosity



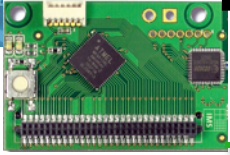
# PERFORMANCE MEASURES ARDUINO DUE

		N	R	A	B	C = D - B	D	E=R+D	F
Quality Factor Q	size in bytes (compression ratio)	number of packets (with MSS=90)	reading time from ucam	encode time	encode + pkt time	transmission time (deduced)	encode + pkt + transmission time	cycle time, with transmission	rcv time at the sink
90	5125 (3.2)	70	1512	512	782	539	1321	2833	799
80	3729 (4.4)	48	1512	511	704	384	1088	2600	599
70	2957 (5.5)	37	1512	519	686	304	990	2502	447
60	2552 (6.4)	32	1512	509	662	263	925	2437	390
50	2265 (7.2)	28	1512	500	646	233	879	2391	349
40	2024 (8.1)	25	1512	516	657	207	864	2376	317
30	1735 (9.5)	21	1512	516	649	177	826	2338	278
20	1366 (12)	17	1512	518	638	140	778	2290	231
10	911 (18)	11	1512	516	628	93	721	2233	177



Includes image change detection

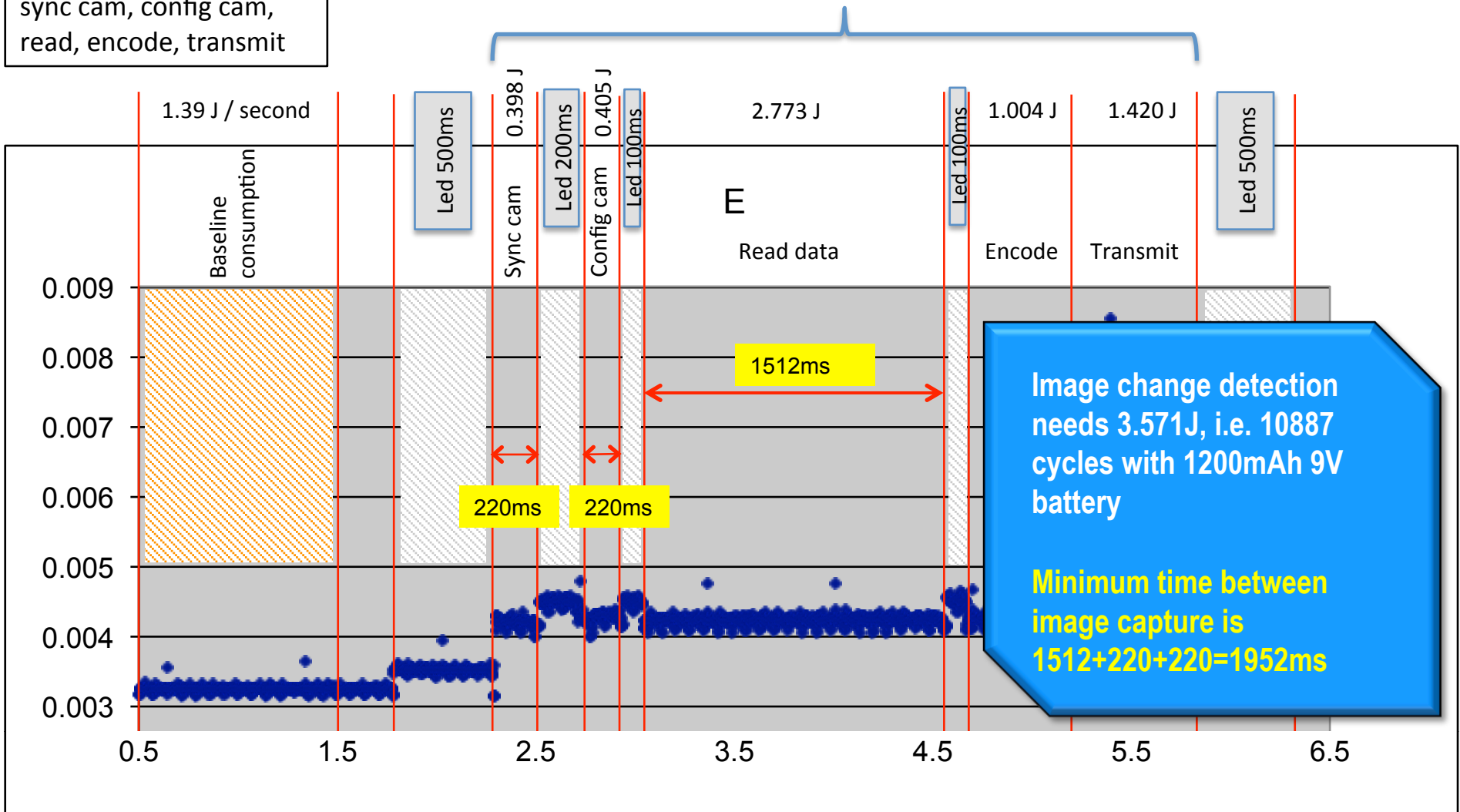


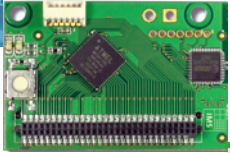


# ENERGY CONSUMPTION & TIMING

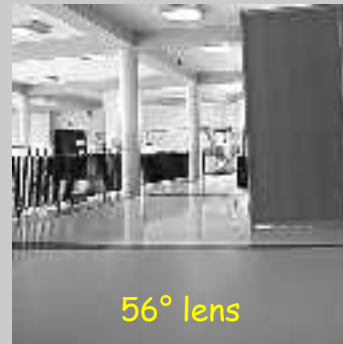
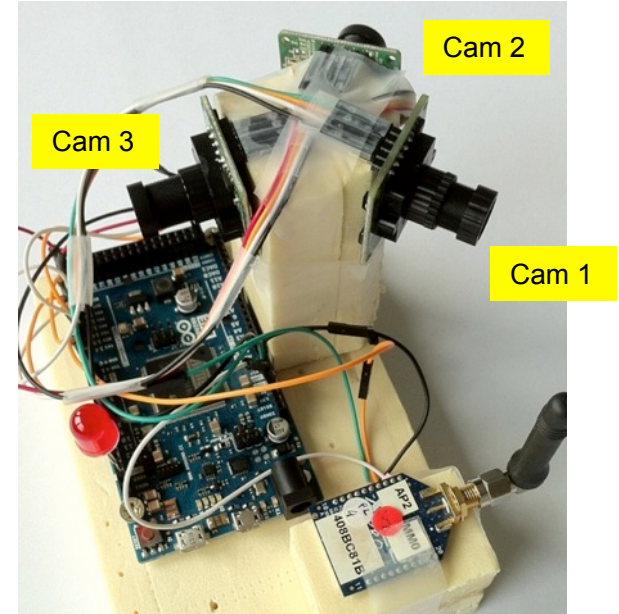
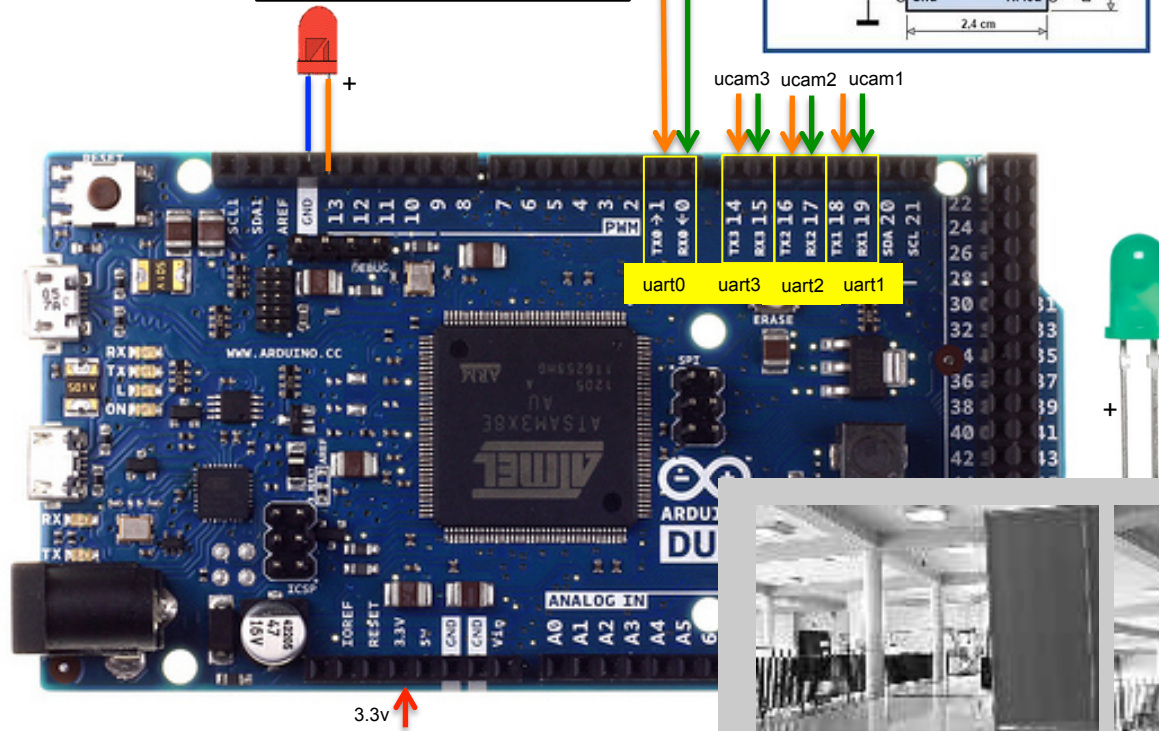
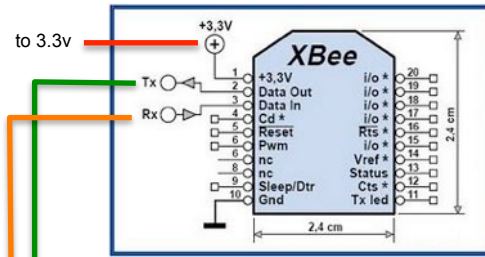
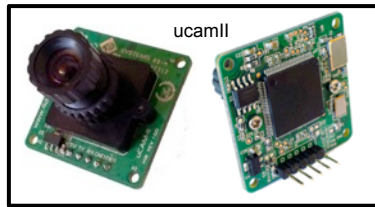
Arduino Due  
sync cam, config cam,  
read, encode, transmit

Global sync, config, read, encode, transmit  
consumption is 6.009 J

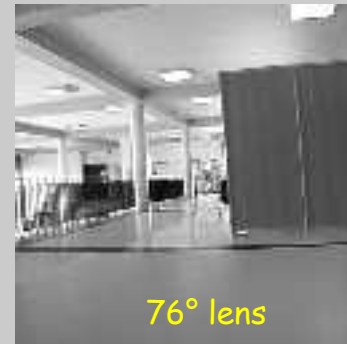




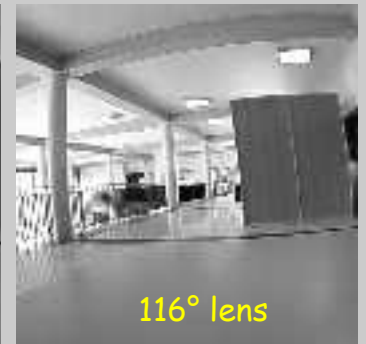
# MULTI-CAMERA SYSTEM



56° lens

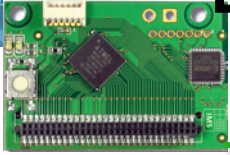


76° lens

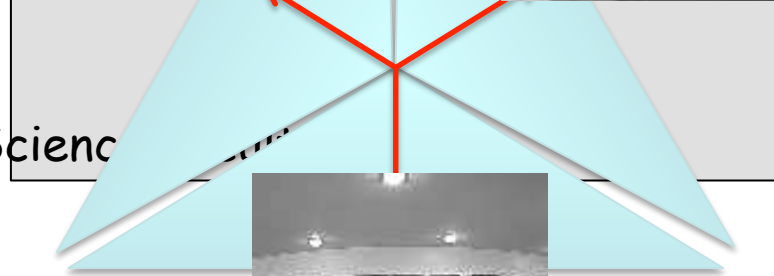
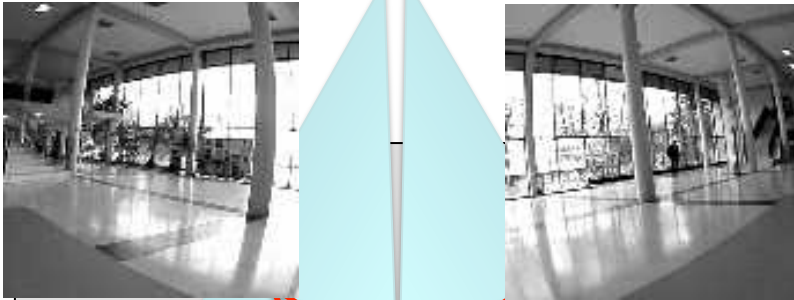


