



# Optimizing Camera Image Quality to Maximize Computer Vision Results

Dave Tokic

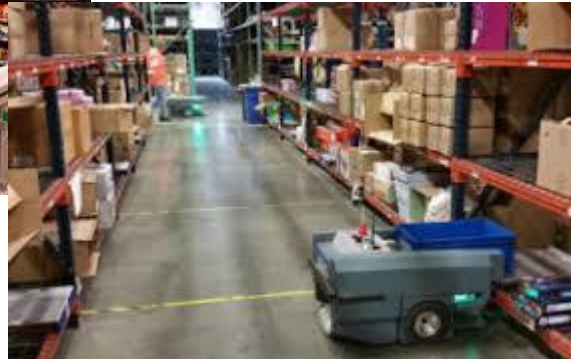
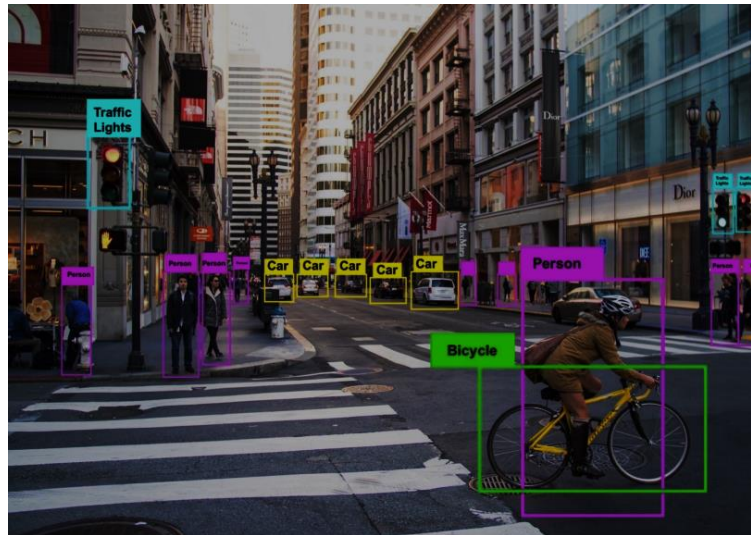
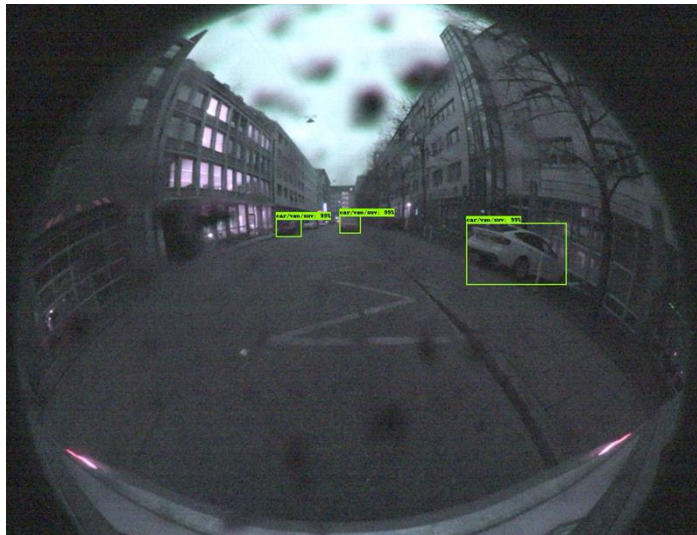
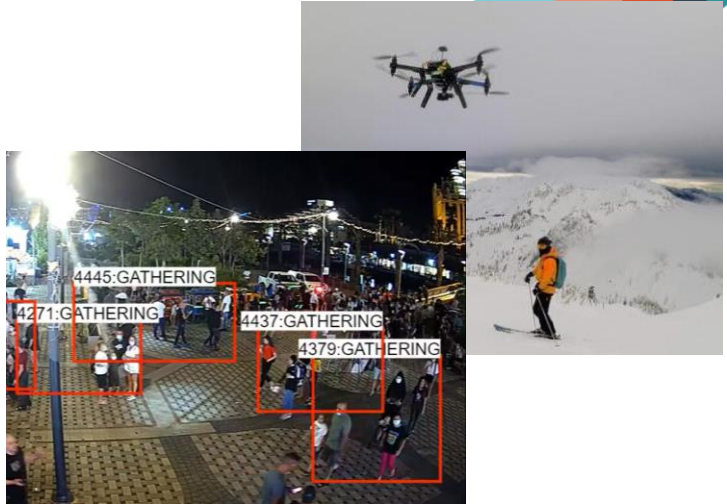
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# Unlimited Number of Computer Vision Applications!

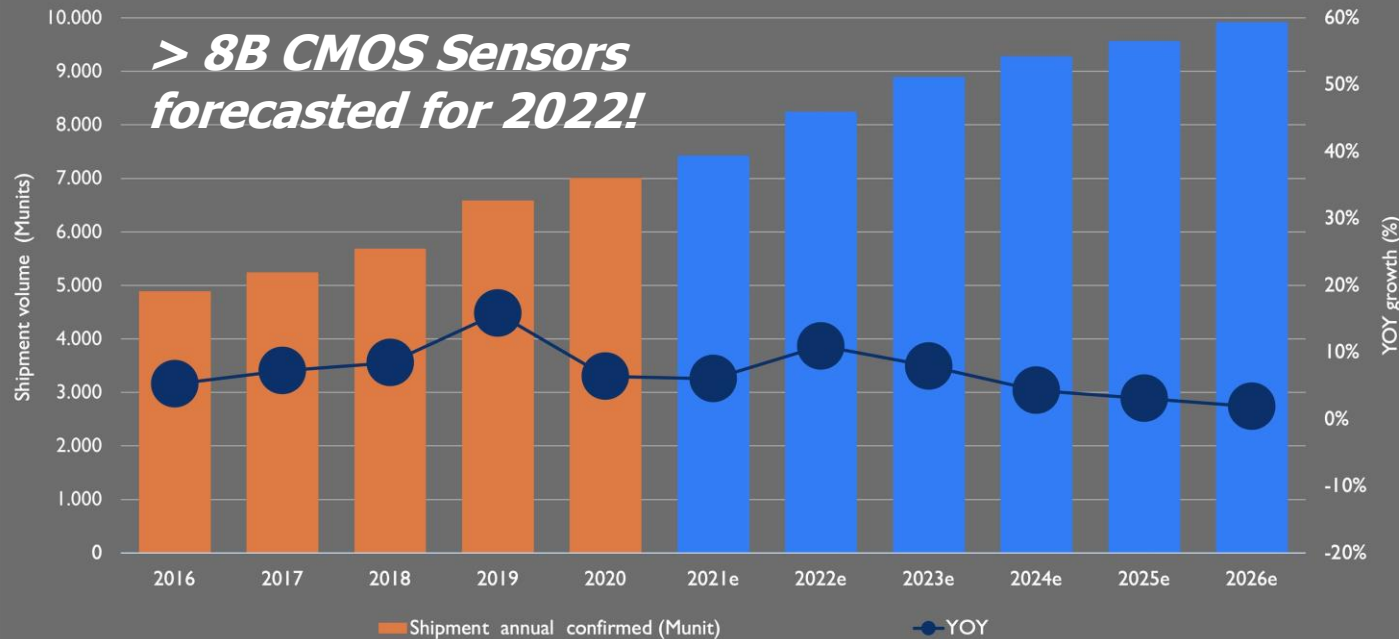


# Driven by a Massive Quantity of Image Sensors



## Yearly CIS industry shipments & future growth - Long term vision – In Million unit & %

(Source: CMOS Image Sensor Quarterly Market Monitor, Q2 2021, Yole Développement)



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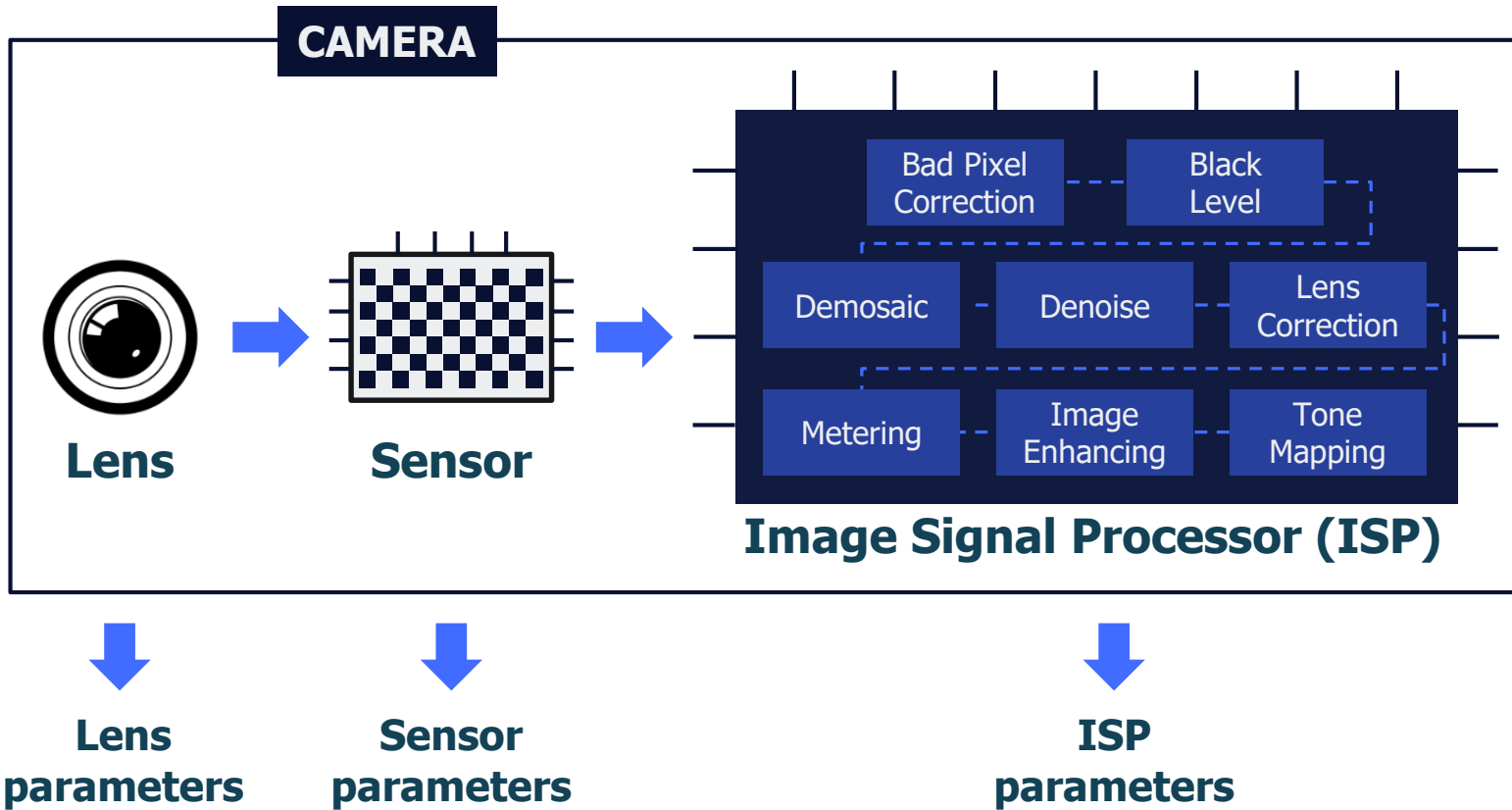
**... and democratization of computer vision development**

