# Enhancing the Interconnectedness of Open Data, Traffic Engineering, and City Planning Through Utilization of Available Data

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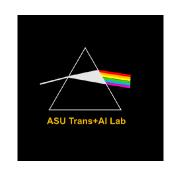
School of Sustainable Engineering and the Built Environment

https://github.com/asu-trans-ai-lab

**Arizona State University** 



Prepared for TRB Webinar: State-of-the-Art Traffic Signal Simulation Tools and Platforms Sponsored by TRB's Standing Technical Committee on Traffic Signal Systems March 15, 2023



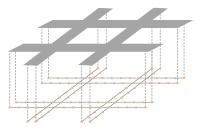
#### **Outline**

### I. Open DataSpecification

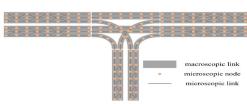


### II. Open-Source Tools and MRM Community

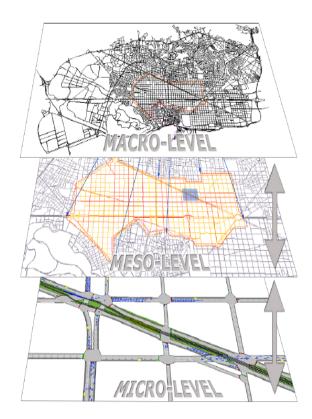
Macroscopic Layer



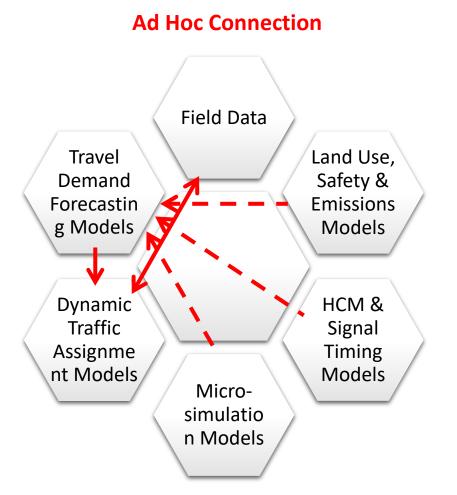
Microscopic Mesh Layer



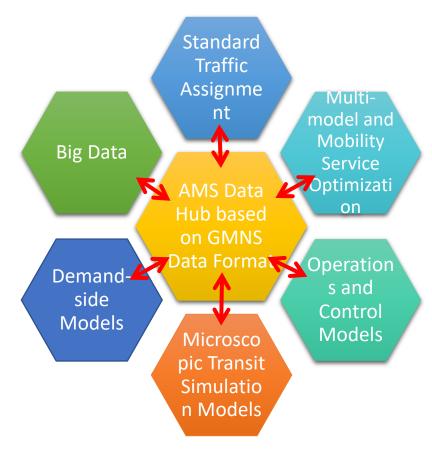
### III. Network Simulation Prospective and Case Studies



#### Critical Challenges for Transportation Analysis Modeling and Simulation (AMS) Data Hub



#### **Systematic Coupling**

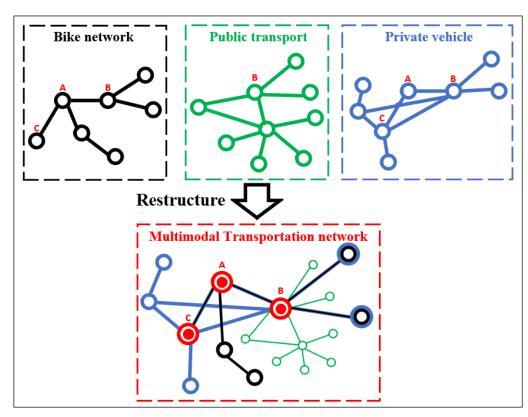


AMS Data Hub for Transportation Planning Applications

Source: Nevers, Brandon L., et al. *The effective integration of analysis, modeling, and simulation tools.* No. FHWA-HRT-13-036. United States. Federal Highway Administration. Office of Operations Research and Development, 2013.

#### **Specific Challenges in Building Model Specifications**

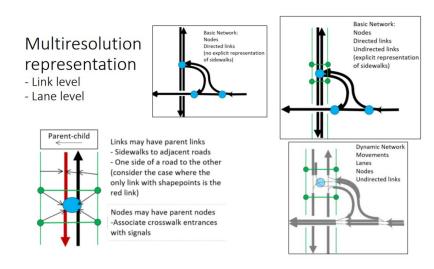
- 1. Requiring more specific information
- 2. A wide range of ways to code multimodal network with real-world requirements
- 3. Non-trivial data structure even for essential information
- 4. Network manipulation is not being standardized
- 5. Different data format options
- 6. Limited recent activities in bicycle or pedestrian network model standardization
- Needs for cross-mode standards to ensure complete trip interoperability



Multimodal network representation

#### **Introducing General Modeling Network Specification (GMNS)**

- The objective of the GMNS is to provide a common human and machine-readable format for sharing routable road network files.
- The project is overseen by a project management group, with MPO, city, industry, academic and US DOT participation.
  - github.com/zephyr-data-specs/GMNS



Source: Volpe Center GMNS team Scott.Smith@dot.gov Ian.Berg@dot.gov

#### Movements at an intersection

Link Level

- Lane Level (for the northeast approach)
- Movement attributes
  - Node
  - · Inbound link and lane(s)
  - · Outbound link and lane(s)
  - Type of Movement
    - · left, right, thru, merge, uturn
  - Type of control
    - no\_control, yield, stop, stop\_2\_way, stop\_4\_way, signal
  - Optionally
    - Right-turn-on-red
    - Penalty
    - Capacity
    - Pct Green Time

#### Governance

This project is overseen by a board-approved Project Management Group (PMG) as follows:

• Joe Castiglione, SFCTA (chair, board representative)

Permitted movements may also be time-of-day specific

- Michael Mahut, INRO
- Wu Sun, SANDAG
- · Guy Rousseau, ARC
- Chetan Joshi, PTV
- · Jeff Frkonia, Portland Metro
- · Scott Smith, Volpe
- Natalia Ruiz Juri, University of Texas Center for Transportation Research
- Song Gao, UMass Amherst

#### **GMNS Format (Node and Link)**

#### **Basic Data Elements**

- node
- link
- geometry
- zone

name	node_id	osm_node	osm_highv	zone_id	ctrl_type	node_type	activity_typ	is_boundar	x_coord	y_coord	main_node	poi_id	notes
	0	41459438			0				-111.928	33.4245			
	1	41520512			0				-111.944	33.42547			
	2	41520515			0				-111.944	33.42432			
	3	41520518			0				-111.944	33.42318			
	4	41520521	traffic_sign	als	1				-111.944	33.42189			
	5	41520523			0				-111.944	33.42064			
	6	41520525			0				-111.944	33.42035			
	7	41520528			0				-111.944	33.4194			
	8	41520531			0				-111.944	33.41892			
	9	41520533			0				-111.944	33.41778			

#### node.csv

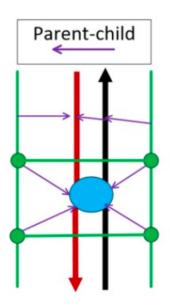
name	link_id		osm_way_i	from_node	to_node_ic	dir_flag	length	lanes	free_speed	capacity	link_type_n	link_type	geometry	allowed_us	from_biwa
South Farn		0	5590095	13	14	1	81.57798	1	25		residential	6	LINESTRIN	auto	1
South Farn		1	5590095	14	13	1	81.57798	1	25		residential	6	LINESTRIN	auto	1
South Farn		2	5590095	14	15	1	80.16146	1	25		residential	6	LINESTRIN	auto	1
South Farn		3	5590095	15	14	1	80.16146	1	25		residential	6	LINESTRIN	auto	1
South Farn		4	5590095	15	16	1	240.2824	1	25		residential	6	LINESTRIN	auto	1
South Farn		5	5590095	16	15	1	240.2824	1	25		residential	6	LINESTRIN	auto	1
South Farn		6	5590095	16	17	1	84.15426	1	25		residential	6	LINESTRIN	auto	1
South Farn		7	5590095	17	16	1	84.15426	1	25		residential	6	LINESTRIN	auto	1
South Farn		8	5590095	17	18	1	83.10715	1	25		residential	6	LINESTRIN	auto	1
South Farn		9	5590095	18	17	1	83.10715	1	25		residential	6	LINESTRIN	auto	1

link.csv

#### **Multimodal Accommodation in GMNS**

The **allowed\_uses** field indicates what may flow on a **link** or **lane** (e.g., walk, bike, bus, truck, auto, hov2, hov3+), as well as non-travel uses (shoulder, parking)

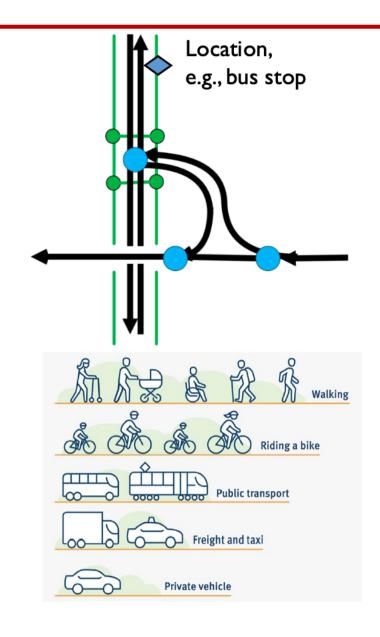
**Location**—a point that is associated with a specific location along a link, using a linear reference



Links include fields for
ped\_facility,bike\_facility.