116° lens

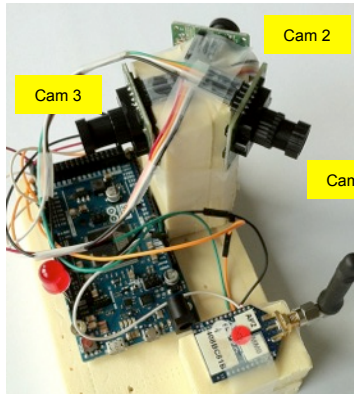




# LOW-COST OMNIDIRECTIONAL VISUAL SENSING

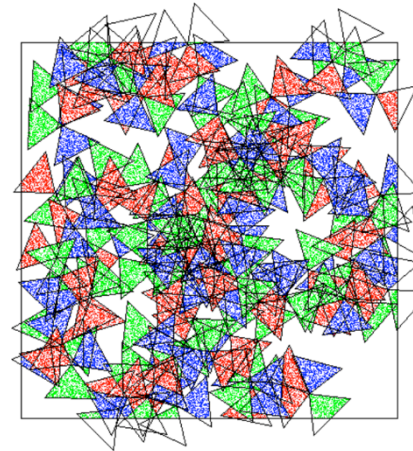
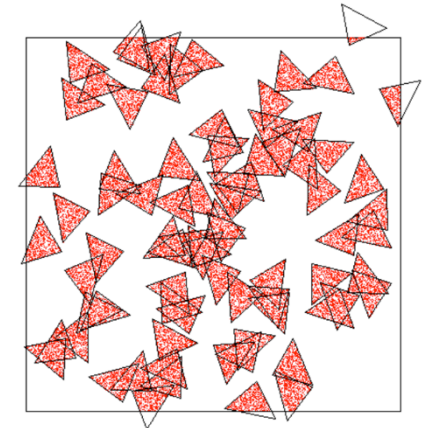


Scienc

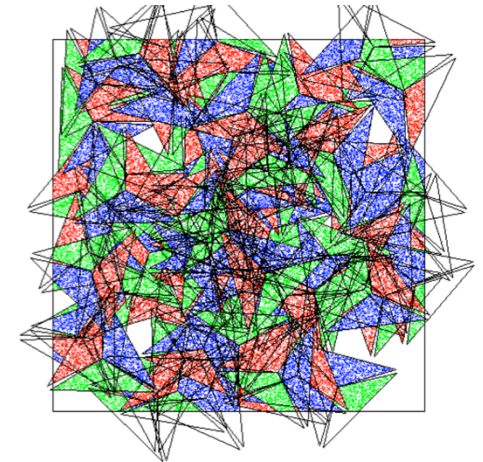


Cameras can be activated in weighted round-robin manner or randomly

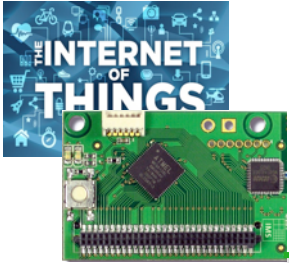
80 image sensors,  
1 camera/sensor aov=76°



80 image sensors,  
3 camera/sensor aov=76°



80 image sensors,  
3 camera/sensor aov=116°



# OUT-OF-THE-BOX SURVEILLANCE

```

administrator@ubuntu: ~/Dropbox/WaspMote/Meshlium/XBeeSend/CRAN-ENCODING
File Edit View Terminal Help
administrator@ubuntu:~/Dropbox/WaspMote/Meshlium/XBeeSend/CRAN-ENCODING$ python 38400SerialToStdout.py
/dev/ttyACM0 | ./display_multi_image -nokey -vflip -timer 25 -framing 128x128-test.bmp
set to framing mode
Wait for image, original BMP file is 128x128-test.bmp, QualityFactor is 50
Display timer is 25s
Wait for image
node index 0
Creating file tmp_0-node#0004-cam#0-128x128-test.bmp-Q20.dat for storing the received image data file
Establishing handler for signal 34
Blocking signal 34
timer ID for node 0x0004 camid 0 is 0x08789f98
Unblocking signal 34
pkt 1(343303033 0.00ms -> 0s0.00ms), node 0x0004 camid 0 Q 20, SN 0 write 234 bytes

node index 0
pkt 2(824489079 481.19ms -> 2s481.19ms), node 0x0004 camid 0 Q 20, SN 1 write 237 bytes

node index 0
pkt 3(295682116 471.19ms -> 4s952.38ms), node 0x0004 camid 0 Q 20, SN 2 write 236 bytes

node index 0
pkt 4(696626098 400.94ms -> 7s353.32ms), node 0x0004 camid 0 Q 20, SN 3 write 230 bytes

node index 0
pkt 5(81256118 384.63ms -> 9s737.95ms), node 0x0004 camid 0 Q 20, SN 4 write 230 bytes

node index 0
pkt 6(512103201 430.85ms -> 12s168.80ms), node 0x0004 camid 0 Q 20, SN 5 write 235 bytes

node index 0
pkt 7(946083325 433.98ms -> 14s602.78ms), node 0x0004 camid 0 Q 20, SN 6 write 233 bytes

node index 0
pkt 8(387992503 441.91ms -> 17s44.69ms), node 0x0004 camid 0 Q 20, SN 7 write 231 bytes

node index 0
pkt 9(115262106 727.27ms -> 18s771.96ms), node 0x0004 camid 0 Q 20, SN 8 write 149 bytes

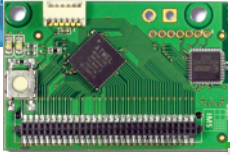
Caught signal 34 for timer ID 0x08789f98
i=0 images[i].timerid=0x08789f98
node index 0
Start display img from node 0x0004 camid 0 index 0 25s13.44ms

Thread for node 0x0004 camid 0 created successfully
rcv pkt: 9
Quality Factor is : 20
Opening file tmp_0-node#0004-cam#0-128x128-test.bmp-Q20.dat for display
Encoded file size is 1997, npkt is 9
Load BMP image ./tmp_0-node#0004-cam#0-128x128-test.bmp-Q20-P9-S1997.bmp

Thread for node 0x0004 camid 0 exited
    
```

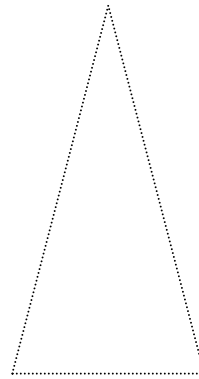
Single camera  
addr is 0x0004

3 cameras  
addr is 0x0003



# DON'T MISS IMPORTANT EVENTS!

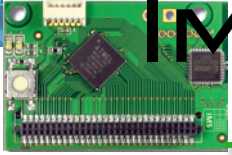
TIME BETWEEN 2 IMAGE CAPTURE



Whole understanding of the scene is wrong!!!