# But... What Problems Impact Vision Accuracy?

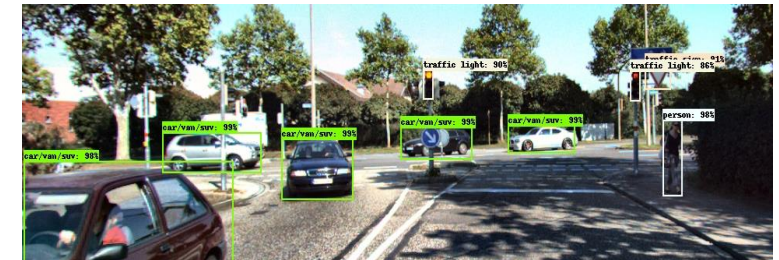


- Low / high light and bad weather
- Dynamic effects (motion blur...)
- Poorly tuned image signal processor (ISP)
- Annotation errors or training dataset quality
- Training datasets from different sensor modules
- ... **Cost of failure gets very large for safety-critical applications**

# Typical Camera System



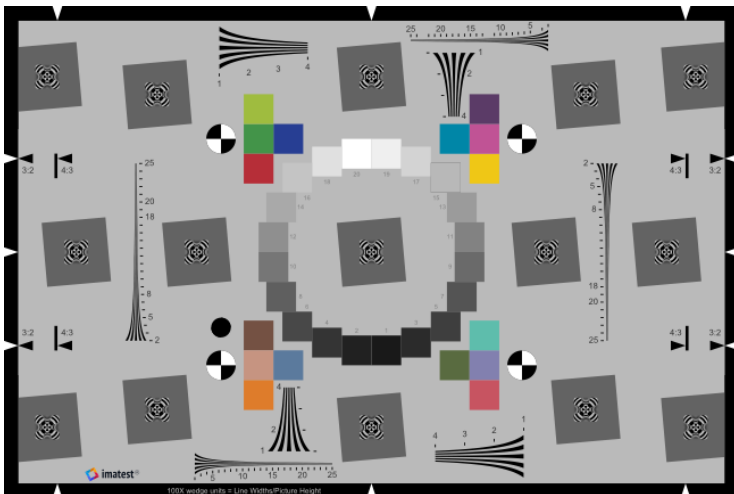
Display



Computer Vision Models

**Massive** parameter space controls the image quality for each camera configuration

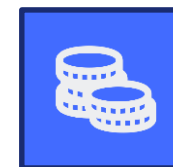
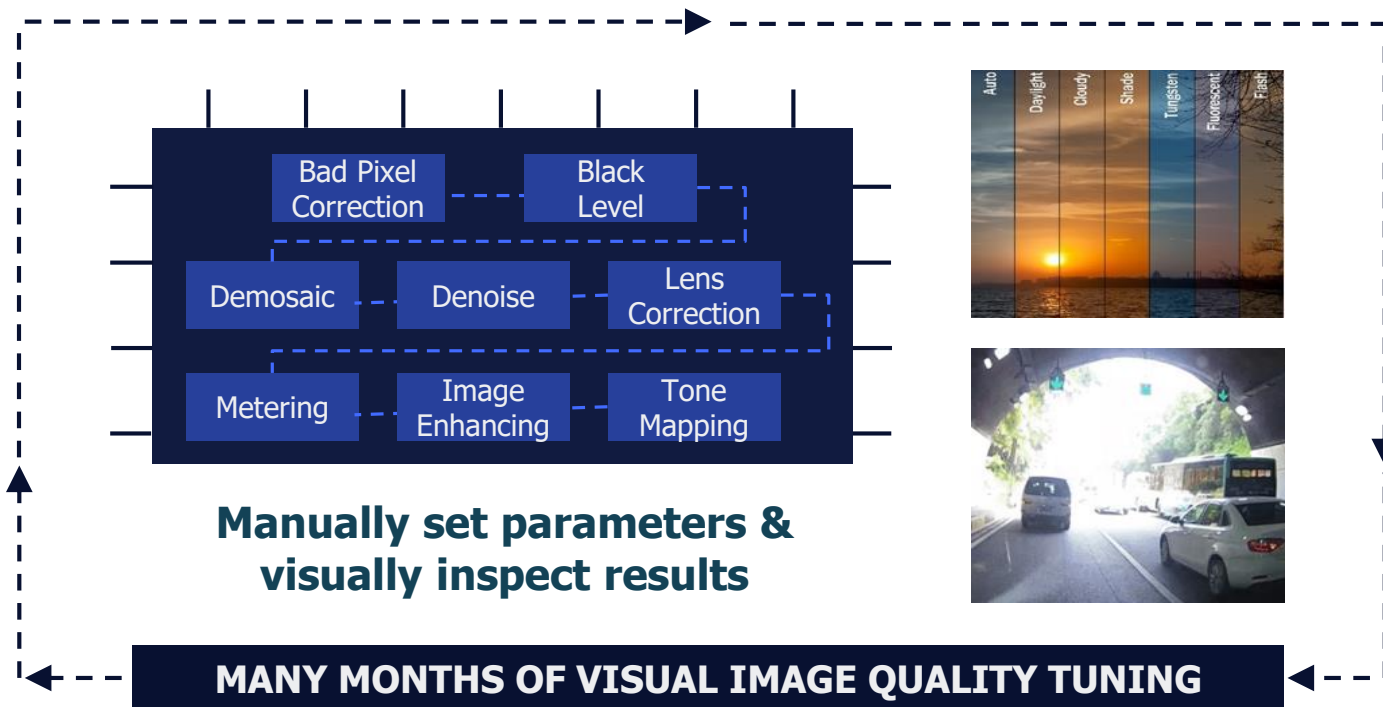
# Today's Manual ISP Image Quality Tuning Process



- ▼ Imaging lab setup
- ▼ ISP tuning tools setup
- ▼ Camera module calibration
- ▼ Initial setting, e.g. gamma, CCM, WB
- ▼ Iterate > AE / brightness, LTM, Contrast (gamma)
- ▼ Refine CCM / saturation
- ▼ Demosaic
- ▼ Iterate > Denoiser, sharpen
- ▼ Objective / subjective evaluation

DONE usually means "Good enough"

# Challenges with Today's Manual ISP Tuning



**Resource-intensive**  
Too much cost & time



**Inefficient**  
It doesn't scale to my projects



**Uncertain**  
"Good enough?"  
"How do I know?"



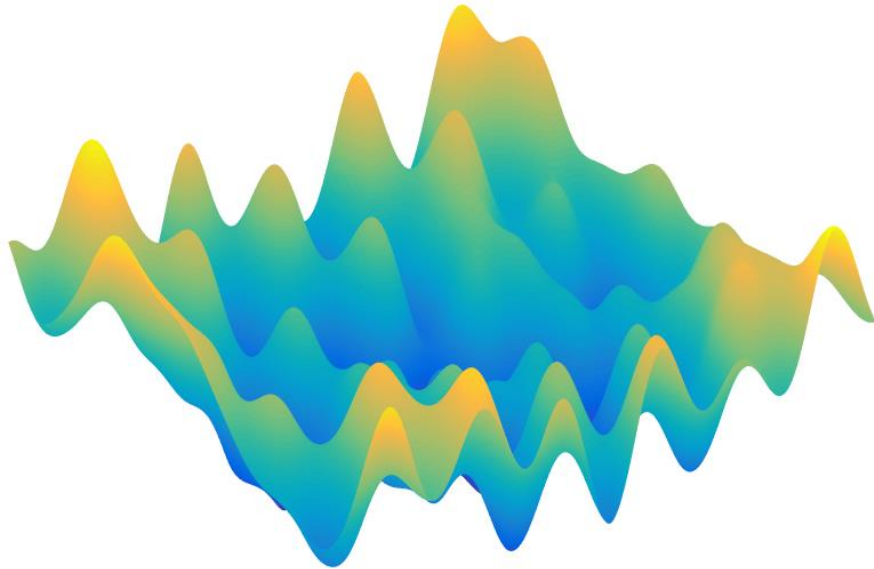
**Limited** – Manual ISP tuning is **“NOT effective for computer vision”**