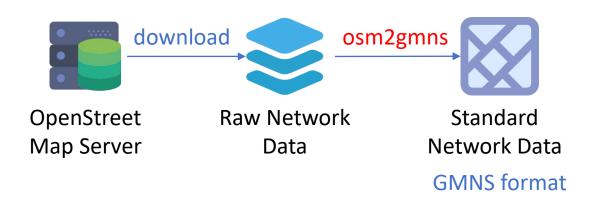
Sidewalks and crosswalks may optionally be handled via their own undirected links. Parent-child relationships:

- Sidewalk with associated road
- Crosswalk and intersection nodes
   Separated bike facilities may also be
   handled as their own pairs of directed links



#### Open Data Source: OpenStreetMap

OpenStreetMap (OSM) is a free, open-source, editable map website that can provide free downloads. osm2gmns, as a data conversion tool, can directly convert the OSM map data to node and link network files in GMNS format. Users can convert and model drivable, walkable, railway, or aero way networks with a few lines of Python code.



#### Findings: High Map Accuracy across 30 Cities\*

	% of tags correct in OSM
Road class	98.6%
Road directionality	98.9%
Road names	99.8%
Intersection restrictions (Turn Restrictions)	94%
On/Off Ramp Signage	89%
Destination Signage	88%
Lane counts	66.8%

We found that core features of OpenStreetMap roads are correct more than 95% of the time relative to what exists in the real world. Data critical to safe navigation, such as left turn restrictions, are correct more than 85% of the time.

Nationwide, these estimates are precise to within 5% sampling uncertainty. The regional uncertainty varies more based

on region-level dynamics, visible in the figures at the end of this post.

Source: https://osm2gmns.readthedocs.io/

Source: https://eng.lyft.com/how-lyft-discoveredopenstreetmap-is-the-freshest-map-for-rideshare-a7a41bf92ec

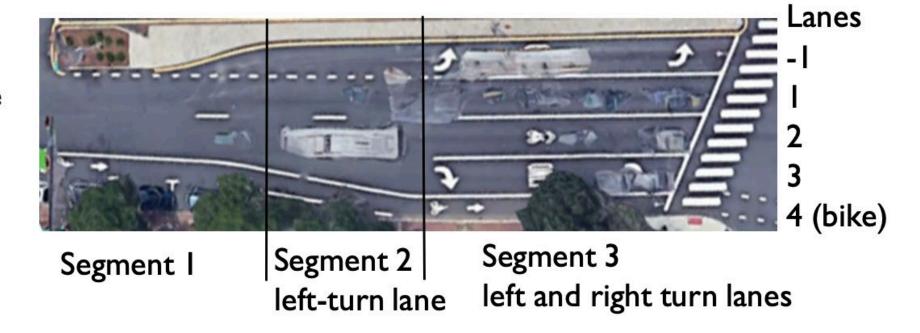
#### **GMNS Format (Segment, Lane, Signal Timing)**

#### **Segments and Lanes:**

**Segment**—portion of a link defined by linear references

**Lane**— Lanes are numbered left to right with 1 as the left-most through lane. Left turn lane is -1. A bike lane is a lane with allowed uses = BIKE

Turn pockets are defined via segments.

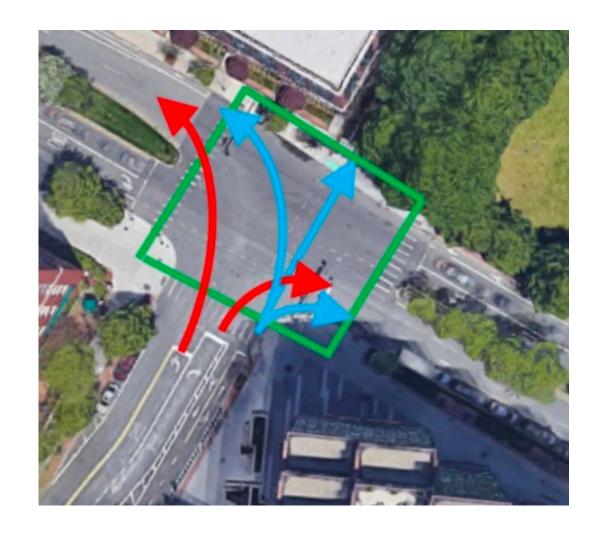


#### **GMNS Format (Movement)**

 Movements define connections and traffic control types (none, yield, stop, signal) between inbound and outbound links or lanes at an intersection.

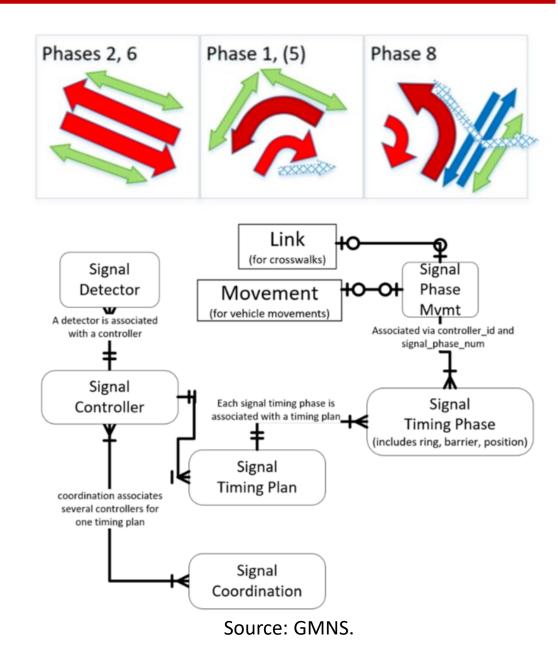
#### • Example:

- Pedestrian movements in green
- General traffic (red) and bike (blue)
   movements are shown from the south



#### **GMNS Format (Traffic signal)**

- **Signal\_controller** association of one or more intersections whose signals use the same controller
- **Signal\_phase\_mvmt** signal\_phase mapped to its associated traffic movements and pedestrian links (e.g., crosswalks)
- **Signal\_timing\_phase** timing and concurrency information for each signal phase
- **Signal\_timing\_plan** timing plan for the signal, by controller, time period
- **Signal\_coordination** coordination for several signal controllers, associated with a timing plan
- **Signal\_detector** traffic detector associated with a controller, a phase and a group of lanes



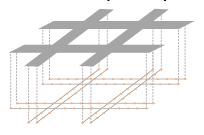
#### **Part II: Open-Source Tools and MRM Community**