WHAT IS CAPTURED



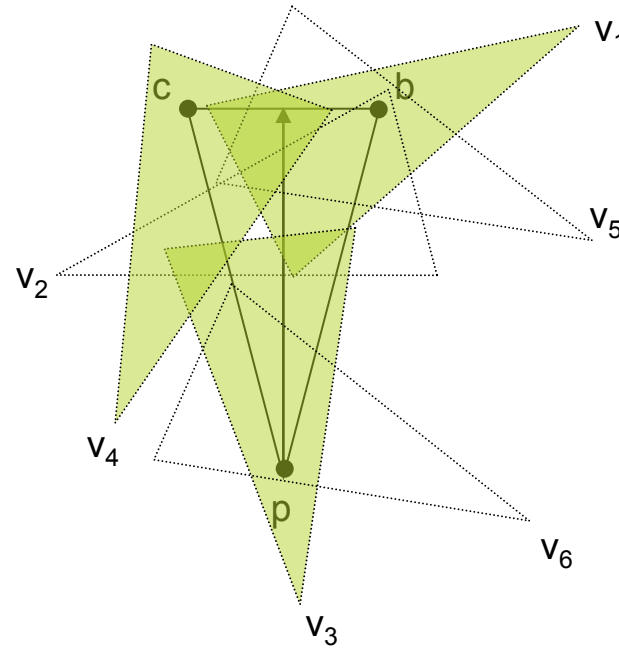


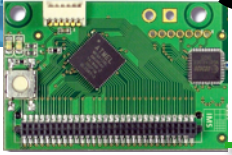
# IMAGE SENSOR'S COVER SET

$\text{Co}(V) = \{$   
 $\{V\},$   
 $\{V_1, V_3, V_4\},$   
 $\{V_2, V_3, V_4\},$   
 $\{V_3, V_4, V_5\},$   
 $\{V_1, V_4, V_6\},$   
 $\{V_2, V_4, V_6\},$   
 $\{V_4, V_5, V_6\}$   
 $\}$



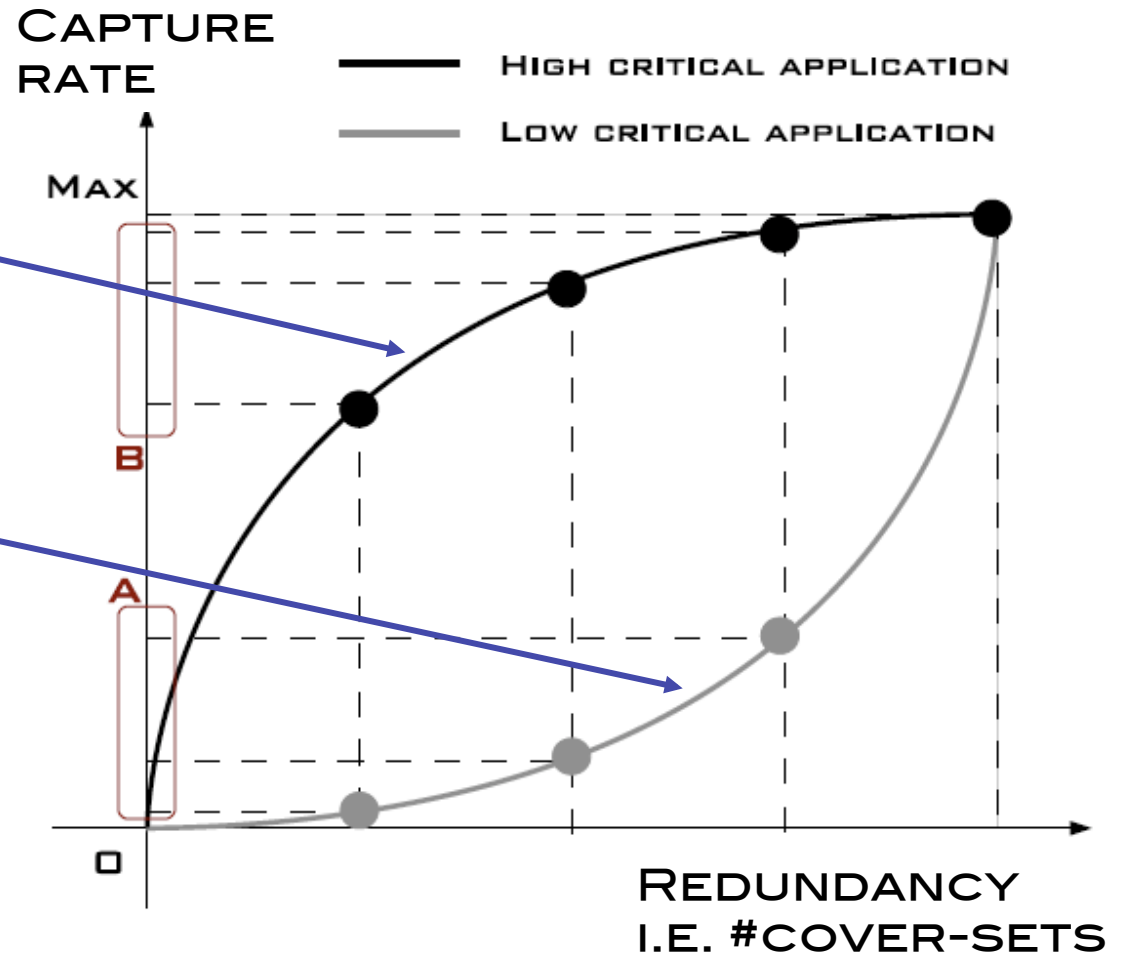
$|\text{Co}(V)| = 7$

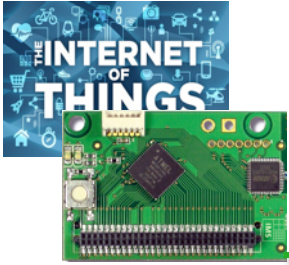




# SCHEDULE ACTIVITY WITH CRITICALITY IN MIND

- ❑ Link the activity to redundancy level
- ❑ High criticality
  - ❑ Convex shape
  - ❑ Most projections of x are close to the max activity
- ❑ Low criticality
  - ❑ Concave shape
  - ❑ Most projections of x are close to the min activity
- ❑ Concave and convex shapes automatically **define sentry nodes** in the network