*European Tier 1 Camera Team*

# Replacing Manual ISP Tuning with Automated Optimization



# But Aren't There Already Lots of Automation Tools?

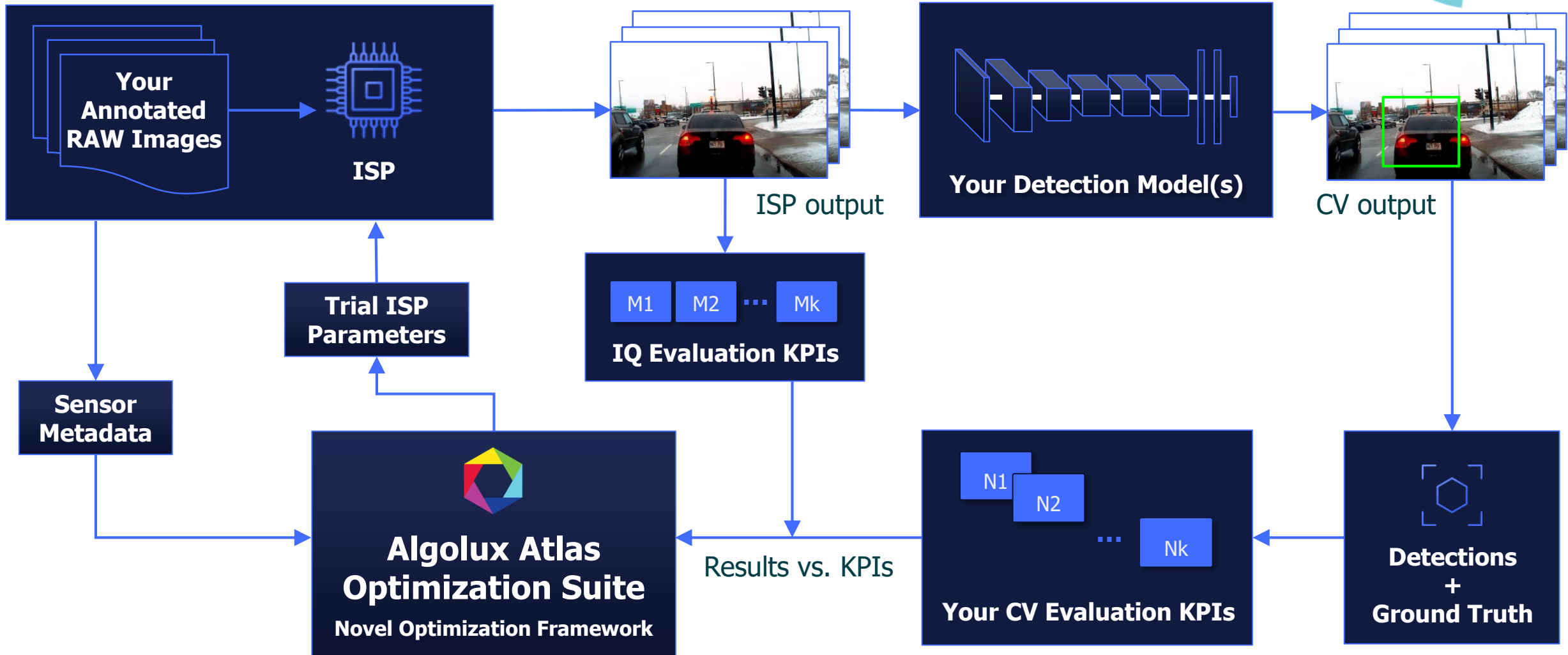


NO!

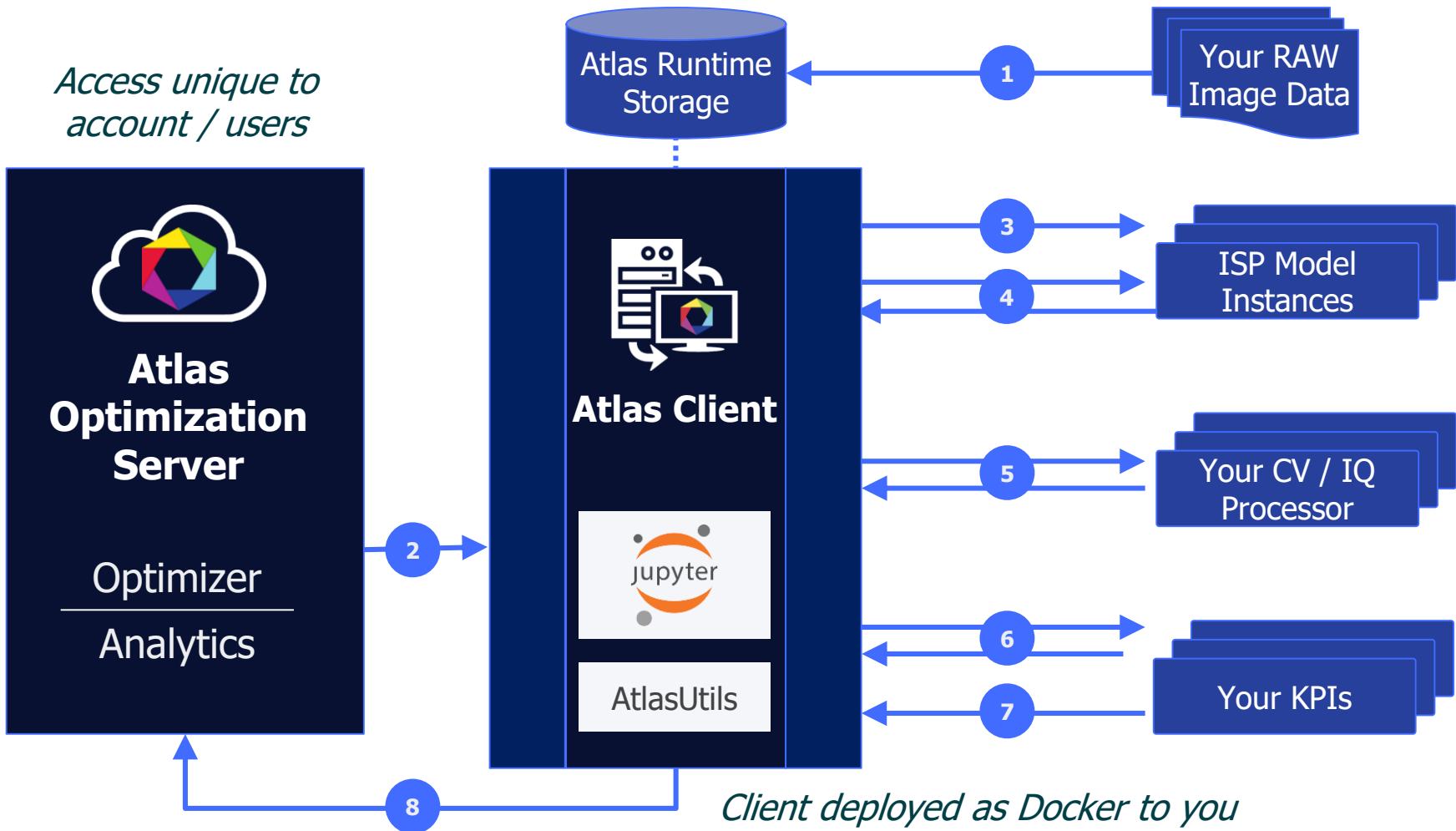
- Large number of parameters
- Highly non-convex ISP parameter space
- Multi-objective process for tuning
- Conflicting goals (e.g. sharpness vs. noise)
- Limited ISP tuning automation