### I. Open DataSpecification

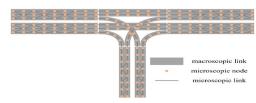


### II. Open-Source Tools and MRM Community

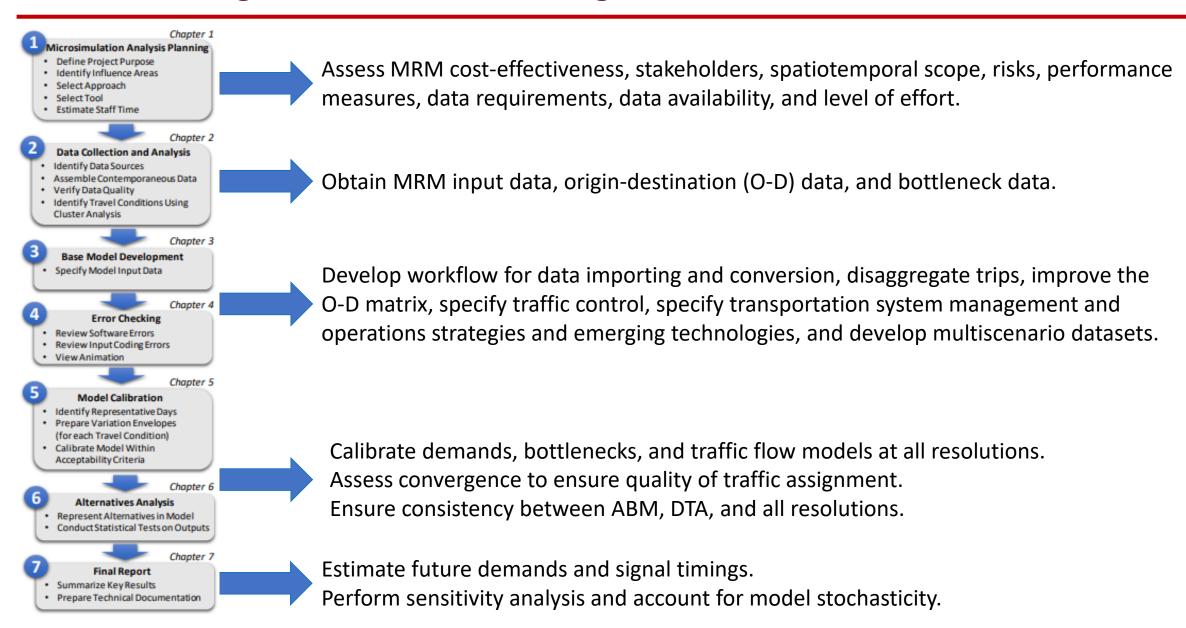
#### Macroscopic Layer



#### Microscopic Mesh Layer



#### **General Modeling Microsimulation Modeling Procedure**

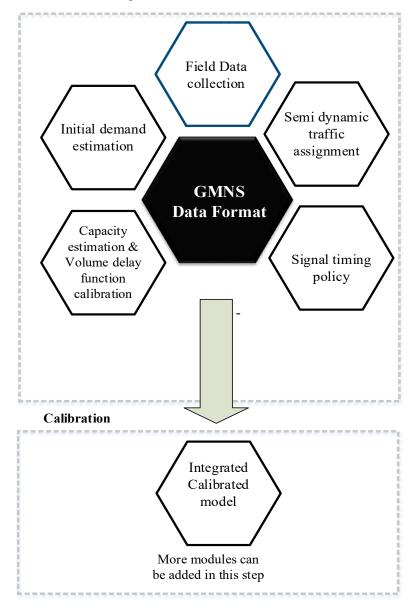


Source: FHWA. (Wunderlich et al. 2019)

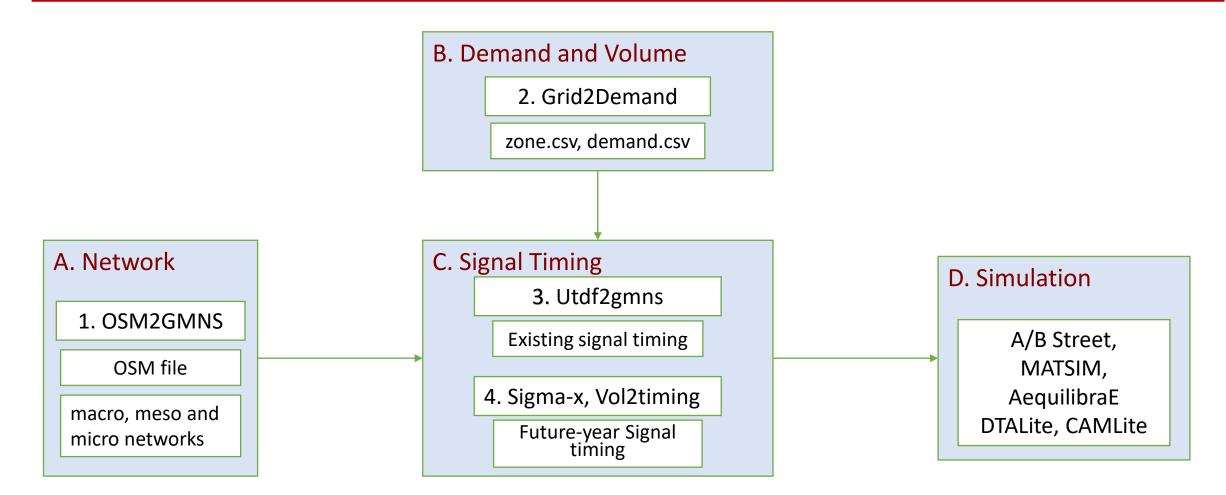
#### MRM Benefits and Applications for Traffic Signal Simulation

- Use of different resolutions to supplement each other.
- Improved dynamic traffic assignment via mesoscopic modeling.
- Overall results more defensible.
- Meso-to-microscopic model consistency
- Unique insights into strategic driver behavior.
  - Important for emerging technologies and transportation system management and operations (TSMO) strategies.
- Robust analysis of subnetwork interaction.

#### Base model development



#### It Takes a Community For Building Tools That Work with GMNS



- Sigma-X: Excel-based computational engine for signalized intersections Vol2Timing as Python API

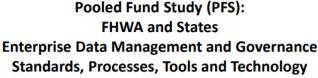
Excel->GMNS, Synchro UTDF -> GMNS

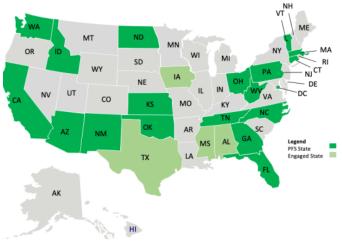
https://github.com/milan1981/Sigma-X

Contributor: Milan Zlatkovic

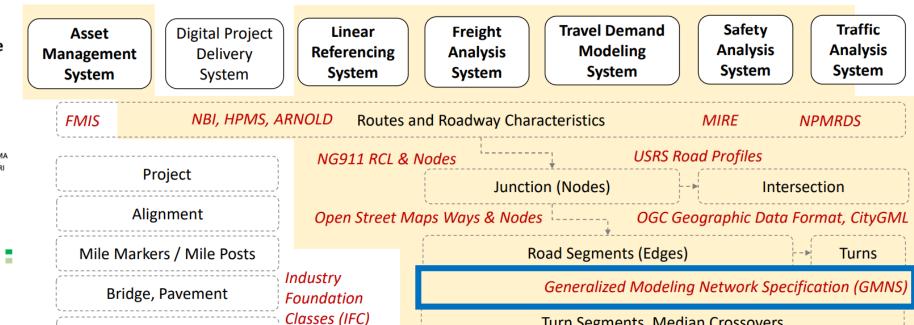
#### Broader Effort for Incorporating GMNS Into Applications Of Enterprise GIS In Transportation (AEGIST) Framework

Assets: Signs, Guardrails, ...





www.gisintransportation.com



Private Sector Data Vendors – Asset Data (including Roads), Traffic Data, Safety Data, Traveler Data, Lidar Data, Imagery Data National and International Data Standard Development Organizations – ISO, OGC, W3C, AASHTO, FHWA, buildingSMART, etc.

Turn Segments, Median Crossovers

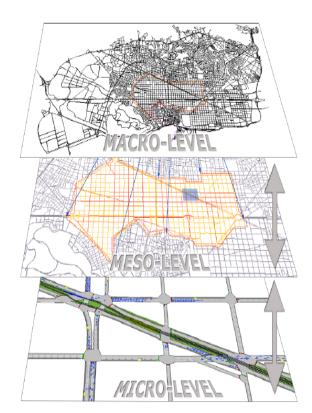
Source: AEGIST Pooled Fund Study (PFS)

FHWA Contact: Joe Hausman, Joseph. Hausman@dot.gov

I. Open DataSpecification

II. Open-Source Tools and MRM Community

III. Network Simulation
Prospective and Case Studies



#### Streamlined workflow to be demonstrated using open-source tools

	Open-source tool(s)
♣ 1. Data download from online mapping database.	OSM
2. Convert OSM downloaded data into the GMNS format.	OSM2GMNS
3. Define zone-to-zone travel demand.	Grid2demand
<ul> <li>4. Establish base-year traffic signal timing inventory</li> </ul>	Utdf2gmns
5. Generate future-year traffic signal timing	Vol2timing, Sigma-X
6. Perform traffic simulation.	A/B Street, DTALite, CAMLite
7. Visualize results.	QGIS, NeXTA, A/B Street

A/B Street = traffic simulation game (GitHub 2021).

DTALite = queue-based mesoscopic traffic simulator (Zhou and Taylor 2014).

GMNS = General Modeling Network Specification (Zephyr Foundation 2021).

Grid2demand = data conversion tool (PyPI 2021). Utdf = data conversion tool (PyPI 2021).

NeXTA = Network EXplorer for Traffic Analysis (Zhou and Taylor 2014).

OSM = OpenStreetMap<sup>®</sup>.

