# Traffic Signal Detection and Recognition using computer vision and roadside camera

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# Outline

#### Introduction

- □ Literature Review
- □ Methodology
- Data Description
- Model Evaluation
- Conclusions
- References

### Introduction

Vehicle-Based Traffic Signal Information

- Traffic Sign Recognition (TSR) system
- Autonomous Driving



Roadside-Based Traffic Signal Information

- Automatic ATSPM (Automated Traffic Signal Performance Measure)
- CV2X SPaT (Signal Phase and Timing)



## Introduction

#### Background

- Traffic Signal Information is a crucial part for ITS and autonomous vehicles.
- Autonomous vehicle can perceive traffic signals using on-board camera sensor.
- Traffic signal data can be transmitted through CV2X communication (SPaT). However, that relies on infrastructure upgrade/maintenance/operation

Motivations:

- Advances in computer vision provides efficient tools for detecting traffic signals using roadside camera
- Support ATSPM and CV2X SPaT without significant infrastructure upgrade.

Research Objectives:

- Develop and implement methodologies for traffic signal recognitions using roadside CCTV camera
- Compare multiple state-of-the-art computer vision methodologies in traffic signal recognition

#### Literature Review

Vehicle-Based Traffic Signal Recognition

• Traditional image processing

Hough Transform, edge detection, etc (Omachi and Omachi, 2009) Color segmentation (Diaz-Cabrera et al., 2015, Wang et al., 2011)

• Two-step pipeline

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Object detection (Faster-CNN, YOLO)
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Color Recognition (PCA, SVM, color-threshold, YOLO classifier)

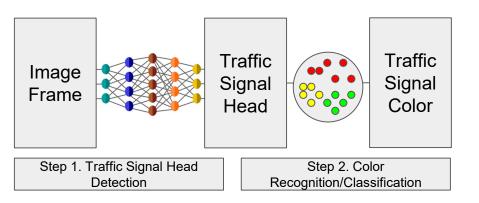
• End-to-end detection

Deep-learning based (Saker and Meng, 2022)

# Literature Review

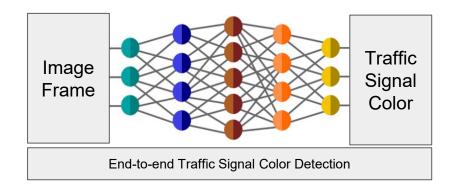
Two-step pipeline

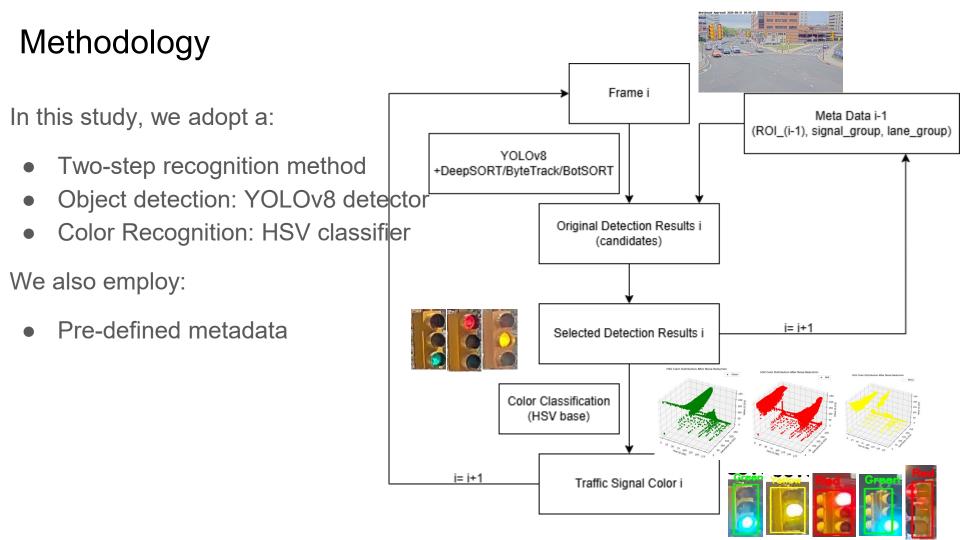
- Two separate models
- More modular, but more complex
- Needs coordination between stages
- Slower process speed
- Can separately diagnose detection and classification, easier to debug