Today's tools and workflows don't address this PAINFUL need

# Atlas Workflow for Image Quality and Computer Vision



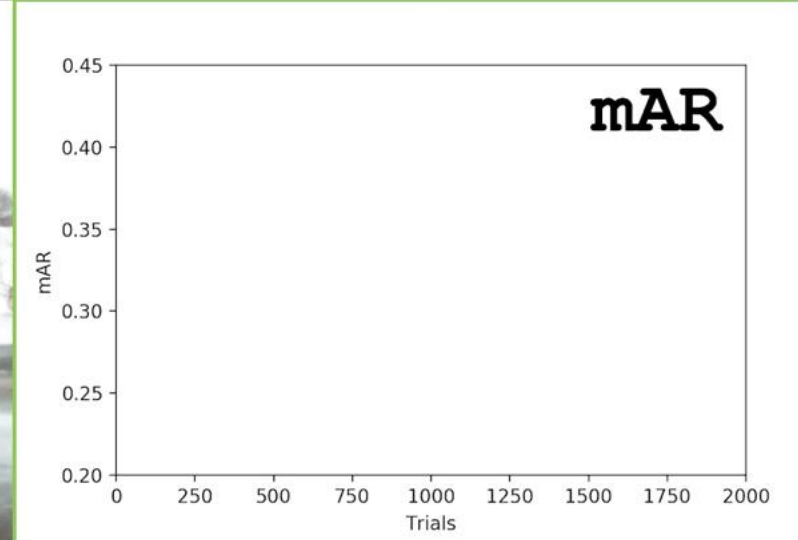
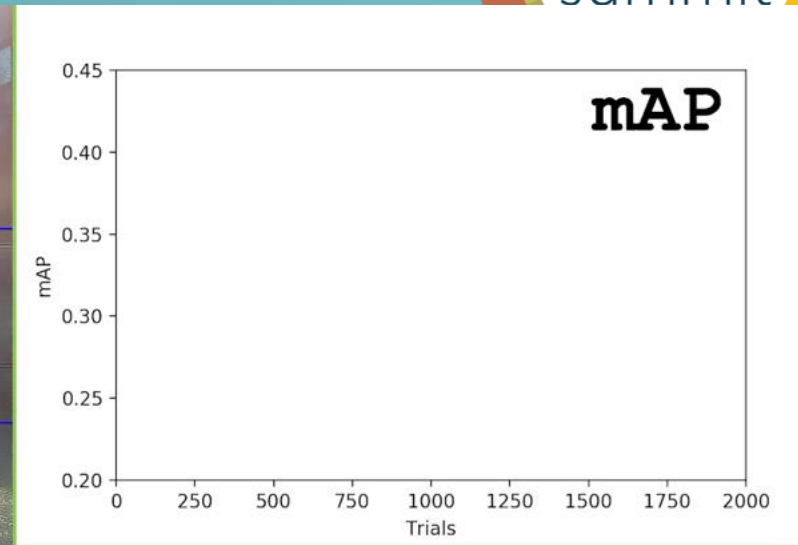
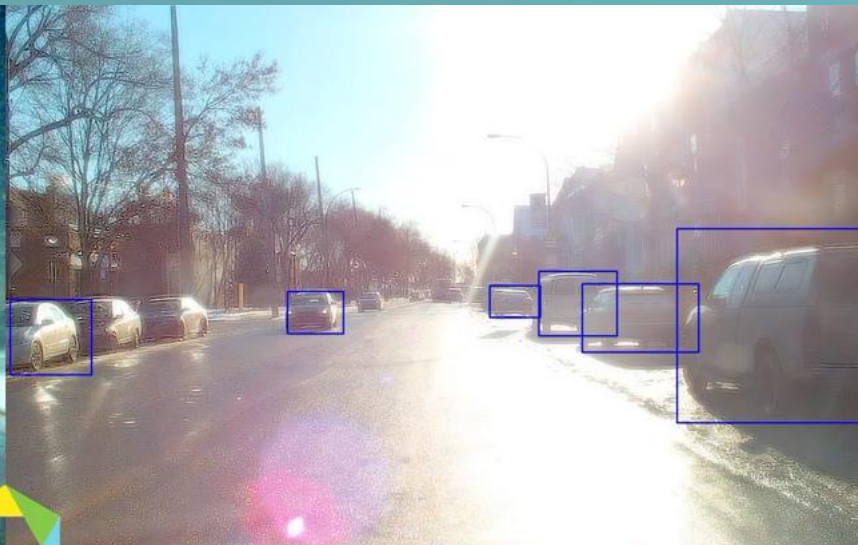
# Atlas Deployment and Workflow Operations



## Workflow:

1. Add RAW images to the Atlas Runtime Storage
2. Get ISP Parameters from Atlas Optimization Server
3. Set ISP Parameters
4. Process RAW Data with ISP Model Instances
5. Process ISP Output with CV/IQ Processors (e.g. CV algorithm)
6. Process CV/IQ Processor output with KPIs
7. Get KPI values
8. Send KPI values to Atlas Optimizer Server
9. Iterate

# Atlas Automated Optimization for Computer Vision

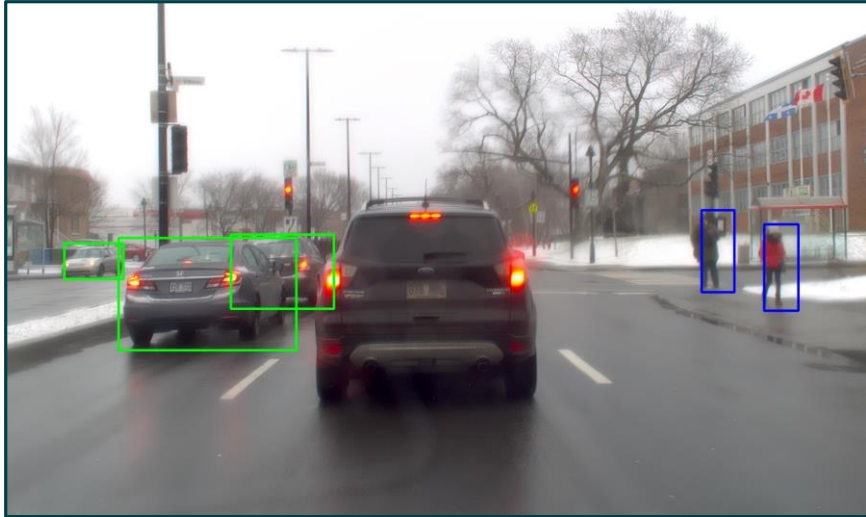


[Watch on YouTube](#)

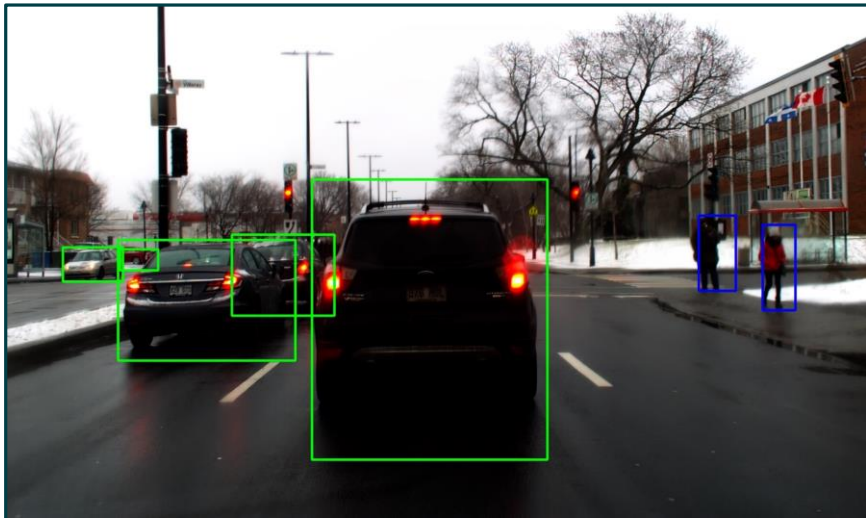
# Atlas Case Studies



Vision System	Configuration
ISP	<b>Renesas V3H:</b> 29 parameters optimized to maximize mAP for a range of sensor gains
Sensor	<b>ON Semi AR0231</b>   2.3M pixels CMOS   RGGB
CV Model 1	<b>YOLOv3 Object Detector</b> <ul style="list-style-type: none"> <li>Classes: Car, Pedestrian, Traffic Light</li> <li>Training dataset: COCO</li> </ul>
CV Model 2	<b>FR-CNN Resnet-101 Object Detector</b> <ul style="list-style-type: none"> <li>Classes: Car, Pedestrian</li> <li>Training dataset: KITTI</li> </ul>
CV Model 3	<b>FR-CNN Resnet-51 Object Detector</b> <ul style="list-style-type: none"> <li>Classes: Car, Pedestrian, Bike, Truck, Traffic Light, Traffic Sign</li> <li>Training dataset: Proprietary</li> </ul>