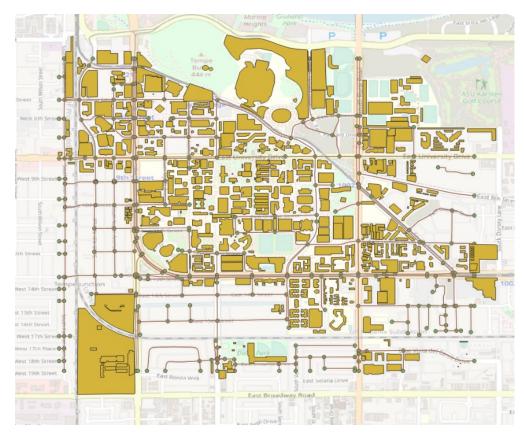
OSM2GMNS = data conversion tool (PyPI 2021).

QGIS = geographic information system (qgis.org 2021).

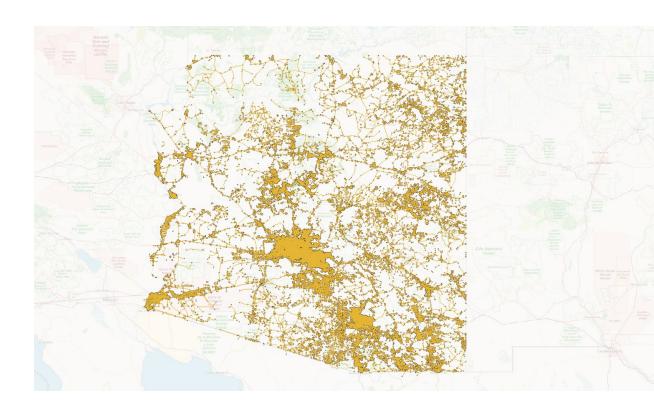
Sigma-X = spreadsheet-based computational engine for signalized intersections (Zlatkovic 2021).

Vol2timing = GMNS-based signal timing generation tool for multi-resolution modeling (PyPI 2021).

#### 1: Network from OSM: with POIs and Activity Locations



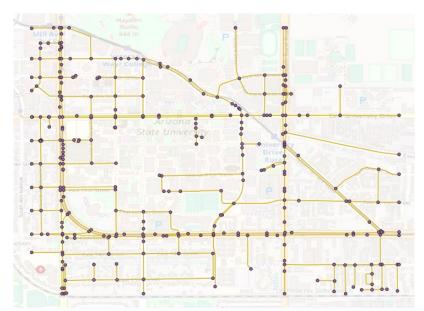
Network with POIs (Point of Interest)



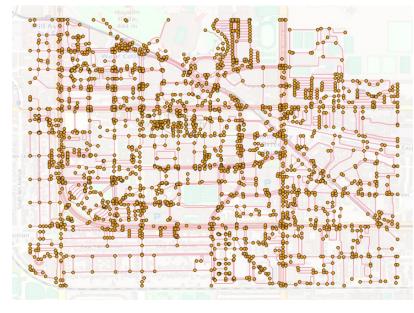
Arizona, U.S.

More sample networks. Contributor: Jiawei Lu at ASU https://osm2gmns.readthedocs.io/en/latest/sample-net.html

#### **Multimodal Networks**



Made of date of the state of th



Drivable network 320 nodes, 619 links

Bikeable network 1282 nodes, 2989 links

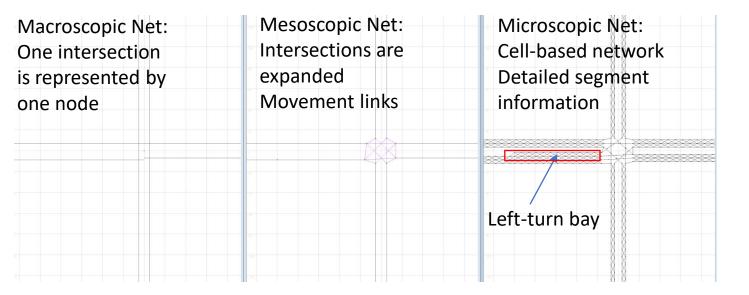
Walkable network 2426 nodes, 5019 links

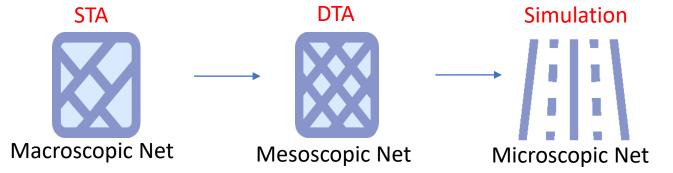
#### More sample networks

https://osm2gmns.readthedocs.io/en/latest/sample-net.html

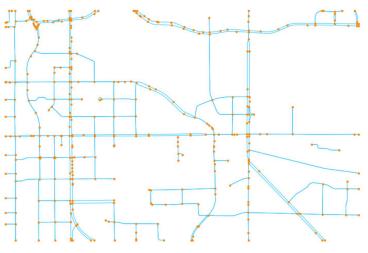
#### 2. Convert OSM Downloaded Data into The GMNS Format (Multi-resolution Network)

 OSM2GMNS helps users automatically generate hybrid (macroscopic, mesoscopic and microscopic) transportation networks to accommodate different modelling needs.





- OSM2GMNS Tool, ASU Network



Macroscopic Network

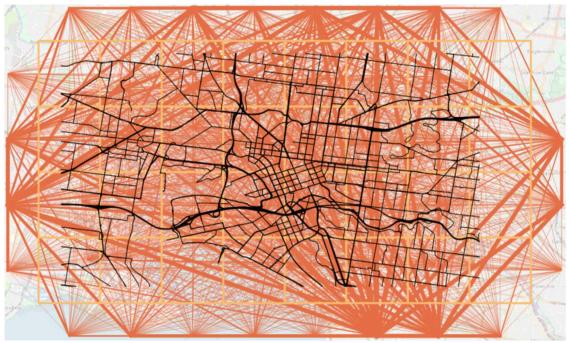


Microscopic, virtual-track based Network

#### 2. Define Zone-to-zone Travel Demand

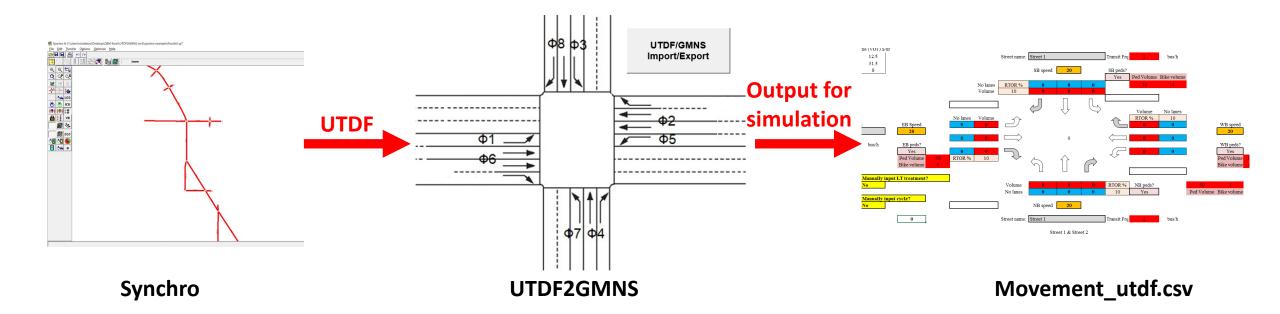
- Creating grid zones, based on POI data from OpenStreetMap to analyze the resident locations and other land use properties
- Quickly generate initial origin-destination transportation demand based on land use propertaies for engaging traffic simulation games such as A/B street and DTALite



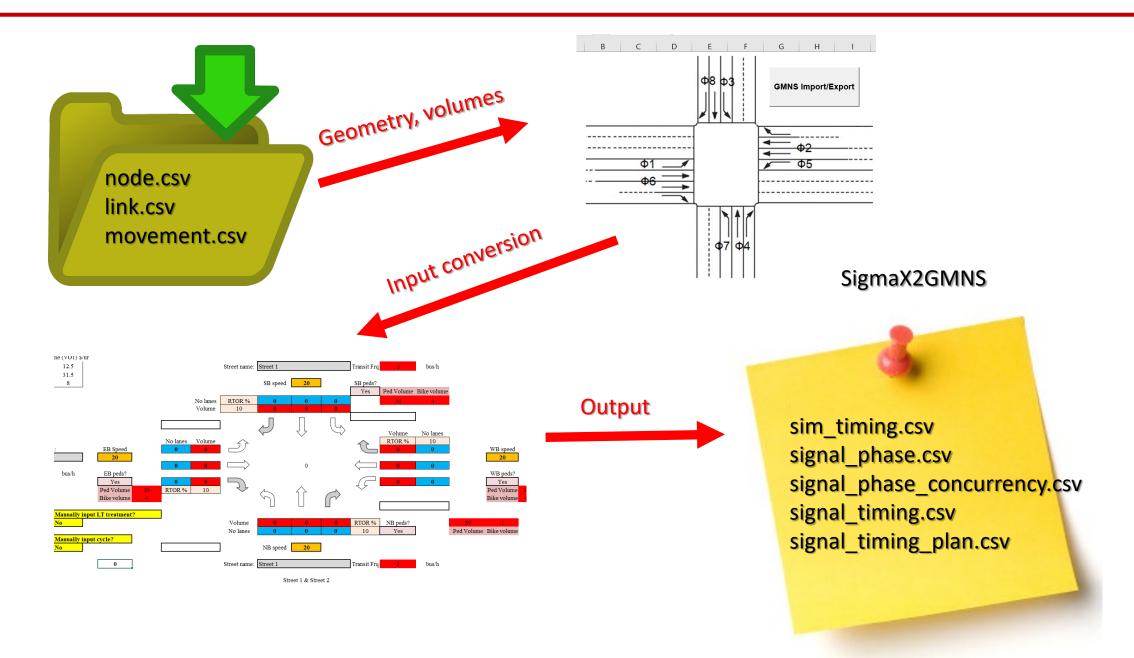


#### 4. Establish Base-year Traffic Signal Timing Data Inventory

- Meso and micro network
- Convert UTDF file data into GMNS format (turn movement)
   UTDF Input-GMNS Output
- Turning Volume Inventory (e.g. from Gridsmart, MS2 traffic counts and from existing synchro files)

