

Environmental Sensing at the Edge: Waggle and the Array of Things

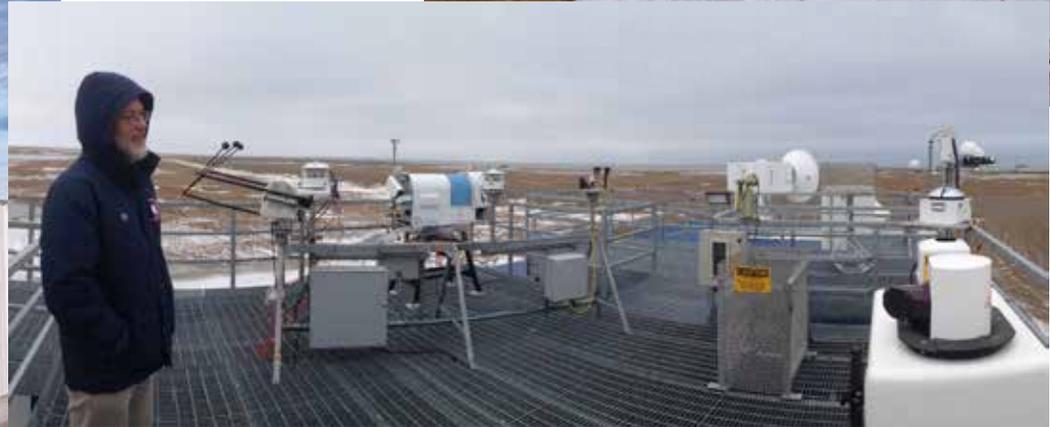
Pete Beckman

Co-Director, Northwestern Univ. / Argonne Institute for Science and Engineering

Senior Computer Scientist, Argonne National Laboratory

Collaborators: Charlie Catlett, Rajesh Sankaran, Rob Jacob, and Nicola Ferrier

Big Sensor Science



Big, Expensive, Precise, Sparse

Pete Beckman: Argonne National Laboratory

An aerial photograph of a city skyline at dusk, featuring numerous skyscrapers and a body of water in the background. The sky is a deep blue, and the city lights are beginning to glow. The text is overlaid on the top half of the image.

**What if environmental sensor systems
could be massively parallel?**

What if sensors supported edge computing?

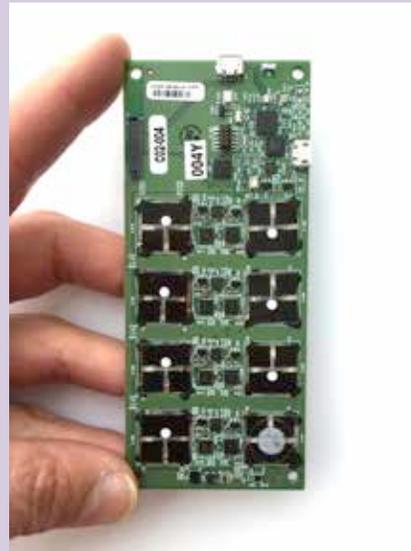
Waggle: An Open Platform for *Intelligent* Sensors

Exploiting Three areas of Disruptive Technology + “Deep Space Probe” design

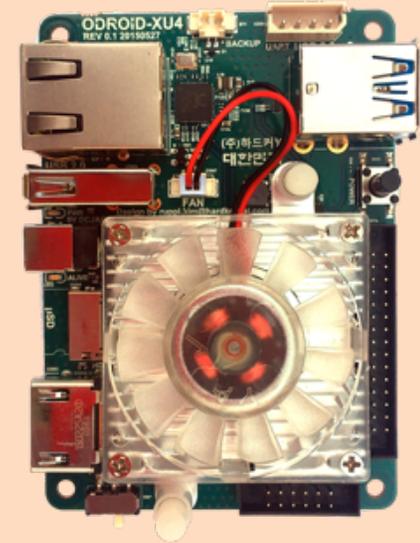
Machine Learning
Computer Vision



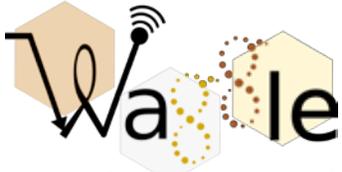
Novel Sensors
Nano / MEMS



Edge Computing
GPU / Smartphones



Pete Beckman: Argonne National Laboratory



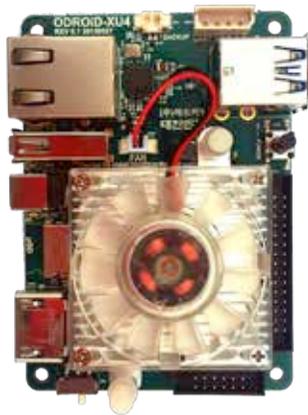
Powerful, Resilient & Hackable

Multiple boot media (μ SD / eMMC)