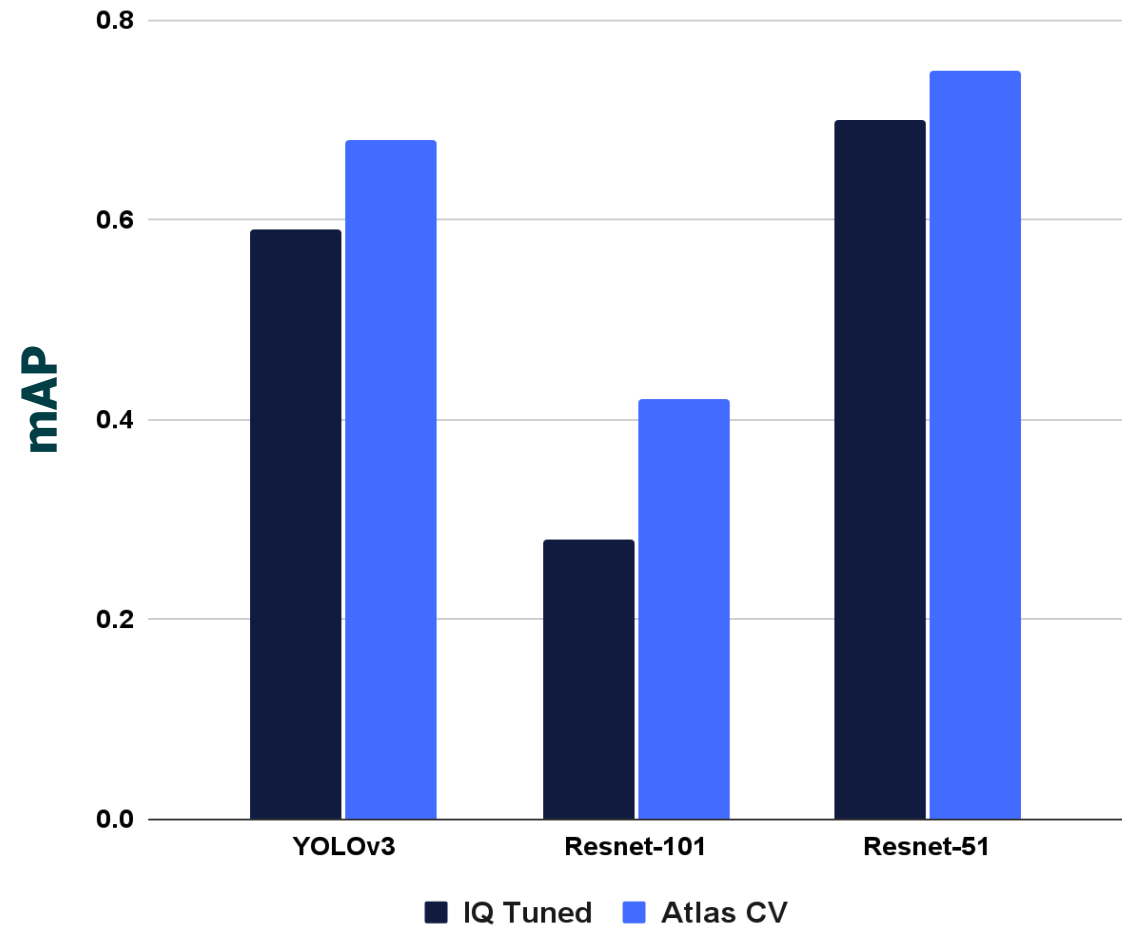


Before



After

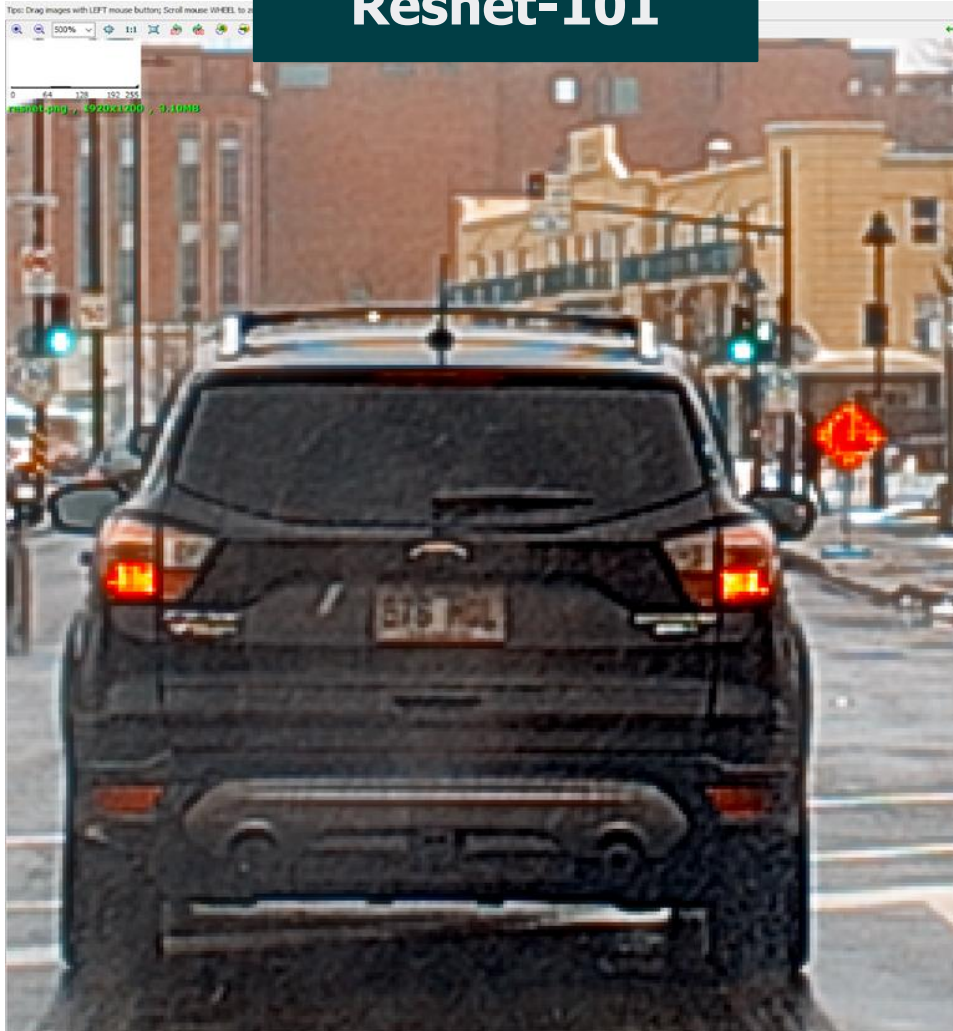
### Resnet-101 IQ Tuned vs. CV Optimized



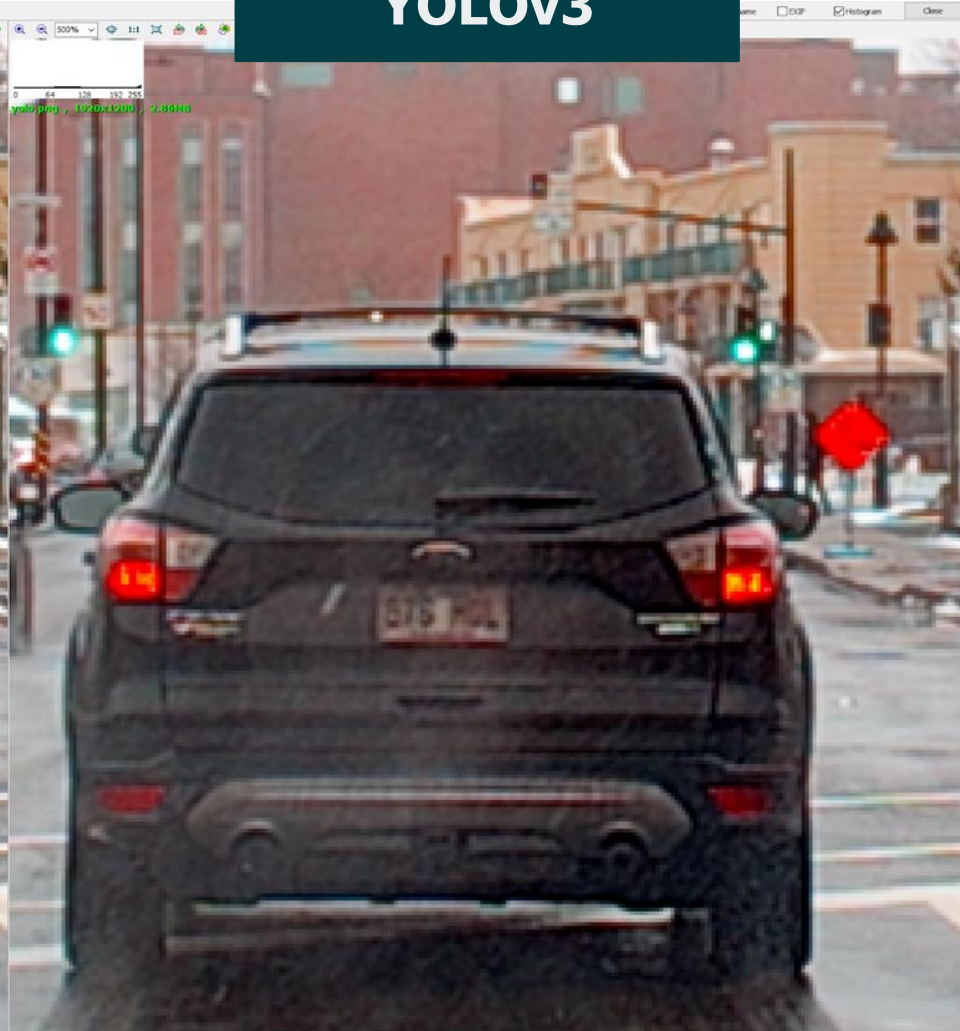
# Different Detectors → Different ISP Configs



Resnet-101



YOLOv3





## TDA4 ISP optimized to maximize mAP for a pre-trained YOLOv4 model

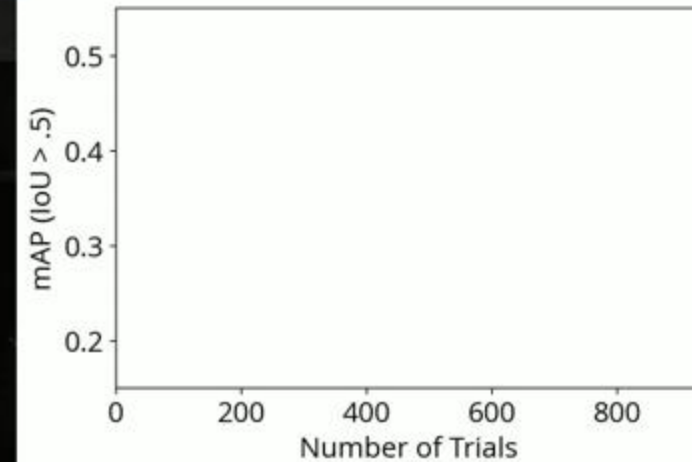


Vision System	Configuration
ISP	<b>TI TDA4VM:</b> 30 parameters optimized to maximize mAP for a range of sensor gains
Sensor	<b>Sony IMX490</b>   5.40M pixels CMOS   RGGB
CV Model 1	<b>YOLOv4 Object Detector</b> <ul style="list-style-type: none"> <li>Classes: Car, Pedestrian</li> <li>Training dataset: Proprietary</li> </ul>