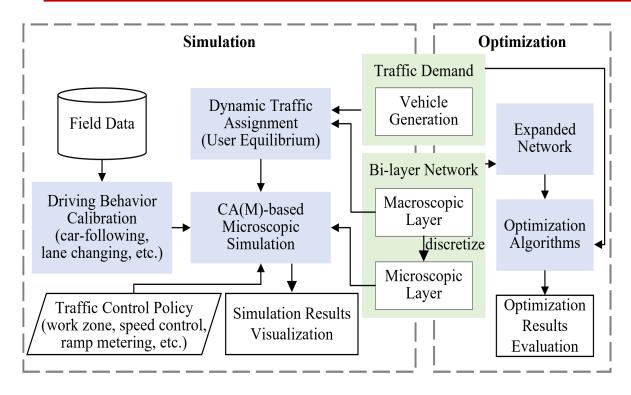


#### 5. Establish Future-year Traffic Signal Timing Scenario



### 6. Perform Traffic Simulation,

#### **Open-source CAMLite: Virtual-Track-based Modeling Framework:**

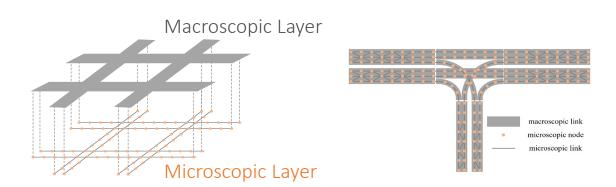


Network Animatics Volume Denity Velocity Contact Lisk

Network Typer

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System architecture overview



Simulation Results from CAMLite

#### 7. Visualization through AB Street



https://github.com/a-b-street/abstreet

Source: <a href="https://github.com/a-b-street/abstreet">https://github.com/a-b-street/abstreet</a>, Special thanks to Dustin Carlino (dabreegster@gmail.com)

#### **Challenges Addressed**

### Opportunities for state DOTs and MPO stakeholders

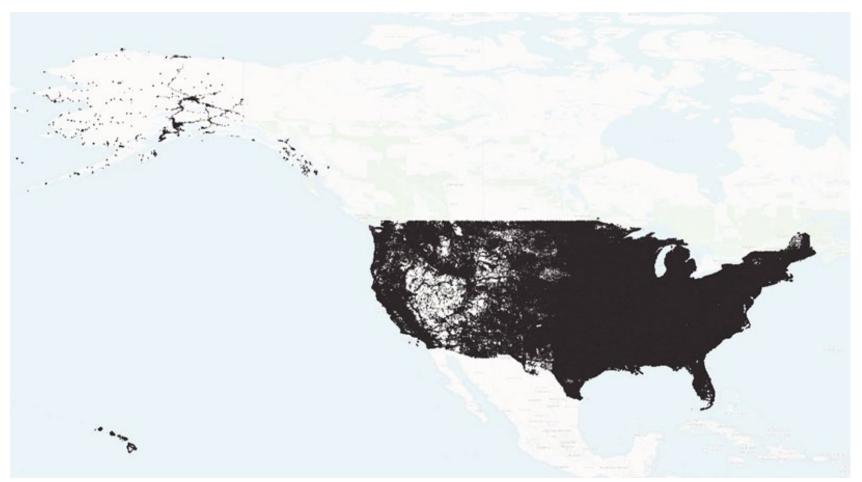
- 1. Map intersections to OpenStreetMap GIS layer
- Utilize machine learning algorithms to automatically map intersections to OSM, instead manually.

2. Manage # of links and counts for each movement in a unified data base

- Develop a data validation process to ensure accuracy of counts and links.
- 3. Integrate Synchro files in one GIS database, through UTDF reading interface
- Use a transportation management software to generate UTDF files automatically.
- 4. . Automate the signal timing update process using HCM methodology
- Implement a standard signal timing update process to ensure consistency and efficiency.

- 5. Future data connection with TranSync for corridor and city levels
- Define the data requirements for corridor-based trajectory-based performance assessment.

To bridge connections between open data, traffic engineers, and city planners, we need the collective effort of a community coming together to build the necessary tools.



Using ASU research computing facilities, we are able to produce the entire U.S. driving network from OpenStreetMap with 20 million nodes.

https://github.com/asu-trans-ai-lab/asu-trans-ai-lab.github.io

PyPi link Total downloads Total downloads - 30 days Total downloads - 7 days https://pypi.org/project/osm2gmns/ 55,000 2,747 538





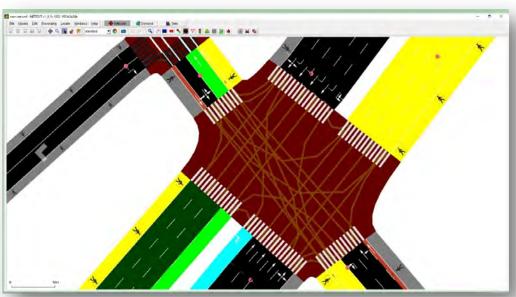
**Saving Lives Through Improved Mobility** 

# Background

What is SUMO and the Econolite ATC software?



- SUMO (Simulation of Urban MObility), an open source, highly portable, microscopic and continuous multi-modal traffic simulation package designed to handle large networks.
- Used in FHWA VOICES and Carma Streets
- https://www.eclipse.org/sumo/





- Latest ATC Controller software
- Familiar ASC3 features
- Deployed in over 12,000 Intersections
- Coordination Visualization
- Adaptive splits and COS commands

- NTCIP 1202v3
- NTCIP 1211 Priority Request Server
- SAE SPaT and Map broadcast
- 32 Phase, 32 Overlaps, 128
   Detectors
- ATSPM

## Integrating into SUMO

How can they work together?

### **Connecting the Time Domain and IO**



TRAFFIC CONTROL LOGIC







### **Getting Started**

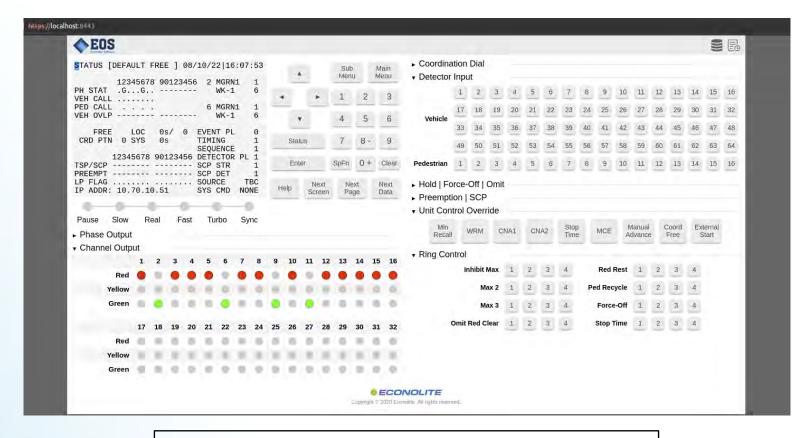
- PyEOS is an open-source Python library created by Econolite to spawn virtual EOS Traffic Controllers
- Installation Requirements:
  - Linux operating system ideally Ubuntu 20.04 LTS or higher
  - o 32-bit GCC/G++ libraries
  - o Python 3.8 or higher
  - Pip package manager
    - pip3 install pyeos
    - pip3 install traci
  - o EOS Traffic application version 3.2.18 or higher

### **Controller Terminology**

- CIB = An acronym for Controller Input Buffer.
  - This represents the generic set of inputs that EOS controllers support.
  - For SUMO usage, the most used are vehicle and pedestrian detectors.
- COB = An acronym for Controller Output Buffer.
  - This represents the generic set of outputs that EOS controllers support.
  - For SUMO usage, the most used are vehicle, overlap, and pedestrian colors.