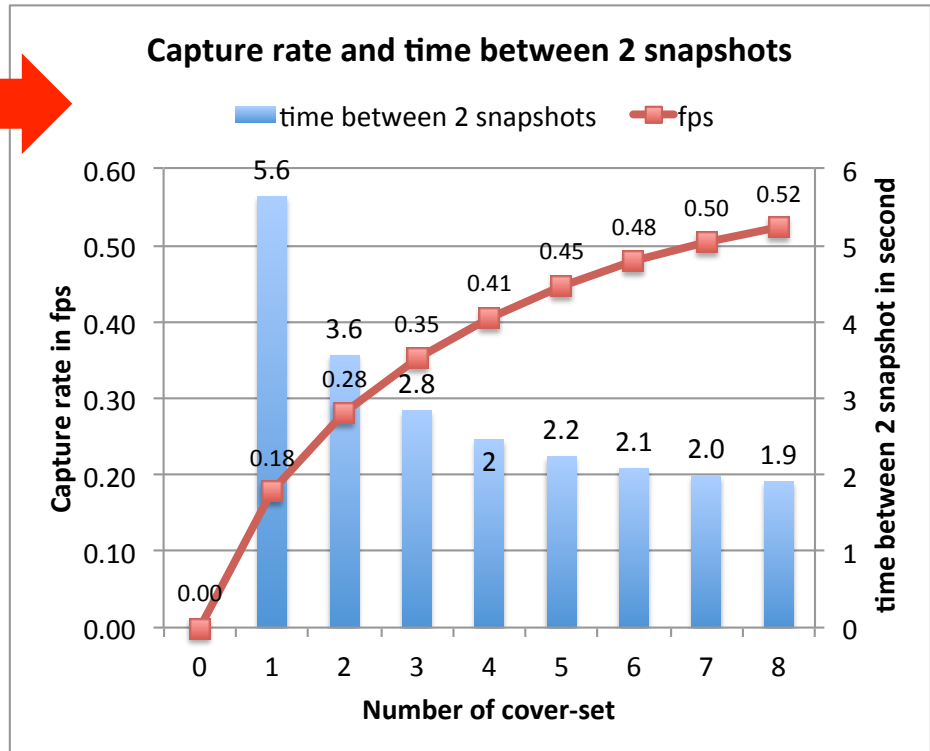
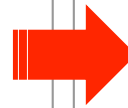
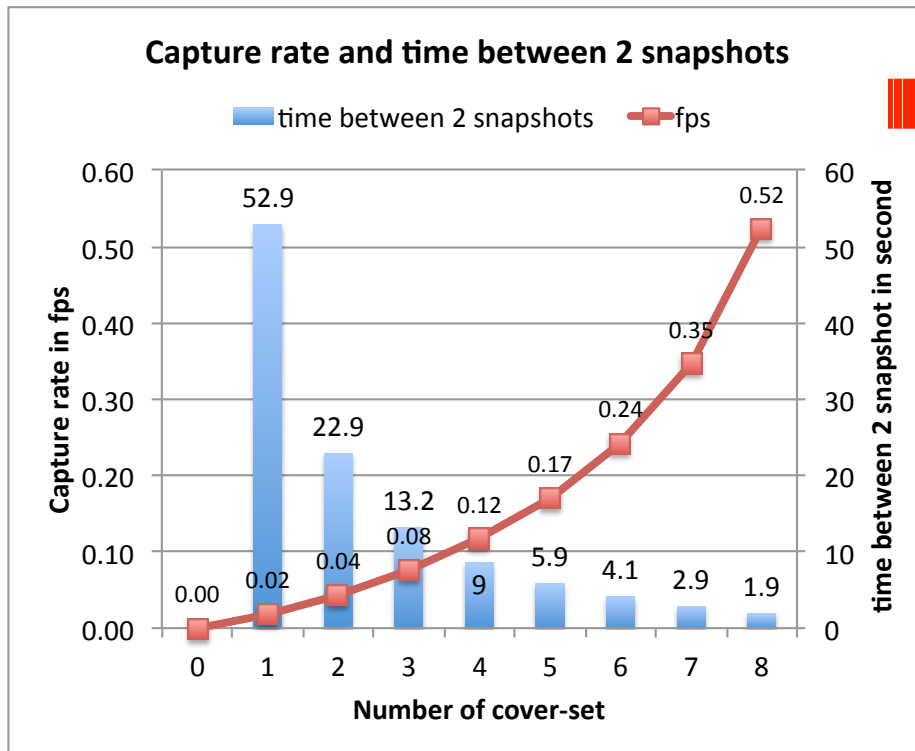




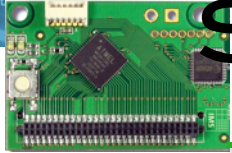
# CAPTURE RATE OF LOW-COST IMAGE SENSOR

Low criticality

High criticality



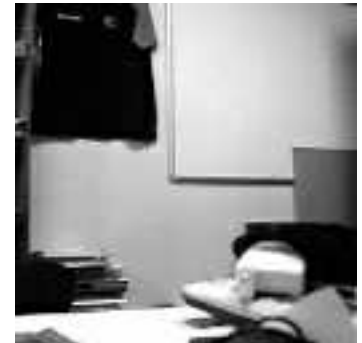
Is the maximum capture rate allowed by low-cost image sensor sufficient to provide low latency intrusion detection system?

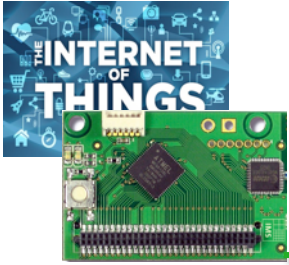


# SIMULATION PARAMETERS

- ❑ 128x128 8bpp encoded image
- ❑ Quality Factor of 50: encoded image of 2265 bytes in **28 packets**
- ❑ We need 220ms to configure the camera and 220ms for sync. Time before image data can be processed is 1.512s. **Total is 1.952s**
- ❑ So the maximum frame capture rate & image change detection is **0.52fps**
- ❑ Camera angle of view could be **56°, 76° or 116°**
- ❑ Depth of view of **25m**
- ❑ Packet overhead at the image source is **11ms** (8ms for transmission and 3ms for packetization)
- ❑ Packet relaying time is **16ms** (based on measures of MicaZ relay node platform)