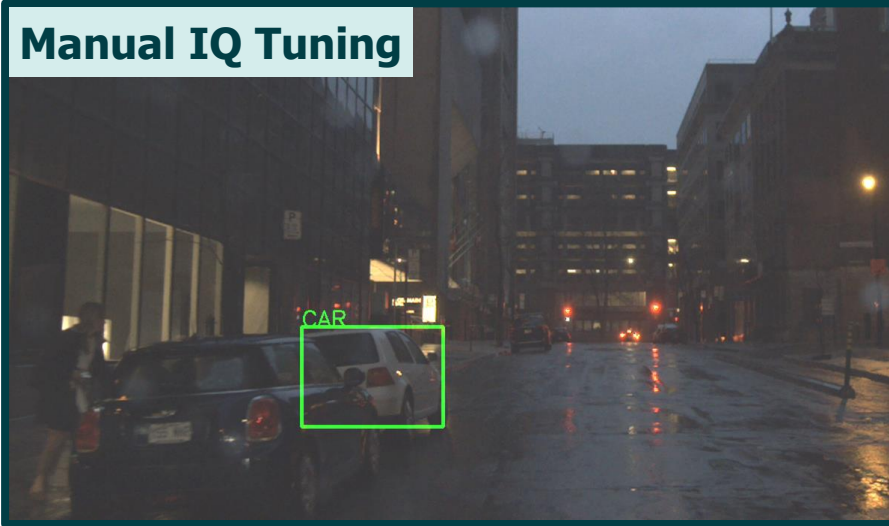


## Atlas Optimization Convergence

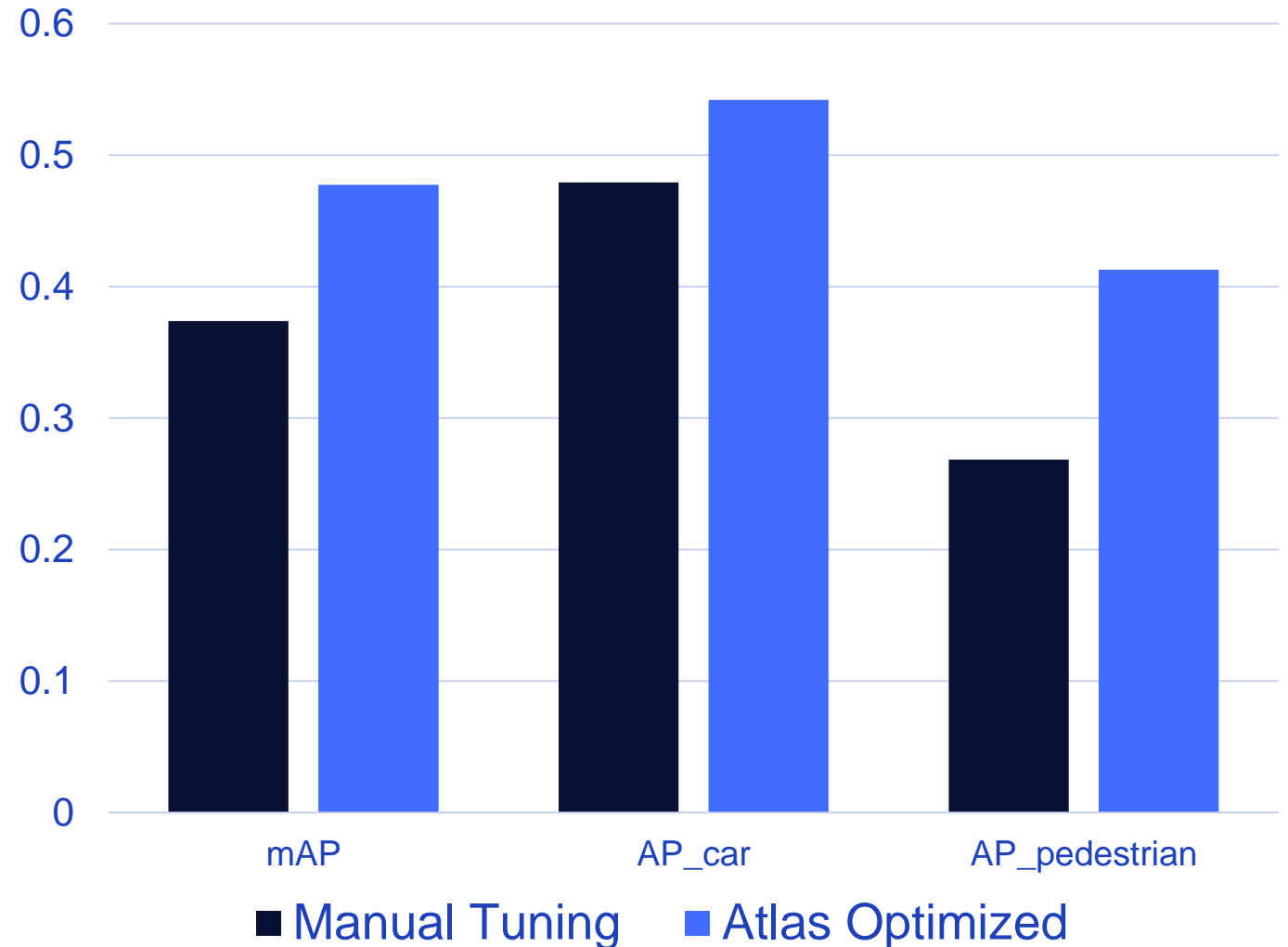
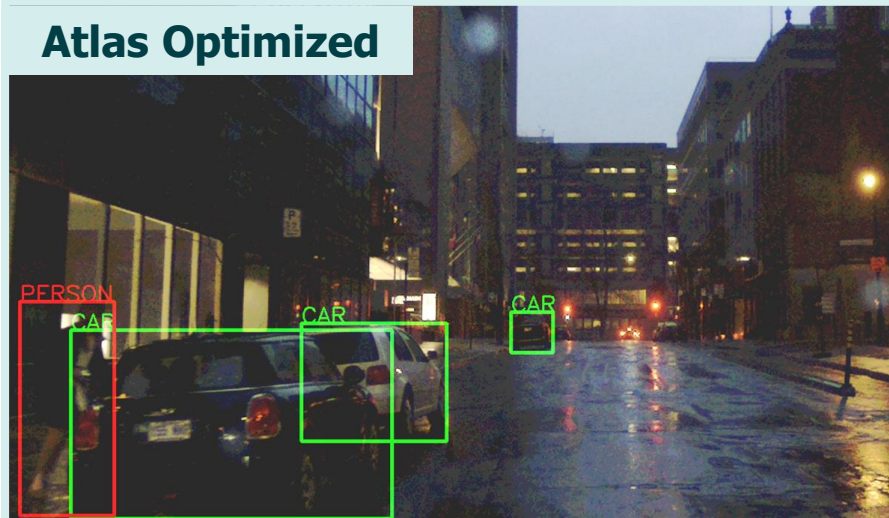
mAP = 0.3848  
detections = 413



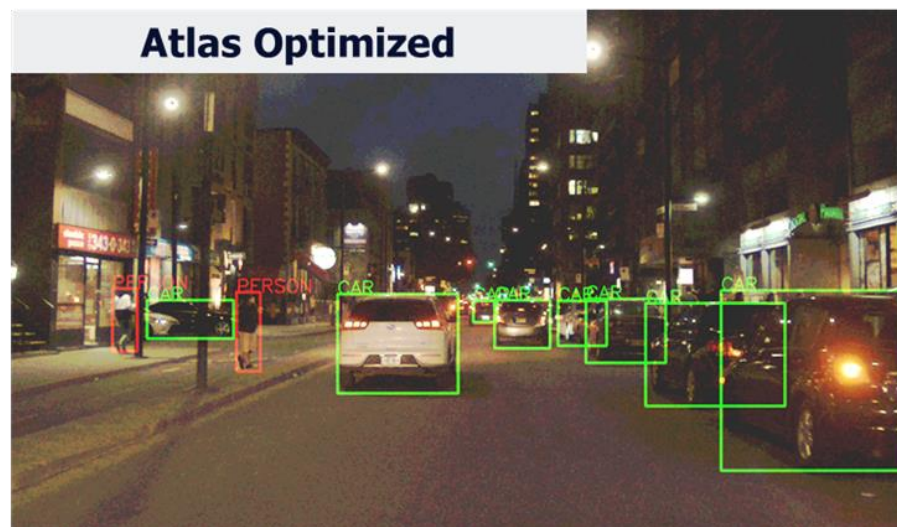
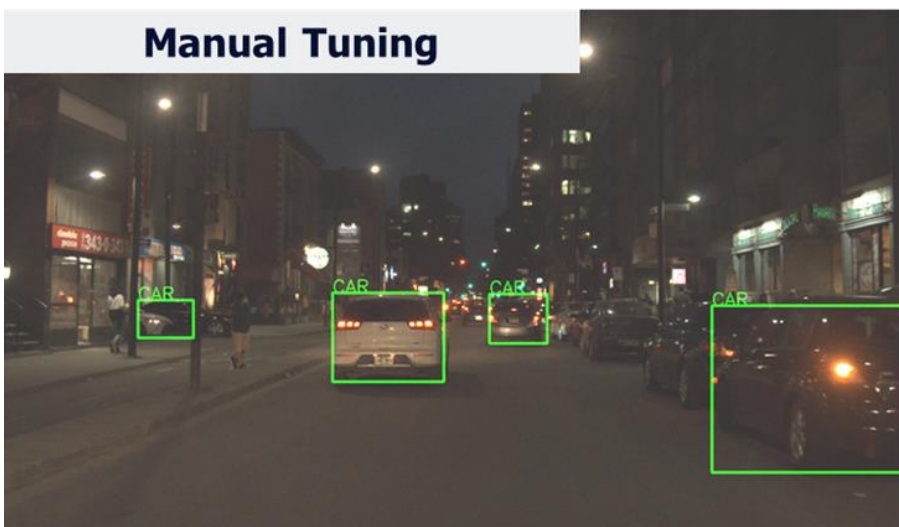
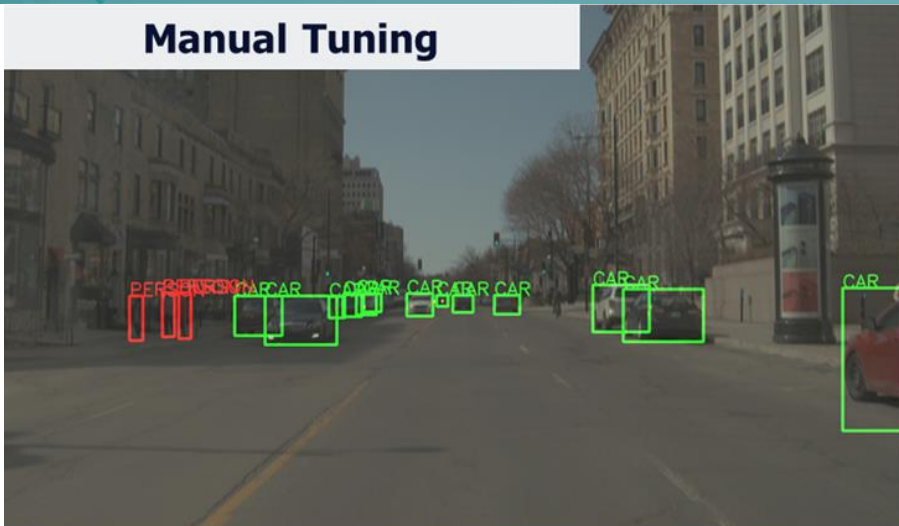
Manual IQ Tuning