### **The Controller**

- Controller class holds meta related features
- Process controls
  - orun()
  - ostop()
  - ois\_running()
- Open the web front panel of EOS with watch()



with virtual\_factory(eos\_dir) as eos\_factory:
 with eos\_factory.run\_controller() as eos:
 assert eos.is\_running()
 eos.watch()

# **Controller Options**

- An input for the Controller class that preconfigures EOS
- Controller configuration object is available for spawning EOS under specific conditions such as:
  - EOS Configuration
  - Start Time (using Python datetime object)
  - Designated Port

```
start_time = datetime.datetime.now() - datetime.timedelta(days=1)
options = ControllerOptions(eos_cfg_path, start_time=start_time, https_port=9001)
with virtual_factory(eos_dir) as eos_factory:
    with eos_factory.run_controller(options) as eos:
    # . . . code
```

# **The EOS Harness**

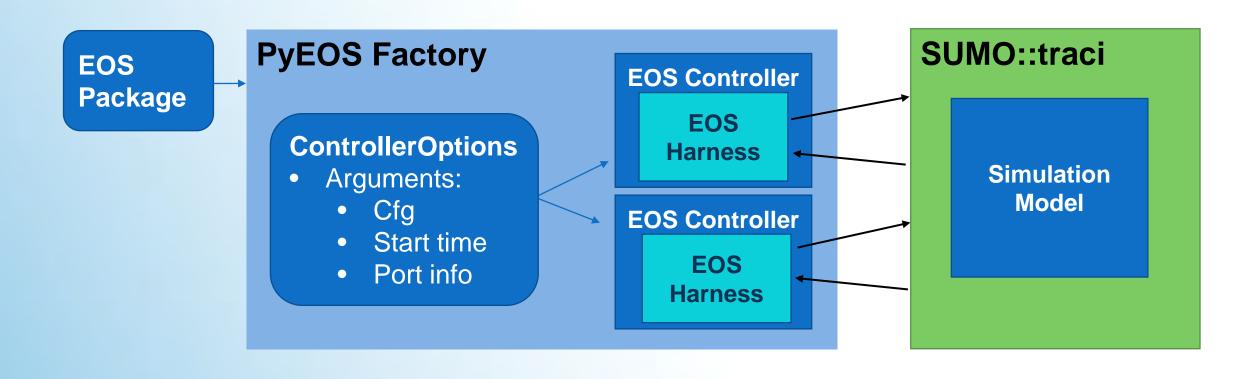
- A "Utility belt" for EOS virtual controller
- Manages I/O for the following:
  - o CIB / COB Communication
  - o Clock controls
- Use the controller's harness() method to create:

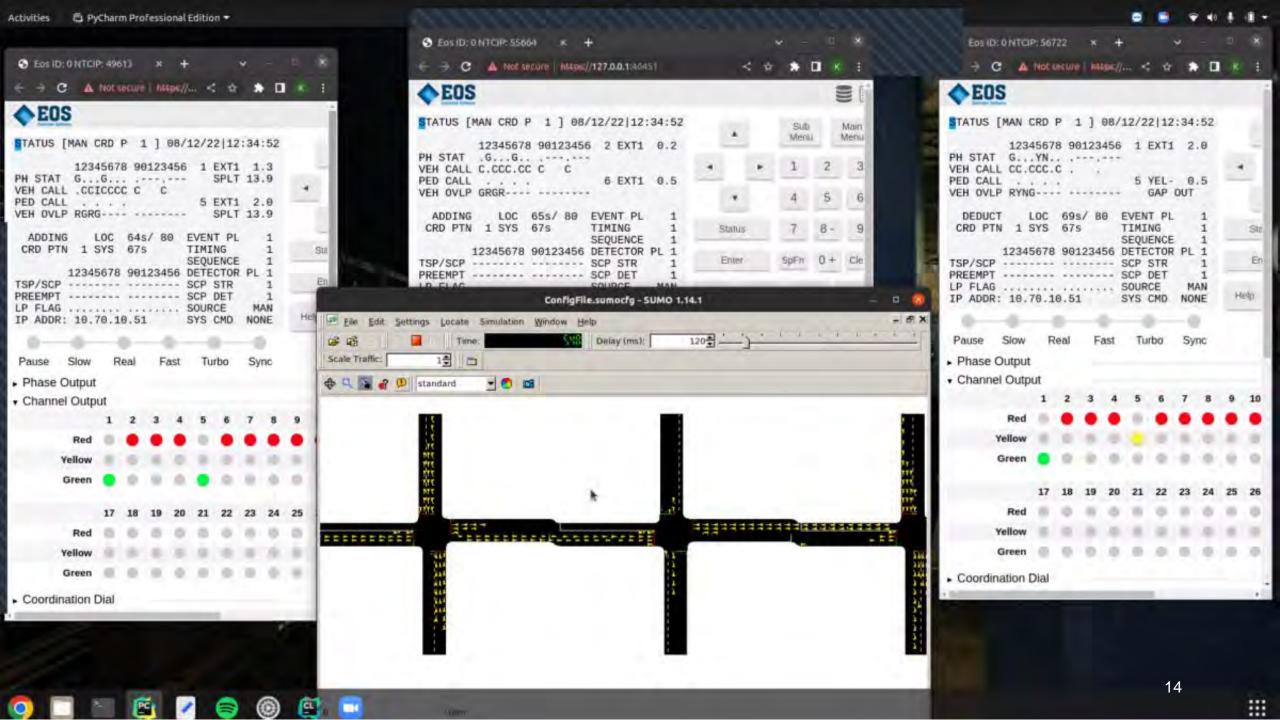
```
with virtual_factory(eos_dir) as eos_factory:
    with eos_factory.run_controller() as eos:
        with controller.harness() as eos_harness:
        # . . . code
```

# **PyEOS Factory Model**

**EOS Factory EOS Controller** Used to create Create EOS **EOS Package ControllerOptions** Harness (App directory) Arguments: Cfg **EOS Controller** Start time EOS Port info Harness **No ControllerOptions** EOS Controller

# **PyEOS Demo with SUMO**







# **Available Soon**

- Continue Support of Active Project
   CARMA Streets (soon)
- Finish development of Commercial Usage license mechanism in First Half of 2023
- Share Source and Binaries Through GitHub

# Thanks!

**Dustin DeVoe** 

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# A multi-resolution Simulation Platform for Perception-Based Traffic Signal Control

TRB Webinar: State-of-the-Art Traffic Signal Simulation Tools and Platforms

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## Technical Path of the Existing Traffic Signal Control

#### **Infrastructure-based detection**

- High installation and maintenance cost
- Fixed location sensors
- Limited in congestion management
- Limited in performance measures

Vehicle Actuated

Detection

CV Based Signal Control

> Vehicle Trajectories

CAV Based Signal Control

> Perception Data

More Detection

Adaptive

#### **Trajectory-based detection**

- Temporal-spatial continuous data
- Crowdsourcing and low-cost
- Require certain penetration rate
- Inaccurate positioning

