



WCXTM WORLD CONGRESS EXPERIENCE

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Distributed Consensus-Based Cooperative Highway On-Ramp Merging Using V2X Communications

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Content of the Presentation

- **Introduction and background**
- **System architecture and assumptions**
- **Proposed system methodology**
- **Simulation study**
- **Conclusions and future work**

Introduction and Background

Wasted Time and Wasted Fuel

- In 2016, Los Angeles tops the global ranking with **104 hour/commuter** spent in traffic congestion
- In 2014, **3.1 billion gallons** of energy were wasted worldwide due to traffic congestion
- In 2013, fuel waste and time lost in traffic congestion cost **\$124 billion** in the U.S.



(Source: La La Land)

Automated Vehicle Technology



- **Definition of automated vehicles**

At least some aspects of a safety-critical control function (e.g. , steering, acceleration, or braking) occur without direct driver input

- **Sensing techniques**

Radar, Lidar, GPS, odometry, computer vision, etc.

Connected Vehicle Technology

- **Definition of connected vehicles**

Vehicles that are equipped with Internet access, and usually also with a wireless local area network

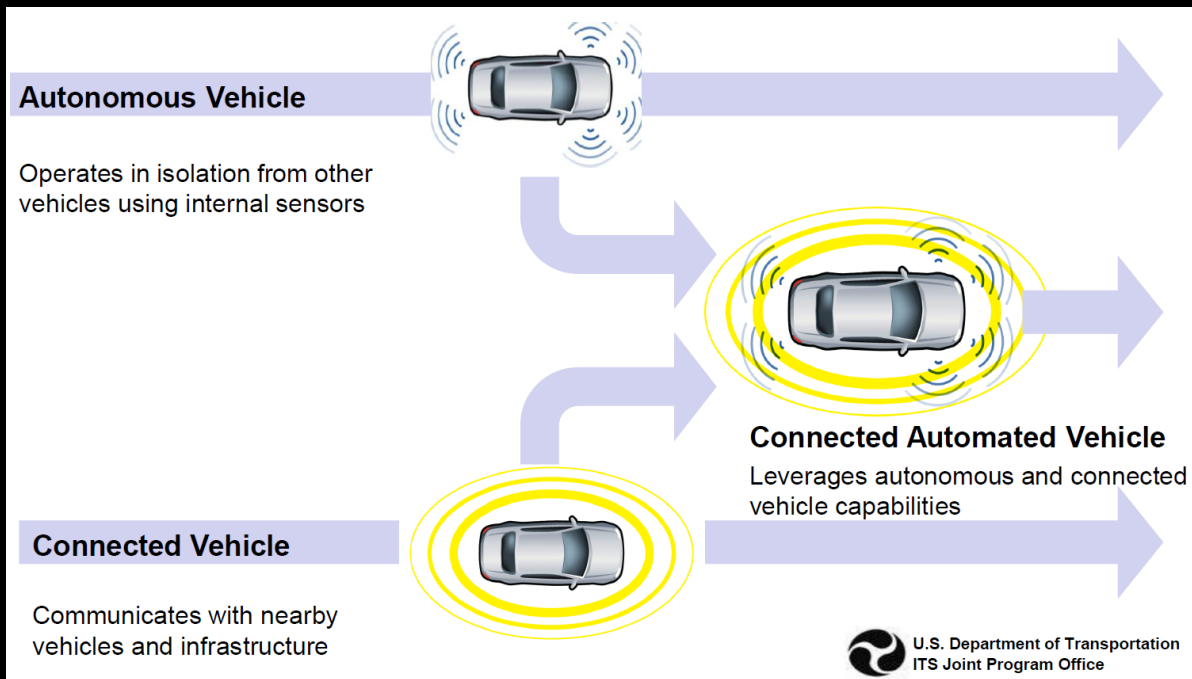
- **Communication flow**

-Based primarily on dedicated short-range communications (DSRC)

-Between vehicles (V2V), or vehicles and infrastructure (V2I/I2V)