Q=50; 2265b



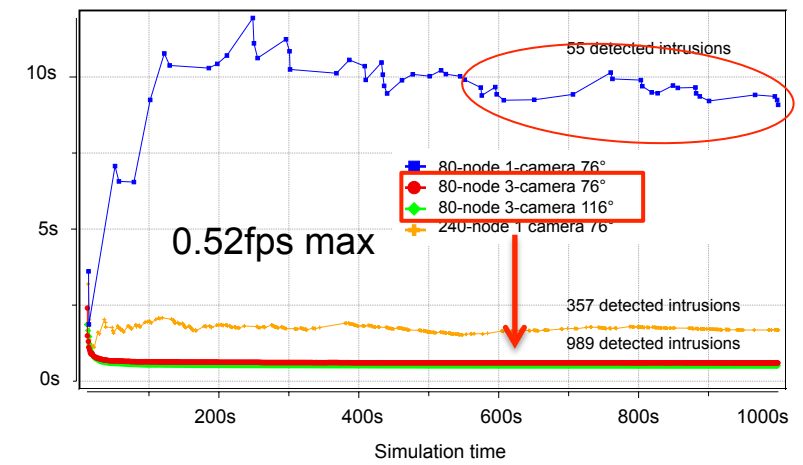
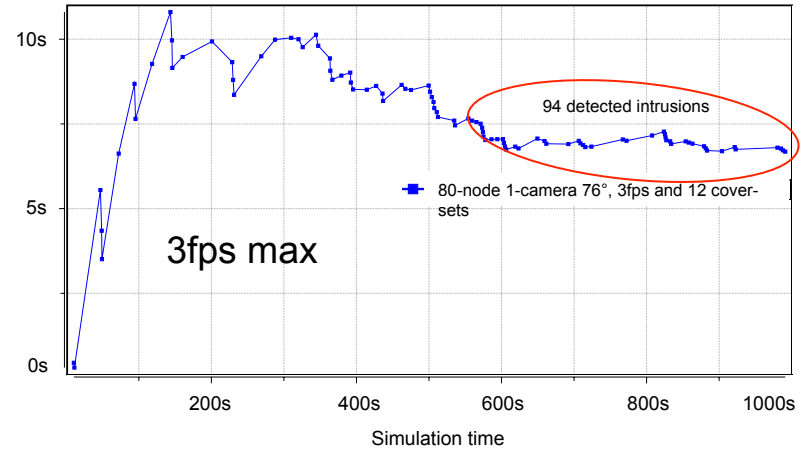
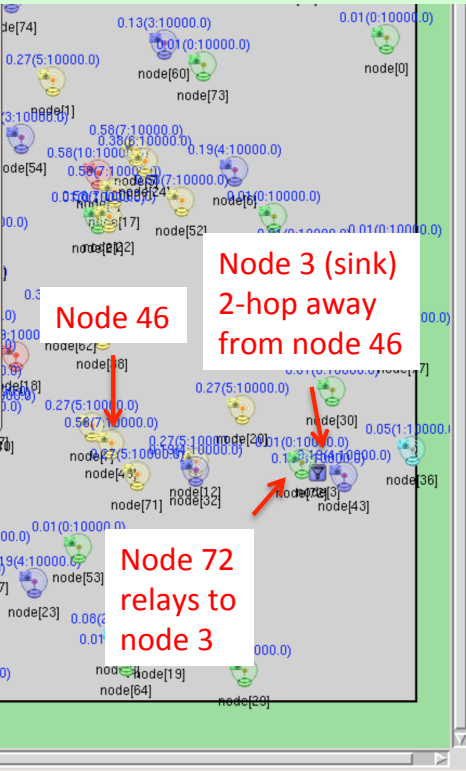


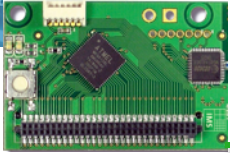
# INTRUSION DETECTION LATENCY

The simulation model is used to study performance of large-scale intrusion detection system

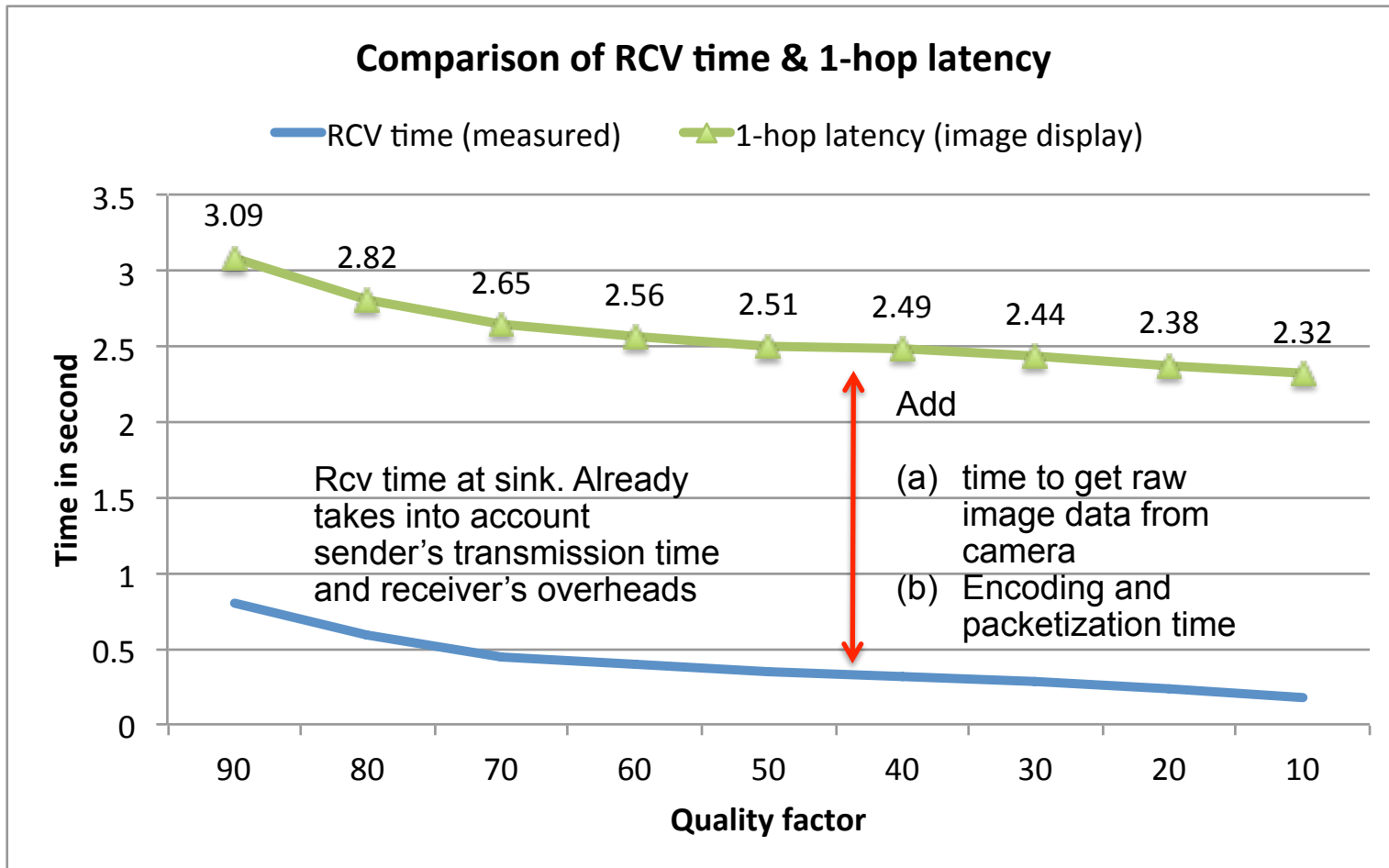
Using real measures for image processing tasks and packet transmission overheads produces very accurate simulation results that are consistent to what have been found in real multi-hop experiments

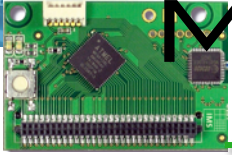
First intrusion seen by node 46, image packets are sent and relayed by node 72, then received and displayed by node 3 (sink) at time 12.5. 28/28 pkts, received latency is 0.42s and image was sent 0.47s earlier.