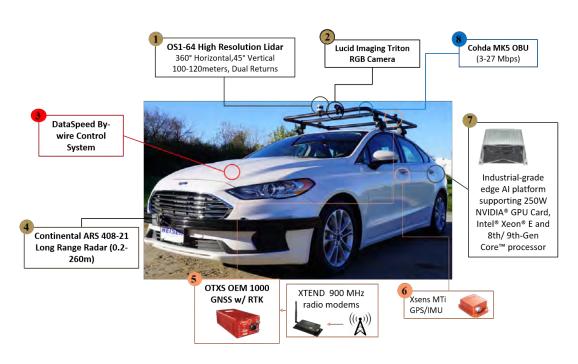
Coordination

Communication

Single Intersection

## **Cooperative Perception Environment**

• Perception sensors (Lidar, Radar, Camera) on vehicles and Infrastructure

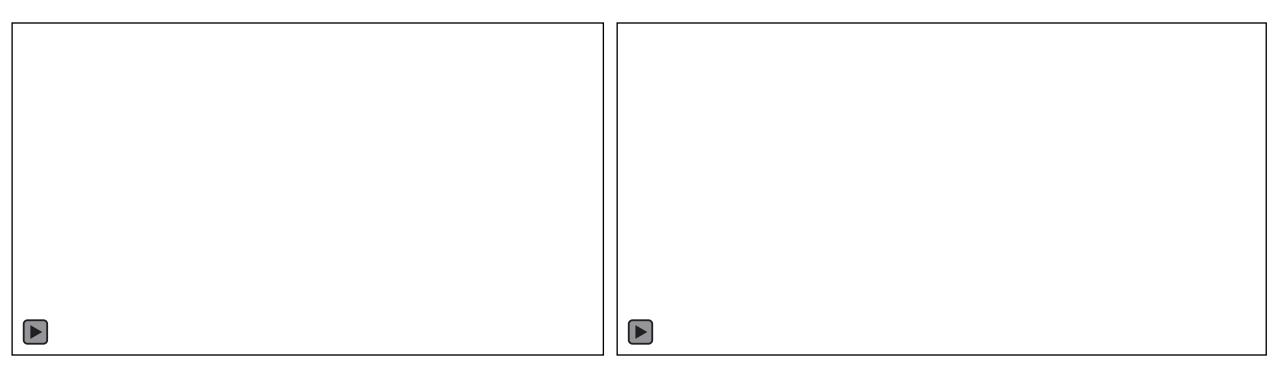


Level 4 AV at Purdue CART Lab



Equipped infrastructure at State and Ellsworth roundabout, Ann Arbor, Michigan

# Cooperative Perception Environment



Vehicle Detection and Tracking from the CAV

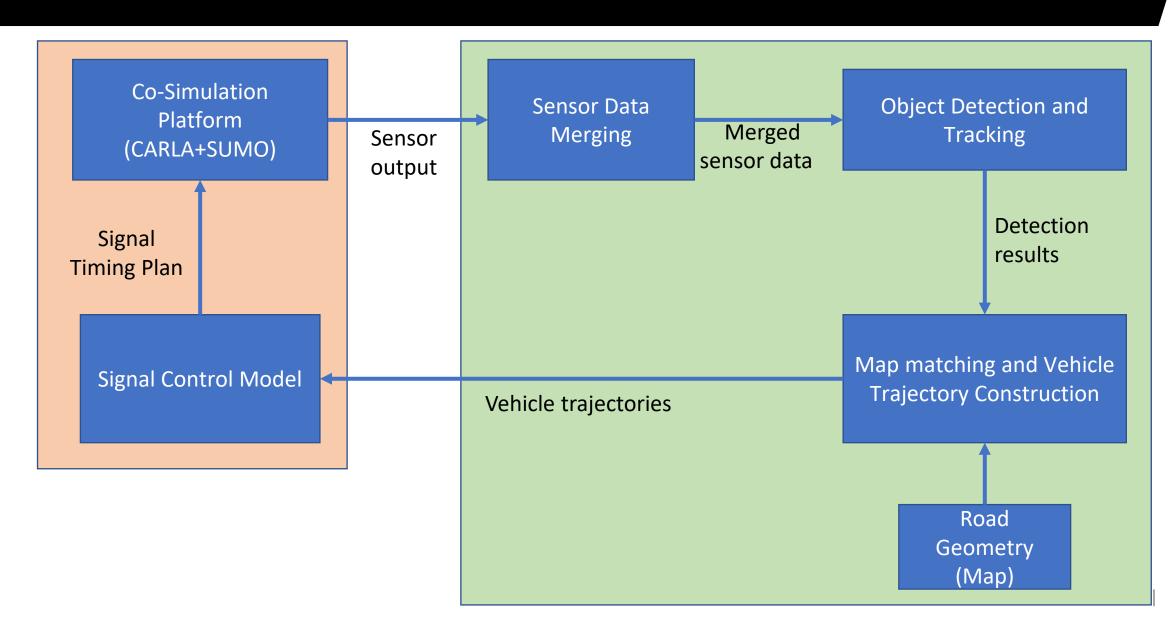
Vehicle Detection and Tracking from Infrastructure Cameras (Credit: Michigan Traffic Lab)

## Cooperative Perception for Traffic Signal Control

- A new data source (video and/or point cloud)
  - Richer information than both detectors and CV trajectories
  - High fidelity and high accuracy
  - Only need very low penetration rate of CAVs
- Sensor fusion from multiple sources
  - Raw data level: directly fuse image or point cloud
  - Future level: fuse features extracted from the raw data
  - Decision level: fuse detection results (e.g., bounding boxes)
- Develop a simulation environment to test signal control algorithms with cooperative perception



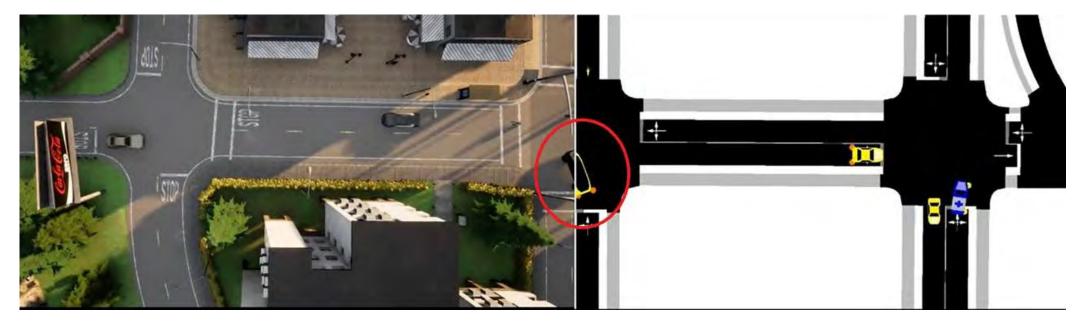
# Simulation System Design



# **Co-Simulation Platform**

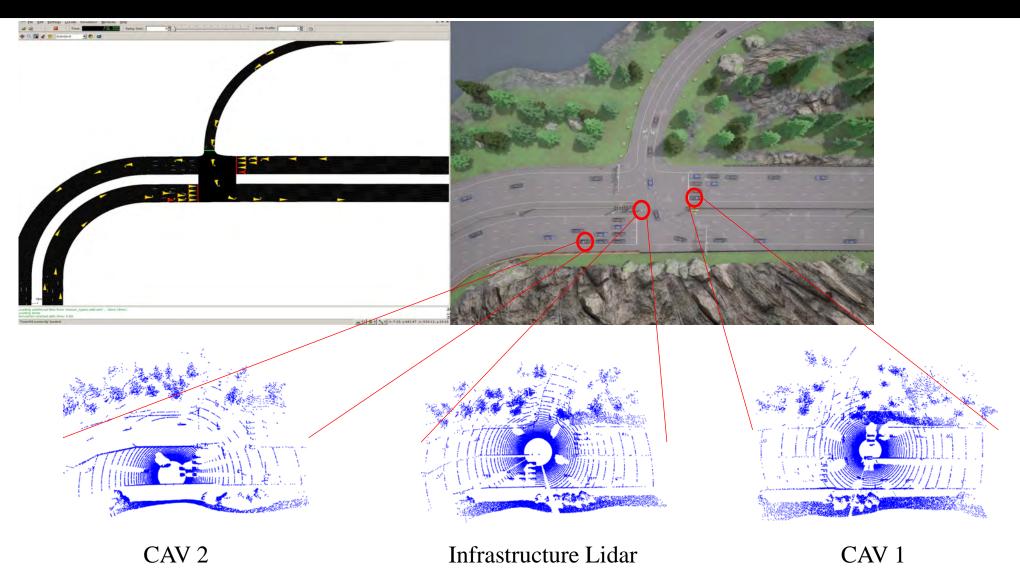
- Cooperative Driving Automation (CDA) multi-resolution simulation platform
  - Developed by the CDA program at FHWA
  - Integrated with CARMA, CARLA, SUMO, MOASIC, and NS3



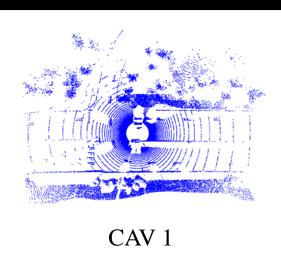


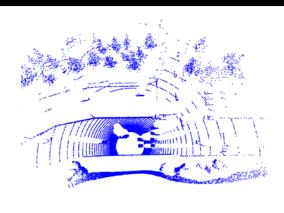
(Source: <a href="https://usdot-carma.atlassian.net/wiki/spaces/CRMSIM/overview">https://usdot-carma.atlassian.net/wiki/spaces/CRMSIM/overview</a>)

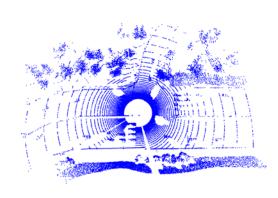
# Cooperative Perception from Multiple Lidars



# Cooperative Perception from Multiple Lidars





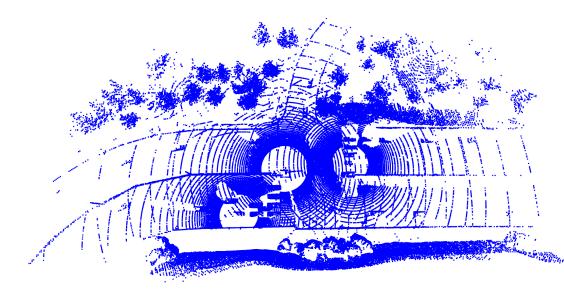


CAV 2

Infrastructure

**Merging Algorithm:** EMP: Edgeassisted Multi-vehicle Perception

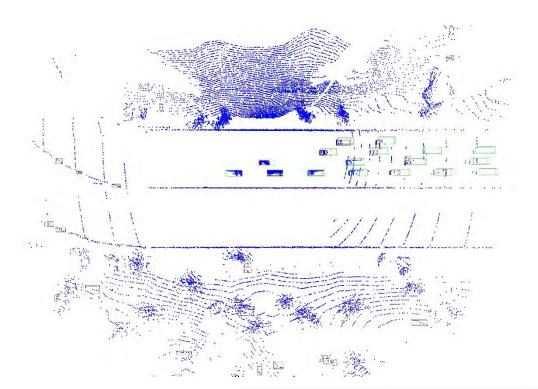
Zhang, X., Zhang, A., Sun, J., Zhu, X., Guo, Y. E., Qian, F., & Mao, Z. M. (2021, October). EMP: Edge-assisted multi-vehicle perception. In *Proceedings of the 27th Annual International Conference on Mobile Computing and Networking* (pp. 545-558).