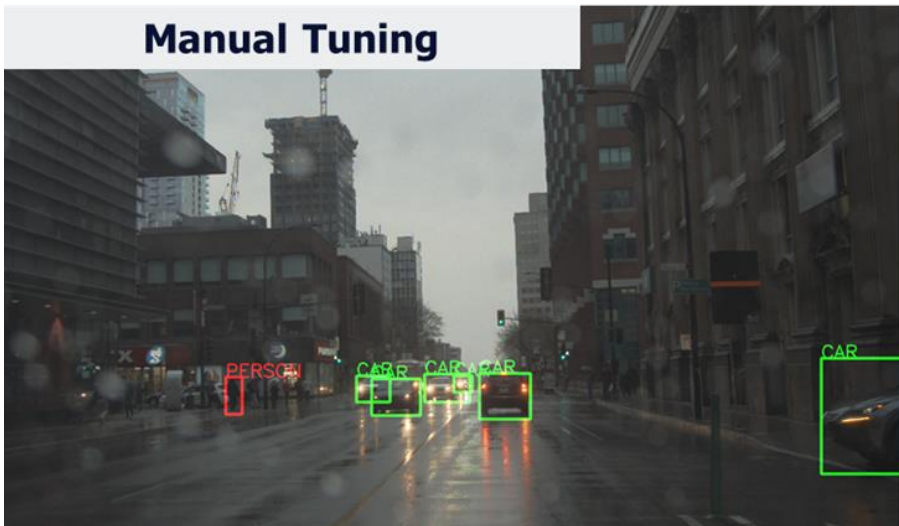
Atlas Optimized



# Atlas Optimization: Improved Results in High & Low Lighting



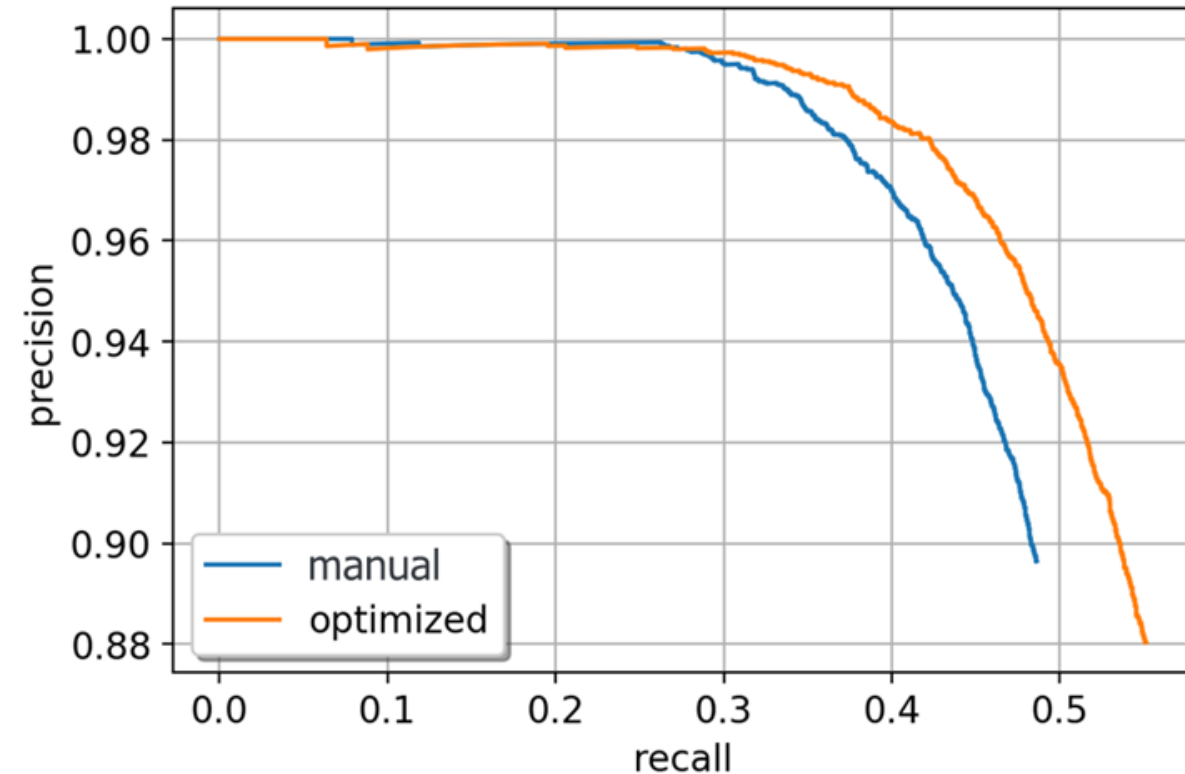
# Atlas Optimization: Improved Results in Low Light and Poor Weather



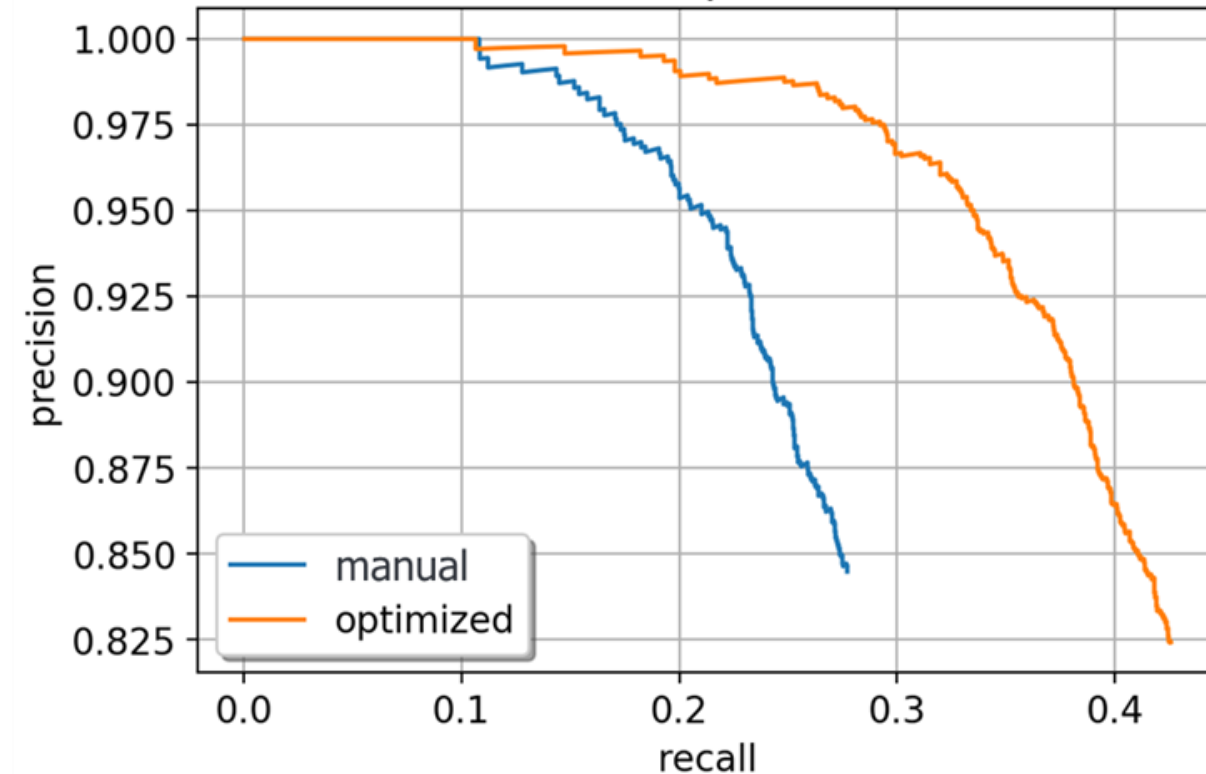
# Atlas Optimization Achieves Holistically Better Computer Vision Results