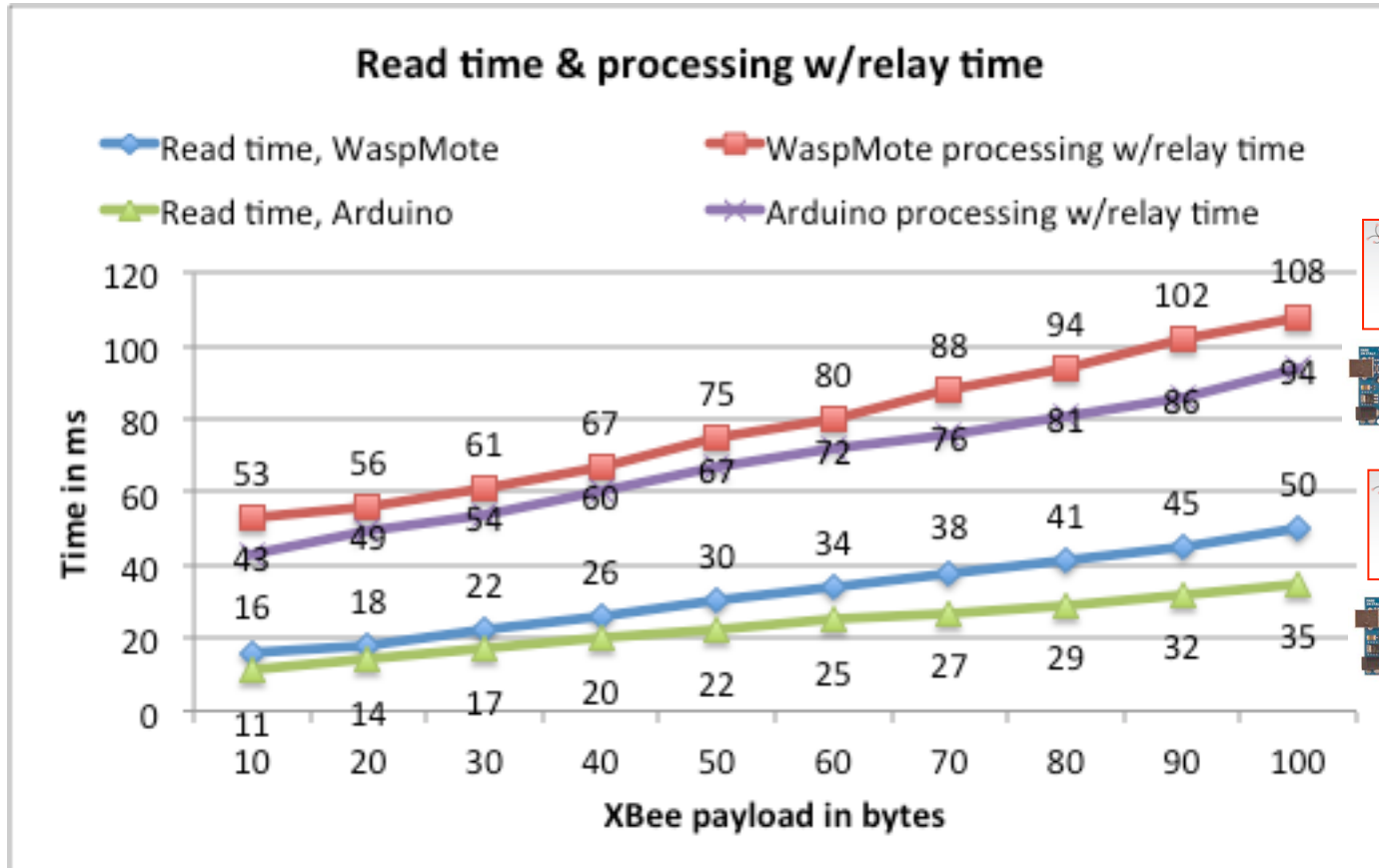


# 1-HOP IMAGE LATENCY

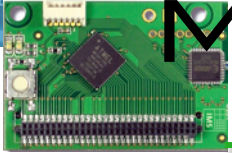




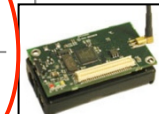
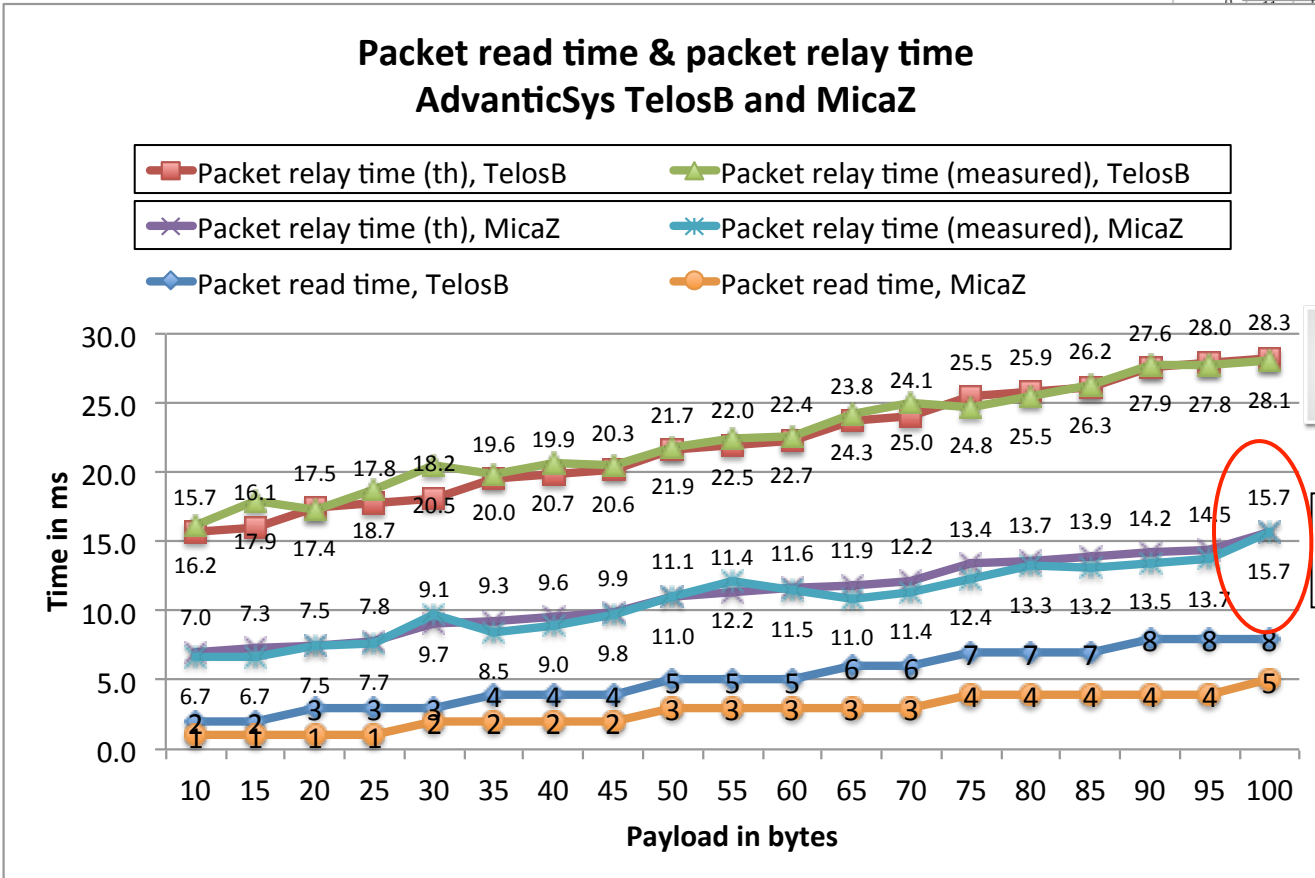
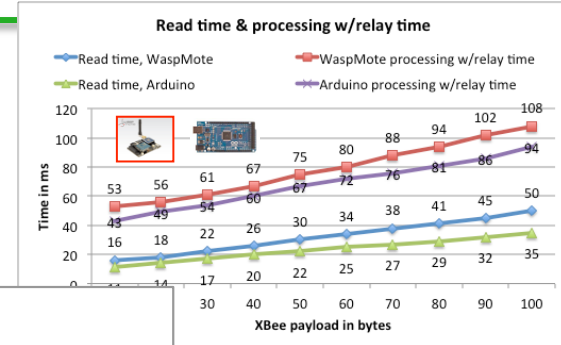
# MULTI-HOP IMAGE LATENCY