4-core ARM

Node Control & Communications



4 + 4-core ARM
8-core GPU

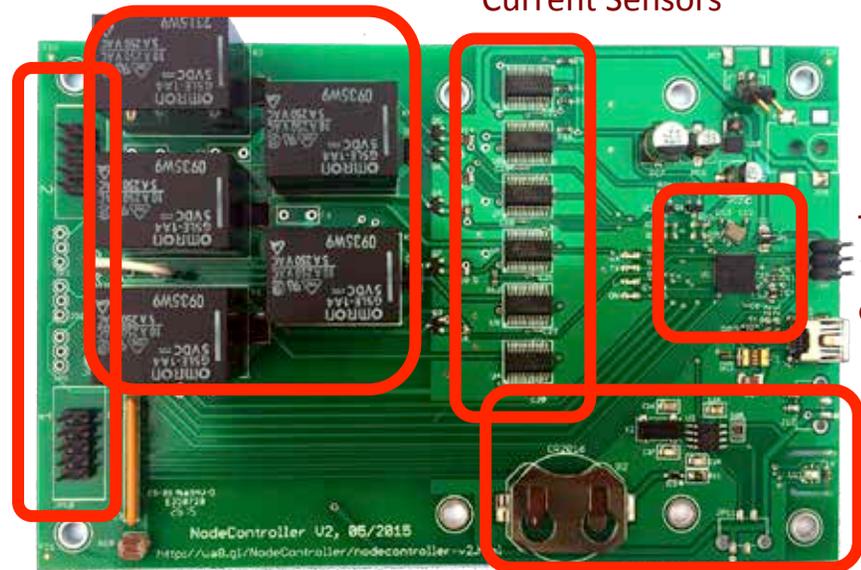
In-Situ / Edge Processing

Linux Development Environment

Relays

Current Sensors

Heartbeat Monitors
Reset pins



Control Processor

Real time clock & Internal sensors

“Deep Space Probe” Design

Pete Beckman: Argonne National Laboratory

The Array of Things



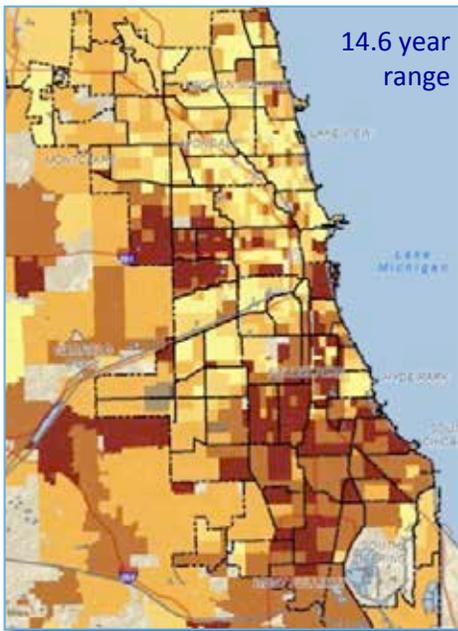
Charlie Catlett, Pete Beckman, Rob Jacob, Nicola Ferrier, Mike Papka, Rajesh Sankaran, et. al.



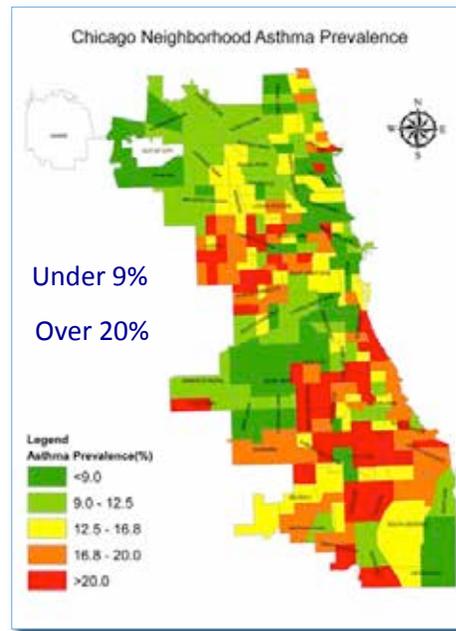
THE UNIVERSITY OF
CHICAGO Argonne
NATIONAL LABORATORY