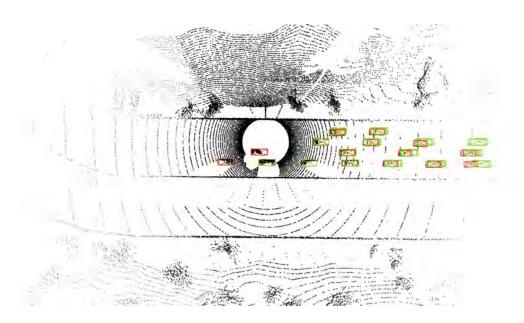
Merged Point Cloud Data

### Vehicle Detection Model

• Clustering-based 3D Detection (RANSAC + DBSCAN)

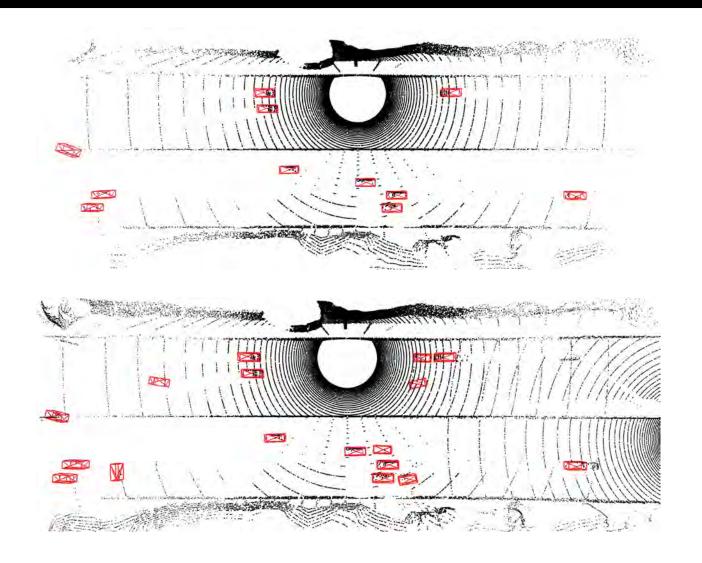


- Deep learning-based 3D Detection (PointPillar)
- Trained with Carla data



	$AP40_{0.01}$	$AP40_{0.01}$	$AP40_{0.1}$	$AP40_{0.1}$
	BEV	3D	BEV	3D
DBSCAN	23.3318	16.7142	15.1852	7.8422
PointPillar	84.9086	84.9144	84.8281	84.8151

#### Comparison between single Lidar and merged Lidar point Cloud



Detection results from single Lidar point cloud

Detection results from merged point cloud

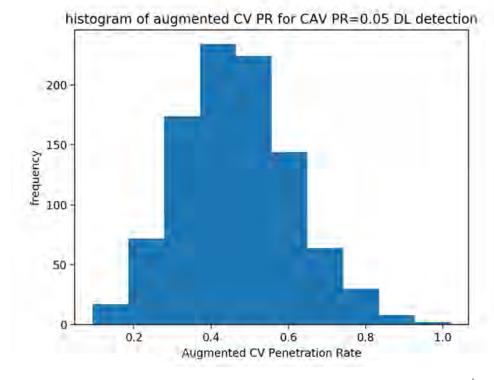
#### Data Collection Efficiency

Equivalent connected vehicle penetration rate (E-CVPR)

$$ECVRP = \frac{detected # vehicles}{total # vehicles}$$

E-CVPR by the PointPillar detection model

CAV Penetration Rate	E-CVPR (mean and std.)
0%	31.41% (10.12%)
1%	35.68% (10.94%)
2%	37.42% (11.89%)
5%	46.59% (14.64%)





## Cooperative Perception Based Adaptive Signal Control

- Signal Control Algorithm: Max Pressure<sup>[1]</sup>
  - Calculate pressure based on number of vehicles at the incoming and outgoing approaches
  - Actuate traffic signals based on the highest pressure
- Settings
  - Varying penetration rates of CAVs from 0% to 5% with an infrastructure Lidar
  - Vehicles that are within 200m of the intersections are considered
  - Simulation time: 2000s

[1] Varaiya, P. (2013). Max pressure control of a network of signalized intersections. Transportation Research Part C: Emerging Technologies, 36, 177-195.



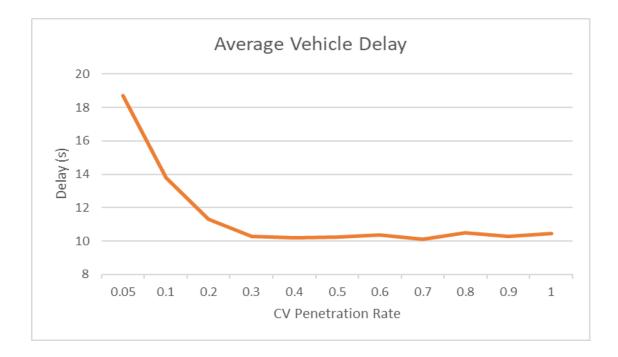
# Demo Video



## Performance Comparison

• Performance metric: average vehicle delay

**CV-based Max Pressure** 

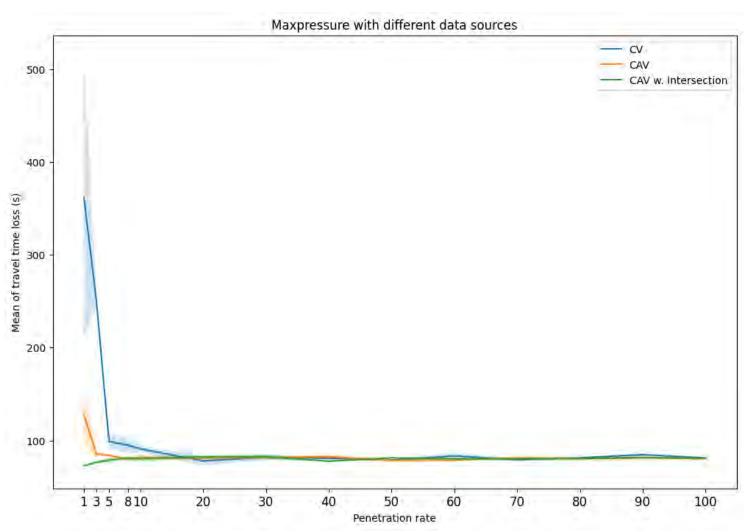


#### Cooperative Perception Based Max Pressure

CAV Penetration Rate	Average Vehicle Delay
0%	10.57
1%	10.86
2%	10.63
5%	11.01

## Performance Comparison

- Eight-phase intersection (Plymouth and Green, Ann Arbor, MI)
- Signal Control Algorithm: Max pressure
- Three settings
  - Connected Vehicle
  - Cooperative perception with infrastructure sensor
  - Cooperative perception without infrastructure sensor



#### Summary

- Multi-resolution simulation platform
  - Based on CDASim from FHWA
  - SUMO + CARLA
  - Integrate with perception sensors and data
  - Integrate with perception models
  - Create a cooperative perception environment
- Cooperative perception based traffic signal control
  - Implement to very low penetration rates of CAVs
  - Infrastructure sensors play an critical role in data acquisition
- Other traffic applications

#### Acknowledgement





#### Reference:

Chen, H., Liu, B., Zhang, X., Qian, F., Mao, Z.M. and Feng, Y., 2022. A Cooperative Perception Environment for Traffic Operations and Control. *arXiv preprint arXiv:2208.02792*.

# THANK YOU

# QUESTIONS?

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