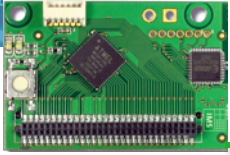




# MULTI-HOP IMAGE LATENCY



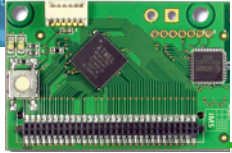
Add 16ms per relay node



# CONCLUSIONS

---

- ❑ Low-cost image sensor from off-the-shelves components with fast and packet loss-tolerant encoding
- ❑ Can run out-of-the box to perform surveillance tasks based on image change detection
- ❑ Multi-camera systems can be easily built to increase coverage at low-cost
- ❑ Accurate large-scale simulations shows the efficiency of low-cost multi-camera system compared to faster single camera configurations



# DO IT YOURSELF

An image sensor board based ... x +

cpham.perso.univ-pau.fr/WSN-MODEL/tool-html/imagesensor.html

## An image sensor board based on Arduino Due/MEGA and uCamII camera

support for IEEE 802.15.4 and long-range LoRa™ radios

C. Pham, LIUPPA laboratory, University of Pau, France. <http://cpham.perso.univ-pau.fr/>

last update: May 12th, 2015.

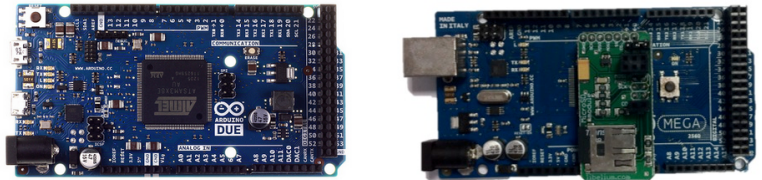
### Introduction

There are a number of image sensor boards available or proposed by the very active research community on image sensor networks: e.g. [Panoptes](#), [CMUcam3&FireFly](#), [CMUcam4](#), [CMUcam5/PIXY](#), [iMote2/IMB400](#), [ArduCam](#), ... All these platforms and/or products are very good and our motivations in building our own image sensor platform for research on image sensor surveillance applications are:

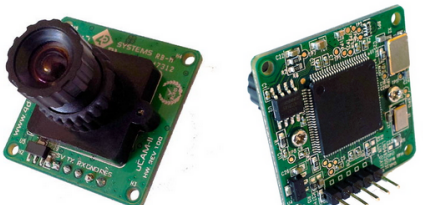
1. have an off-the-shelf solution so that anybody can reproduce the hardware and software
  1. use an Arduino-based solution for maximum flexibility and simplicity in programming and design
  2. use a simple, affordable external camera to get RAW image data, no JPEG
2. apply a fast and efficient compression scheme with the host microcontroller to produce robust and very small image data suitable for large scale surveillance or search&rescue/situation awareness applications
3. simple enough to demonstrate our criticality-based image sensor scheduling propositions
  1. see our paper : C. Pham, A. Makhoul, R. Saadi, "Risk-based Adaptive Scheduling in Randomly Deployed Video Sensor Networks for Critical Surveillance Applications", *Journal of Network and Computer Applications (JNCA)*, Elsevier, 34(2), 2011, pp. 783-795
4. easy integration with our [test-bed](#) for studying data-intensive transmission with low-resource mote platforms (audio and image)
  1. see our paper: C. Pham, "Communication performances of IEEE 802.15.4 wireless sensor motes for data-intensive applications: a comparison of WaspMote, Arduino MEGA, TelosB, MicaZ, and iMote2 for image surveillance", *Journal of Network and Computer Applications (JNCA)*, Elsevier, Vol. 46, Nov. 2014
5. fully similar/compatible with our simulation environment based on OMNET++/Castalia for video/image sensor networks.

### Architecture and components

We use both Arduino Due and MEGA2560. The [Arduino Due board](#) has enough SRAM memory (96KB) to store an 128x128 8-bit/pixel RAW image (16384 bytes). On the [MEGA2560](#), which has only 8KB of SRAM memory, we store the captured image on an SD card (see right figure below for an exemple) and then perform the encoding process by incrementally reading small portions of the image file.



For the camera, we use the [uCamII](#) from [4D systems](#). You can download the [reference manual](#) from 4D system web site. The uCamII can deliver 128x128 raw image data. JPEG compression can be realized by the embedded micro-controller but this feature is not used as JPEG compression is not suitable at all for lossy environments. We instead apply a fast and efficient compression scheme with the host microcontroller to produce robust and very small image data.



<http://cpham.perso.univ-pau.fr/WSN-MODEL/tool-html/imagesensor.html>

Question?  
Congduc.Pham@univ-pau.fr