Urban Challenges are Neighborhood-Specific



Life Expectancy



Asthma



Access to services

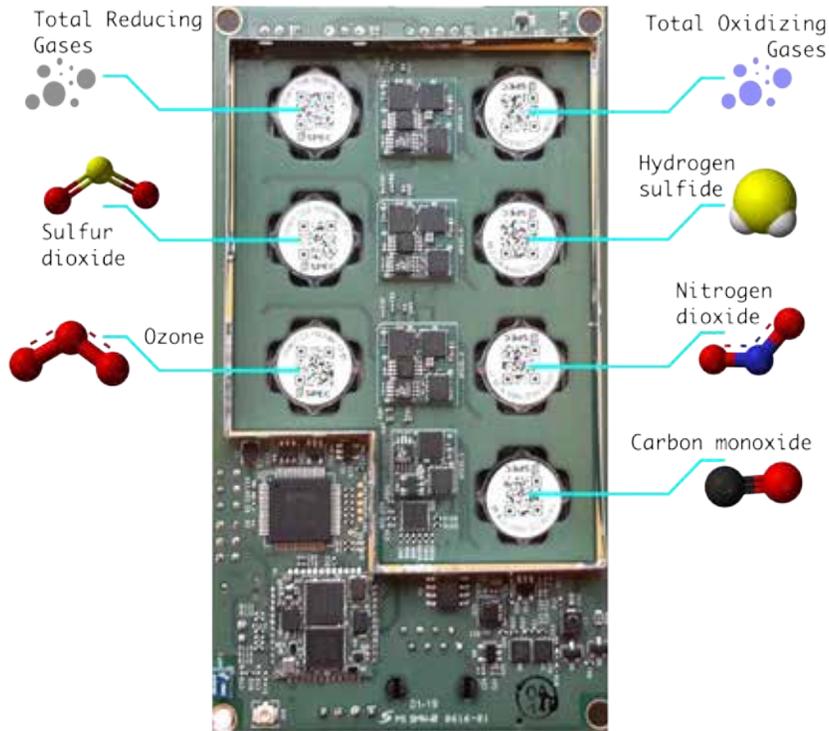
But many city challenges are hyper-local, and to diagnose and address them requires much better measurement strategies.

Pete Beckman: Argonne National Laboratory

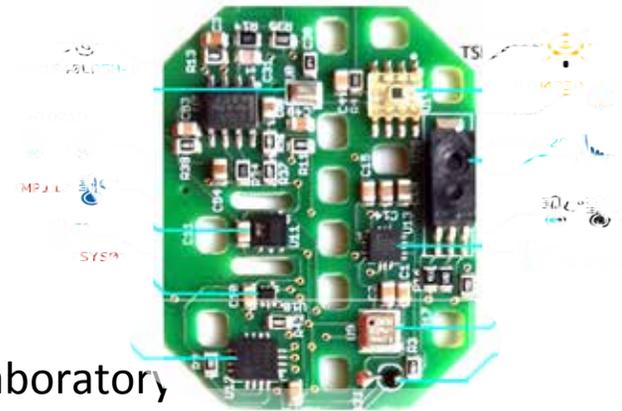
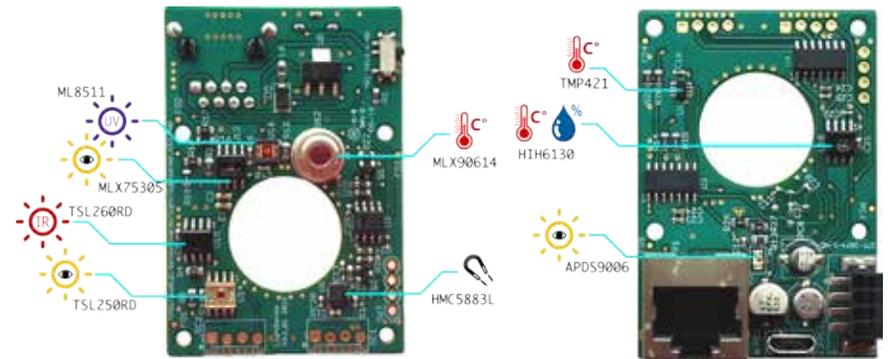
AoT Nodes are going up in Chicago