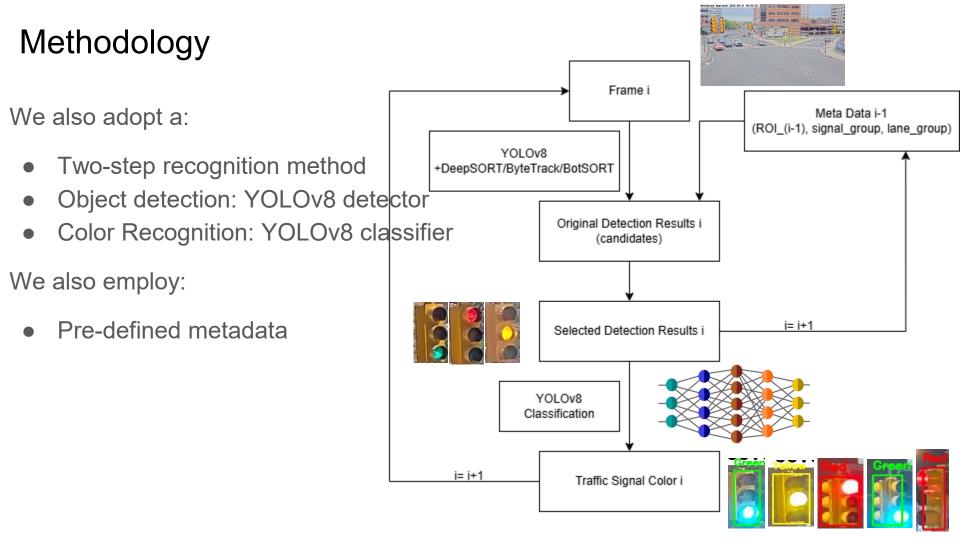


#### End-to-end detection

- Single model for detection and classification
- Simpler pipeline
- Straightforward
- Faster process speed
- Hard to isolate detection vs, classification errors, harder to debug







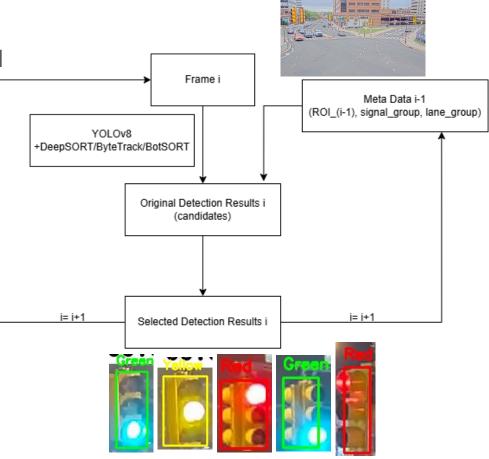
# Methodology

Additionally, we train an end-to-end model

• YOLOv8 object detection

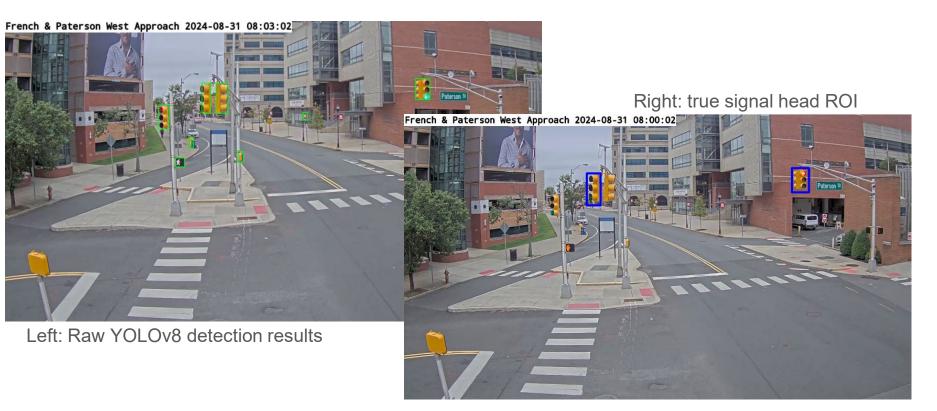
We also employ:

• Pre-defined metadata



# Methodology

The pre-defined metadata ROIs (Region of Interest) increase the detection reliability



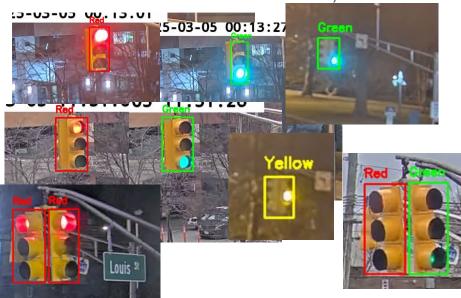
### **Data Description**

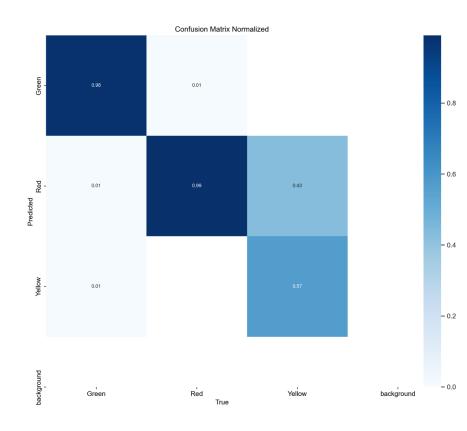
- This study utilizes video data from DataCity Smart Mobility Testing Ground
- 24 hours of video data
- Five signalized intersections
- Route 27 in New Brunswick, New Jersey.

Intersection Name	Signal Control Type	Phase Number	Cycle Length (s)	Albany & George East Approach 2024-01-31 01:00:02	Albay, & George North Apprach 2024-08-31 08:00:02
Albany & George	Responsive	2	80		
Albany & Easton	Fully Actuated	4	47-120	0	
French & Joyce Kilmer	Fully Actuated	3	35 - 101	Es though Apreset-2014-01-31 0-100-02	Wetbound Approach 2024-08-31 08:00:02
French & Paterson	Pre-timed	2	70		
French & Suydam/Louis	Semi-Actuated	2	76-110		

# Model Evaluation

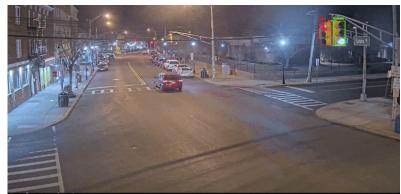
- Overall accuracy: 84.7%
- Per-Class accuracy:
  - Green: Precision: 98%, Recall: 98%
  - Red: Precision: 69%, Recall: 99%
  - Yellow: Precision: <u>98%, Recall: 57</u>%







Intersection: French@Paterson, Timestamp: 1741174707257 Signal Group: 2, Color: Red Intersection: French@Paterson, Timestamp: 1741174707293 Signal Group: 2, Color: Red



Signal Group: 2, Color: Red Intersection: French@Suydam, Timestamp: 1741158037933 Signal Group: 1, Color: Green Signal Group: 2, Color: Red Intersection: French@Suydam, Timestamp: 1741158037966 Signal Group: 1, Color: Green Signal Group: 2, Color: Red Intersection: French@Suydam, Timestamp: 1741158037999 Signal Group: 1, Color: Green



Signal Group: 1, Color: Green Intersection: French@Joyce, Timestamp: 1741174214633 Signal Group: 2, Color: Green Signal Group: 1, Color: Green Intersection: French@Joyce, Timestamp: 1741174214666 Signal Group: 2, Color: Green



Intersection: Albany@George, Timestamp: 1741176069266 Signal Group: 2, Color: Red Signal Group: 2, Color: Red Intersection: Albany@George, Timestamp: 1741176069299 Signal Group: 2, Color: Red Signal Group: 2, Color: Red Intersection: Albany@George, Timestamp: 1741176069333

#### Conclusions

- This study compared multiple cutting-edge detection methods for traffic signal detection and recognition
- The proposed method takes advantage of roadside camera to further enhance the object detection reliability
- The proposed method reaches an overall accuracy of 84.7%
- The proposed method supports real-time traffic signal data logging and transmission for potential ATSPM and CV2X applications

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# Thank You

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