Precision x Recall curve  
Class: car



Precision x Recall curve  
Class: person



**Atlas-optimized ISP results outperform default ISP tuning throughout the confidence threshold**

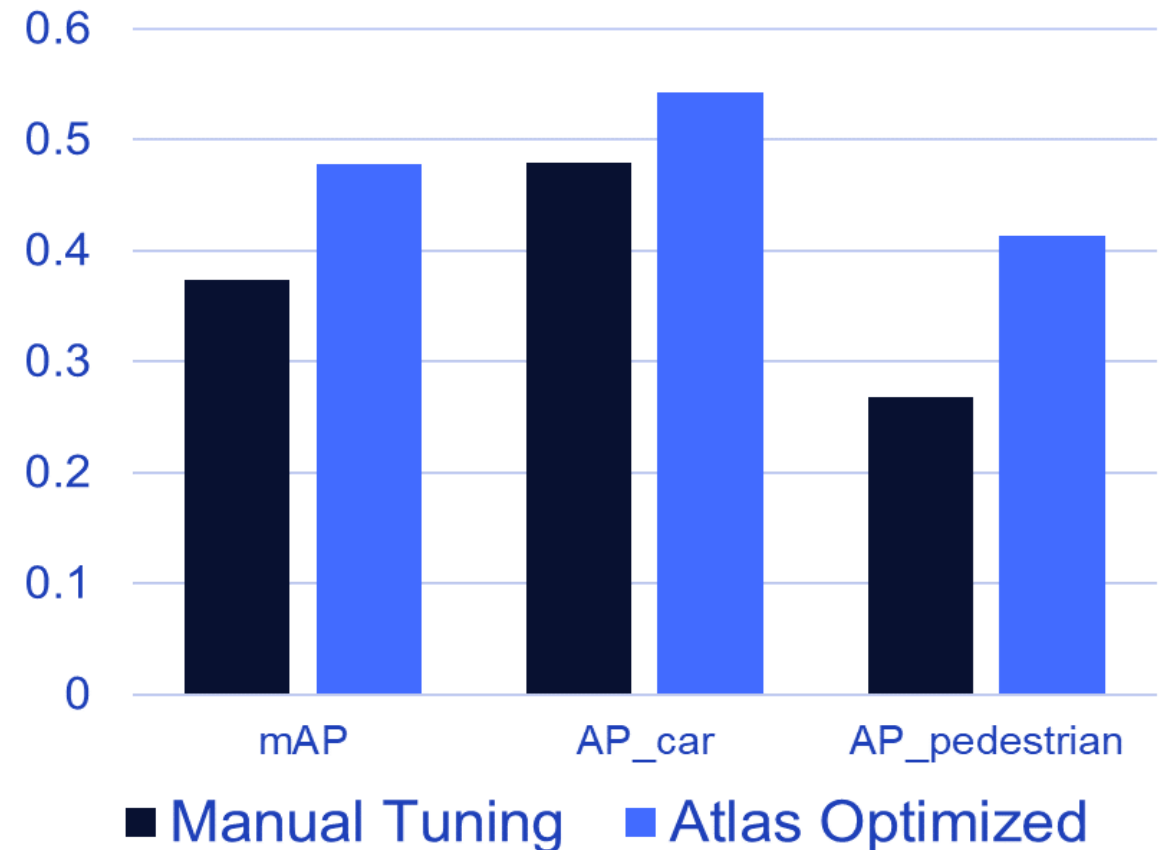
**Objective:** Maximize object detection results of a front facing ADAS camera by automatically optimizing TI TDA4 ISP camera parameters

### Camera configuration

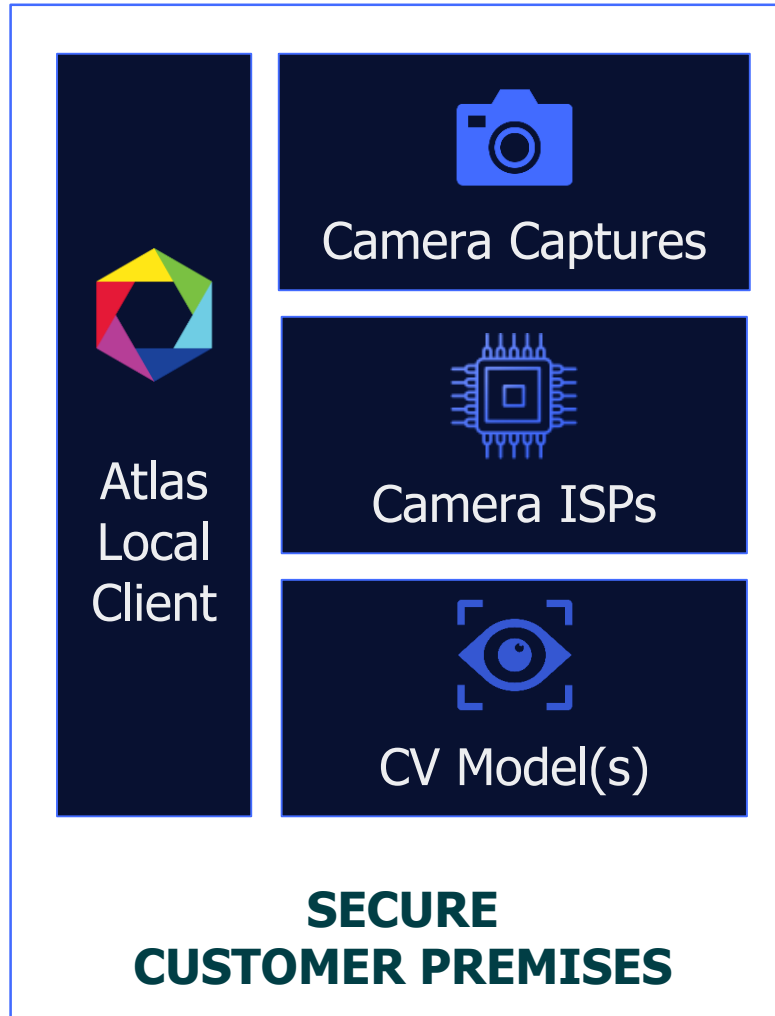
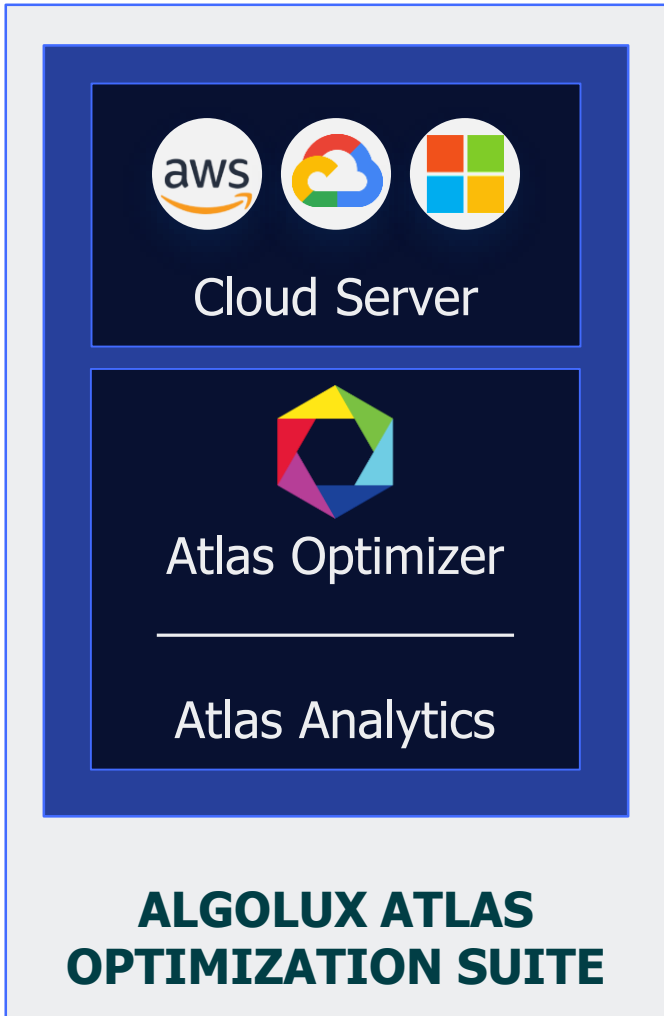
- TI TDA4VM SoC ISP
- Sony IMX490 5.44 MP HDR sensor
- YOLOv4 object detector

### Atlas results for YOLOv4 detector

- 10.4% mAP improvement vs. manual tuning
- Large 30 parameter space optimized
- Fast time to results: 1000 trials in ~48 hrs



# Conclusion: Algolux Delivers the Industry's First Automated ISP Optimization in the Cloud with Atlas



**Efficient**  
Get results in just days



**Scalable**  
Any CV task and camera



**Optimal**  
Maximize CV results



**Objective**  
Results driven by clear metrics



# Teaser: Taking Vision Robustness to the Next Level

*Eos Learned End-to-End Robust Detection and Multi-Camera Depth*



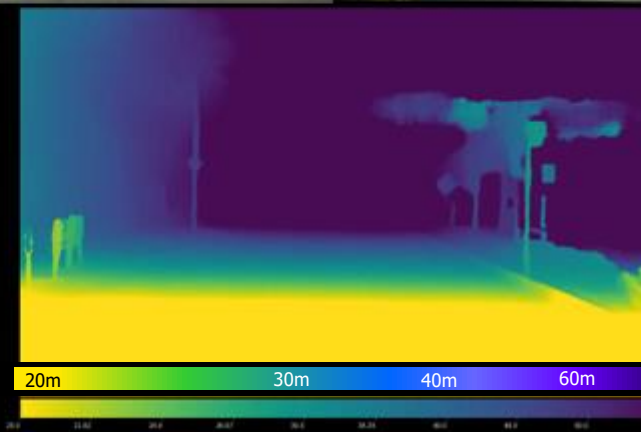
Dark Night



Foggy Night



Small Moving Object



Dark Night



## Resource Links

Algolux Edge AI & Vision Alliance page

- <https://www.edge-ai-vision.com/companies/algolux>

Algolux homepage

- <https://www.algolux.com>

Atlas ISP optimization case study with a leading automotive Tier 1

- [Atlas Case Study Link](#)

## 2022 Embedded Vision Summit

Visit us at Booth 613 and see the following Algolux demos:

- Atlas ISP Optimization Suite Evaluation Platform
- Eos Robust Embedded Perception Software

**Contact Algolux at [info@algolux.com](mailto:info@algolux.com)**