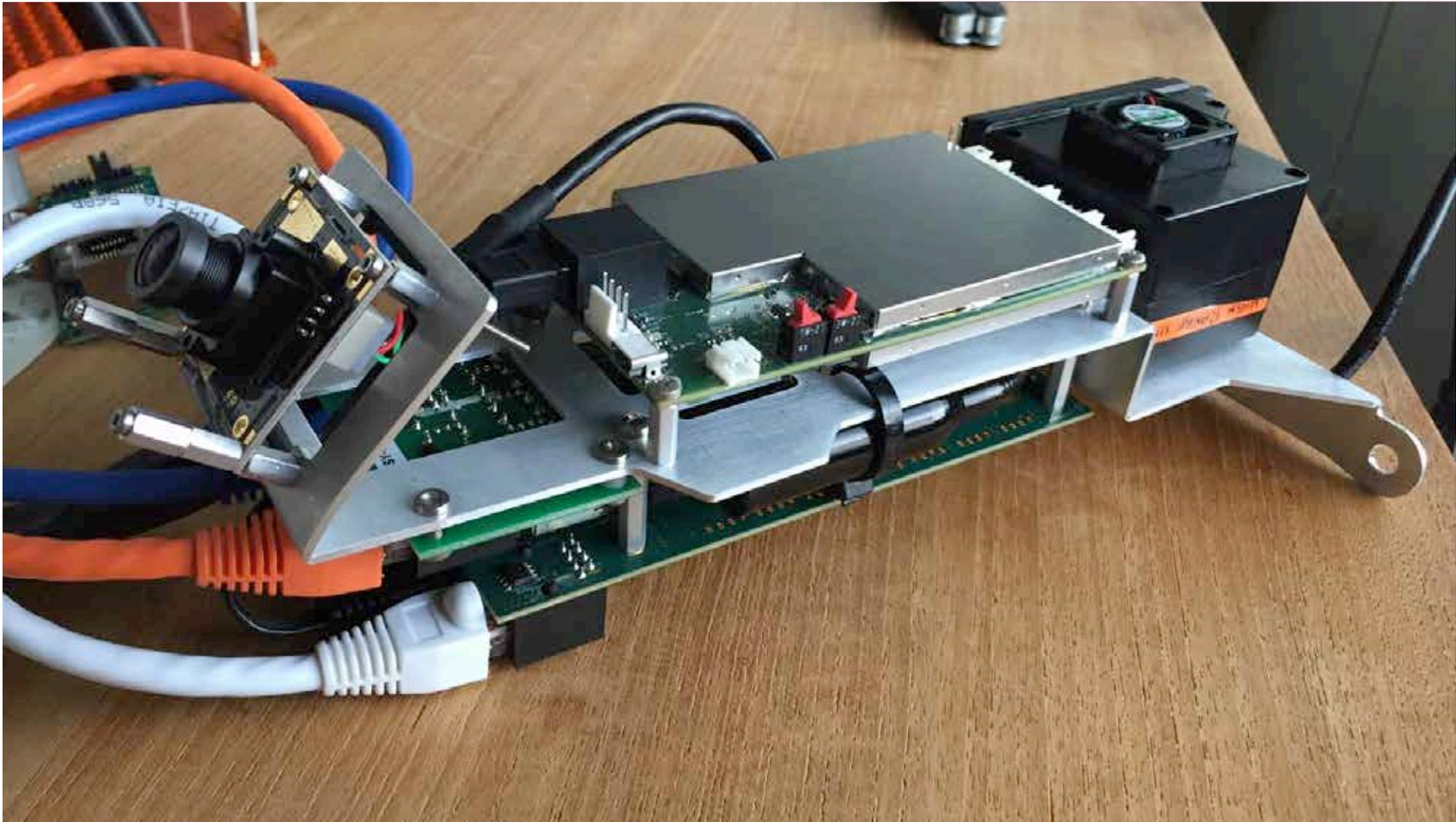
Physical Sensors



Chemical Sensors

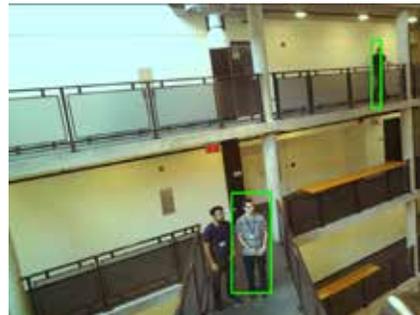
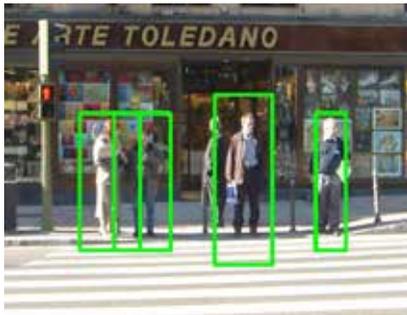


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Computer Vision Research: Tracking Pedestrians



Detected pedestrians are captured by green bounding boxes



Pete Beckman: Argonne National Laboratory



Tracking Experiment

Blue bounding box represents the pedestrian and red dot represents the centroid. The edge processor can send the centroid coordinates.

Research by (* using INRIA public dataset):

- **Zeeshan Nadir** (Purdue University)
- Ethan Trokie (Northwestern University)
- Nicola J. Ferrier (Argonne National Lab)

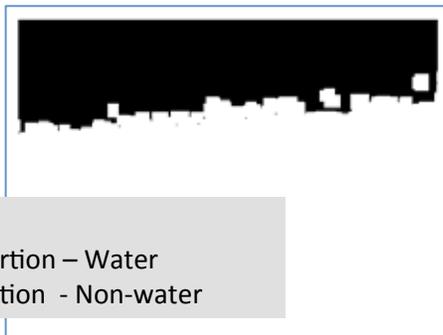
Computer Vision Research: Water Detection



Example of flood/pond water



Extract the mode frame. Notice it captures all the reflections and stationary objects.



Legend:
White Portion – Water
Black Portion - Non-water

Automated water/non-water segmentation



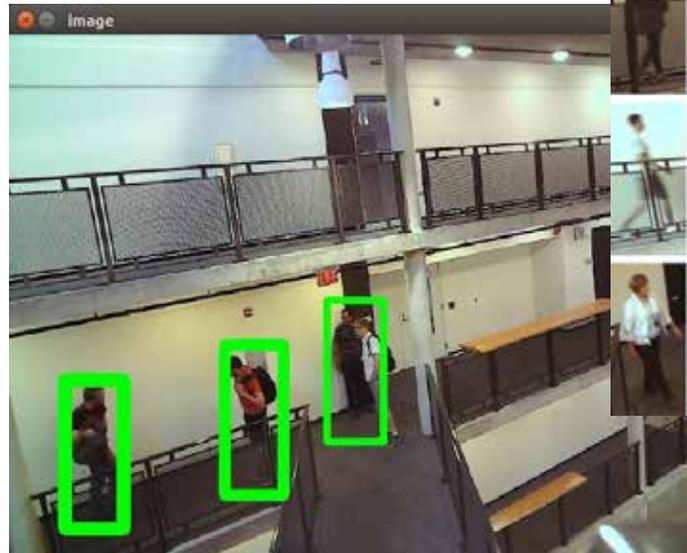
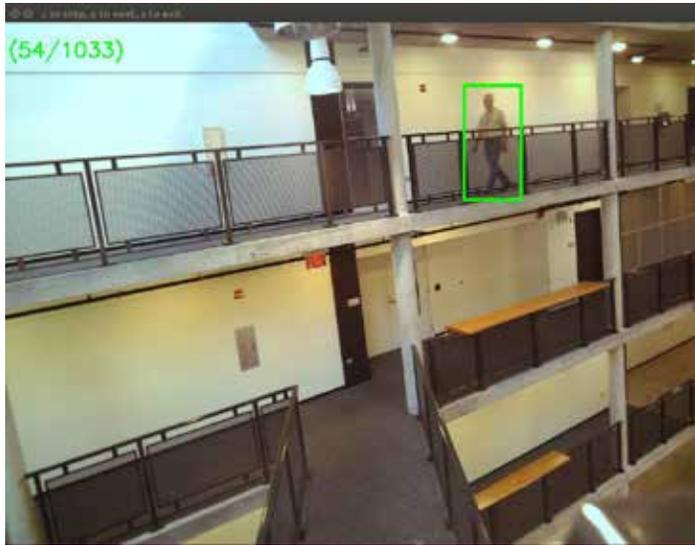
Ground Truth (human)

Research by:

- Zeeshan Nadir (Purdue University)
- **Ethan Trokie** (Northwestern University)
- Nicola J. Ferrier (Argonne National Lab)



Computer Vision Research: Counting People



Detection uses OpenCV HOG descriptor and linear SVM. Detection size (window size) is (64, 128). The detector is written in Python and for 640x480 image, performs about 3 images/sec on current Waggle Edge processor.



Research by:

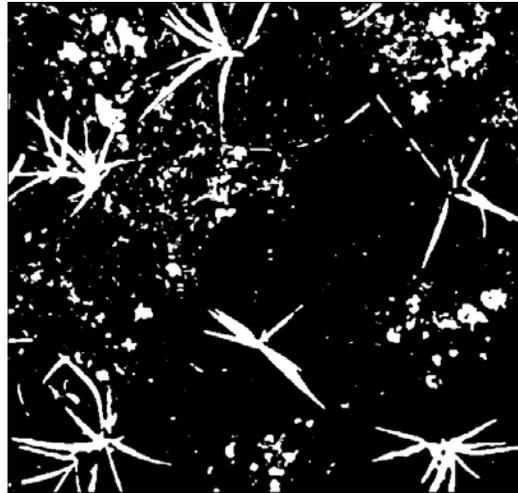
1. **Yongho Kim** (Purdue University)
2. Nicola J. Ferrier (Argonne National Lab)

Pete Beckman: Argonne National Laboratory

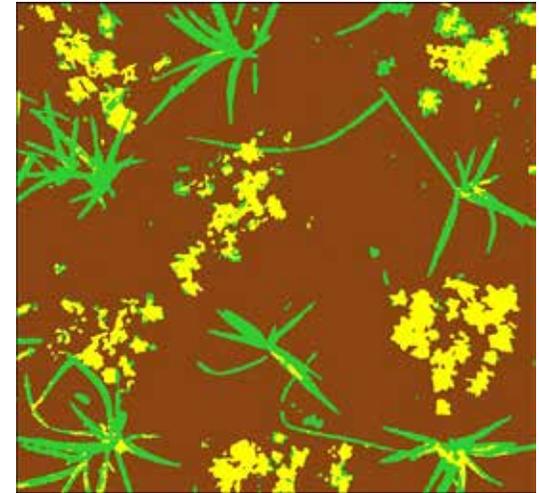
Computer Vision Research: Vegetation Growth



Original



Single Mean Model

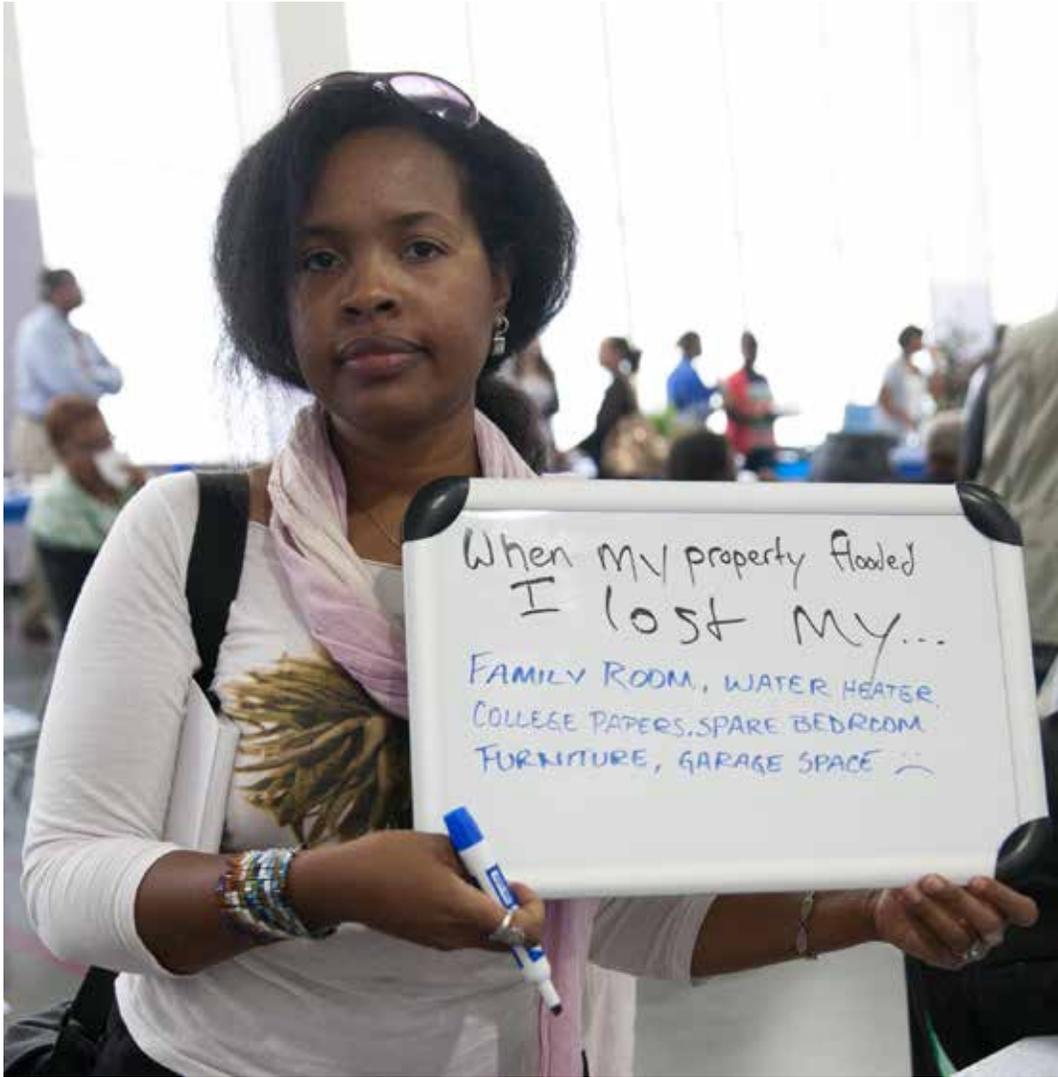


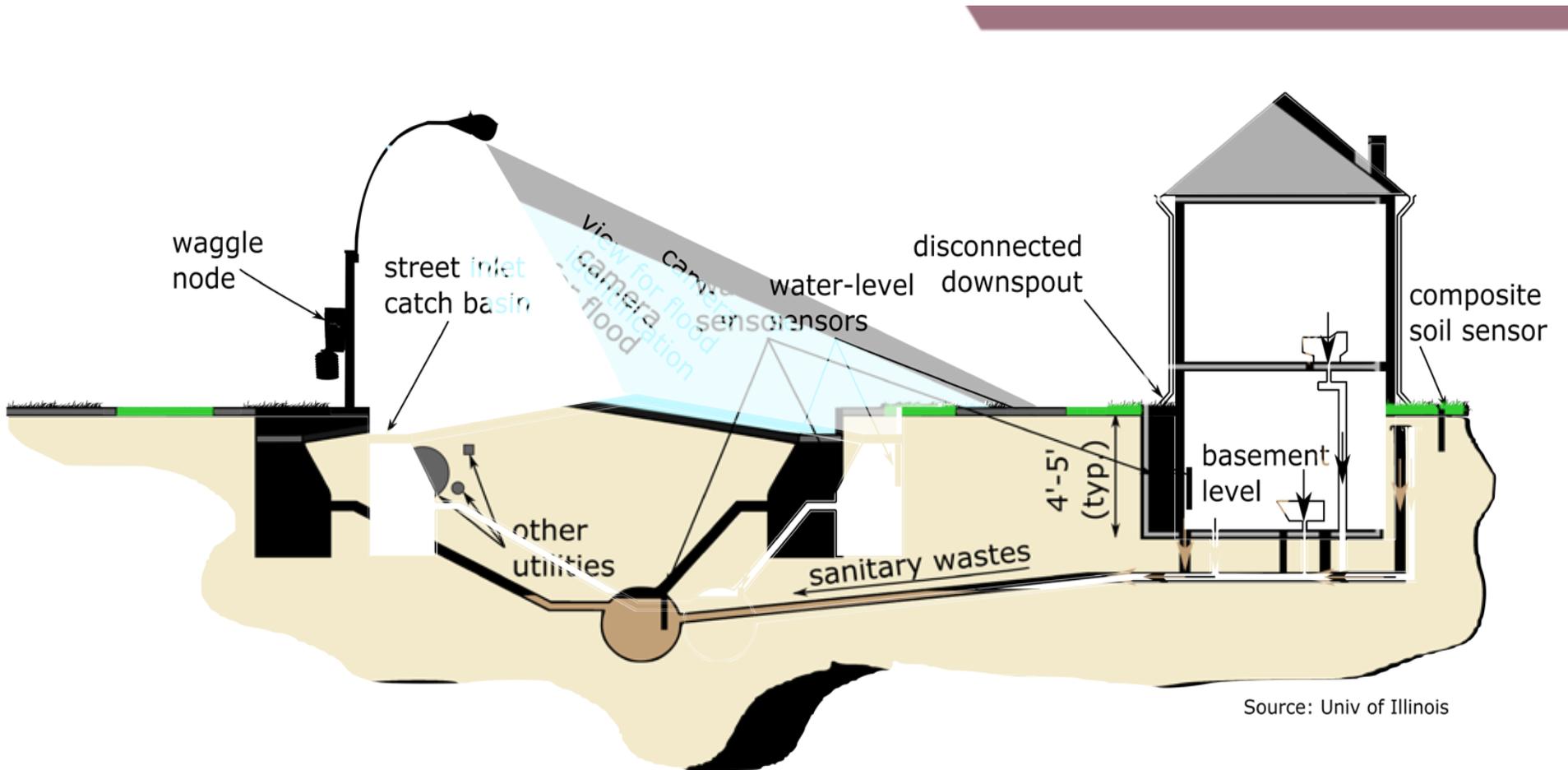
Mixture Model

Research by:

- **Renee Zha** (Northwestern University)
- Zeeshan Nadir (Purdue University)
- Cristina Negri (Argonne National Lab)

Pete Beckman: Argonne National Laboratory







Work with David Lary, Udallas
Measure pollen in Chattanooga

Imagine Programmable Infrastructure

Examples from discussions with smart people about cities:

- Interesting Stops
- Diesel Truck Stops
- Bike Helmets
- Wildlife & QoL
- Audio quality of life
- Traffic Crowds
- Street water
- Collisions
- Pedestrian Misses
- Baby Strollers

All based on parallel computing & deep learning, advanced system software

Pete Beckman: Argonne National Laboratory

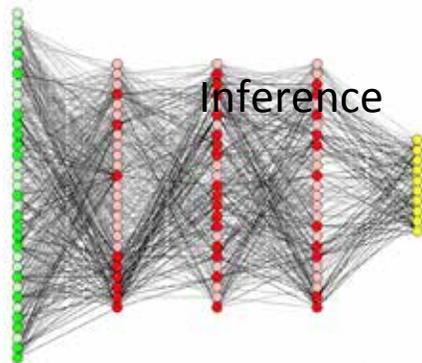
Next Steps: Edge Processing and Deep Learning With Feedback



Instruments



Parallel Computing



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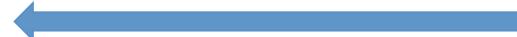
Reduced, Compressed data



HPC

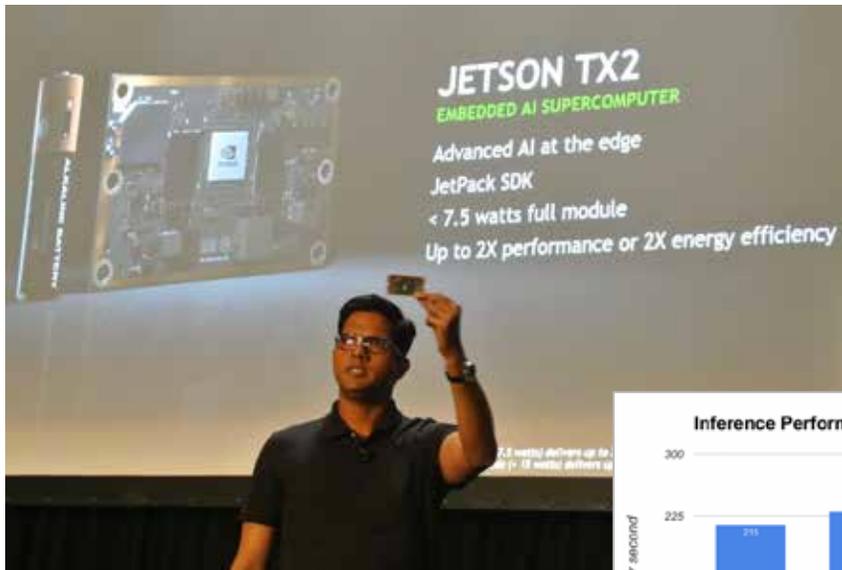


New classifiers (code)



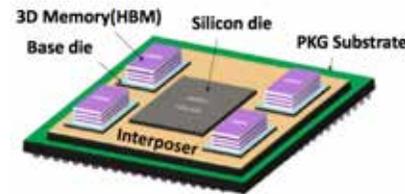
Deep Learning Training

Hardware for Edge Computing is Rapidly Changing

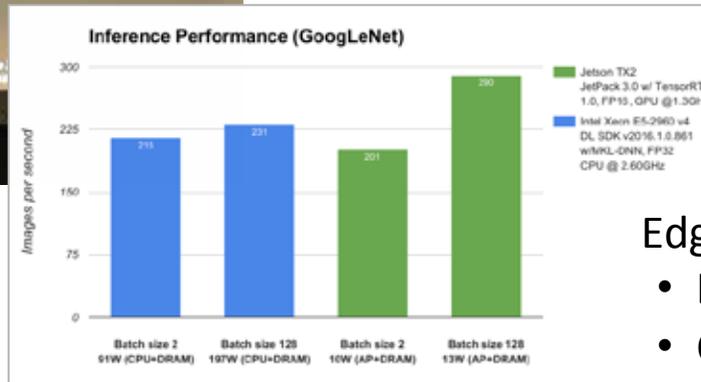
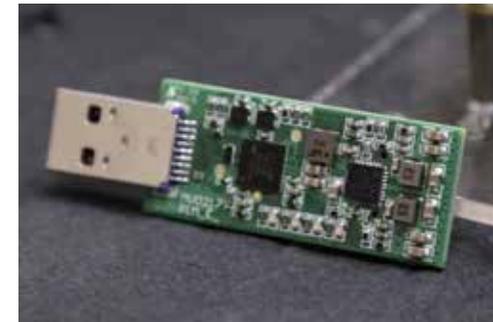


NVIDIA Jetson TX2 example:

- “AI at the edge”
- 256 Pascal cores
- ½ TF SP FLOPS



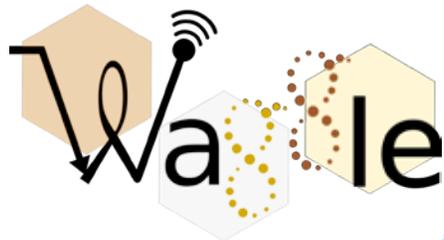
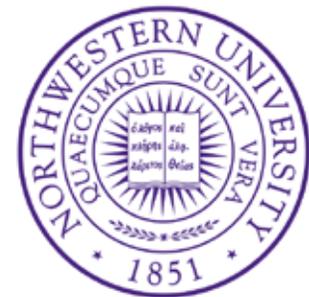
Intel/Nervana



Edge Processing common:

- Drones
- Car collision detection system
- Camera systems

Questions?



<http://www.wa8.gl>



<http://arrayofthings.github.io>

Pete Beckman: Argonne National Laboratory