Merging of Connectivity and Automation

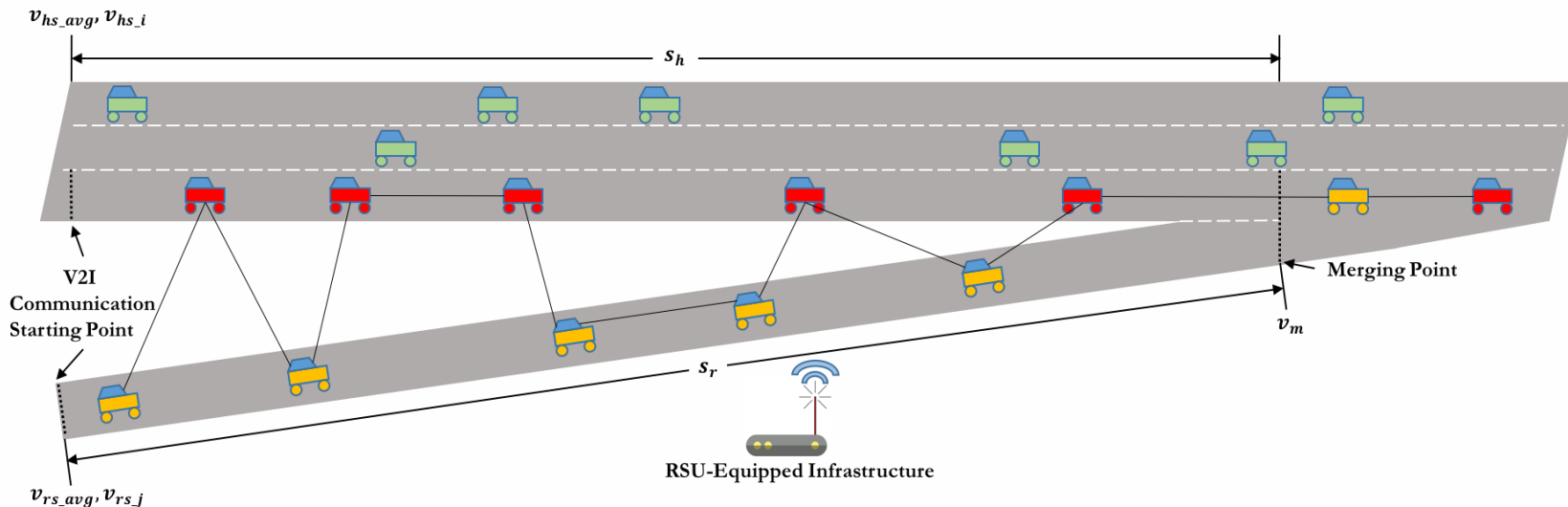


System Architecture and Assumptions

System Assumptions

- **All vehicles can get their precise information by equipped sensors**
- **All vehicles are CAVs with V2V and V2I communications**
- **Only the longitudinal control is considered in this study**

Cooperative Highway On-Ramp Merging System



Proposed System Methodology

Proposed System Methodology

1. Vehicle sequencing protocol

Arrange vehicles with a predefined sequence to merge

2. Distributed consensus-based cooperative merging protocol

Propose longitudinal control model for vehicles

Vehicle Sequencing Protocol

Maximum reachable speed of on-ramp vehicles

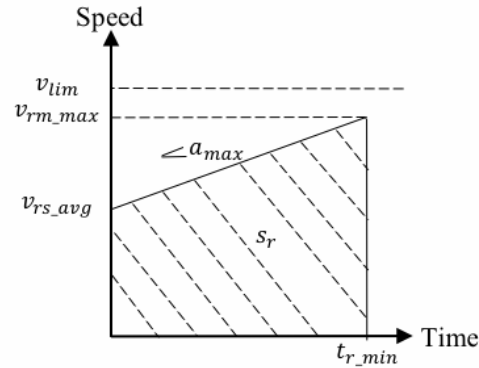


Estimated arrival time



Vehicle sequence identification (SID)

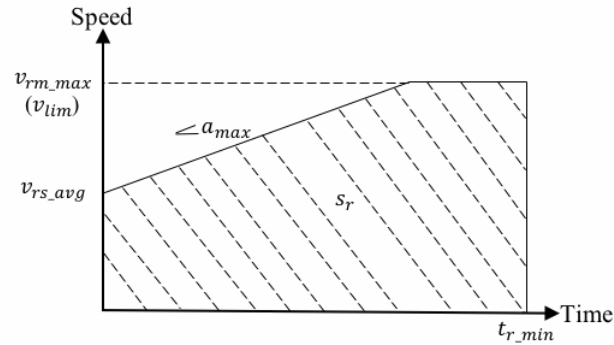
Maximum reachable speed



If on-ramp vehicles cannot accelerate to highway speed limit, the maximum reachable speed of on-ramp vehicles is

$$v_{rm_max} = \sqrt{v_{rs_avg}^2 + 2a_{max}s_r}$$

Maximum reachable speed



If on-ramp vehicles can accelerate to highway speed limit, the maximum reachable speed of on-ramp vehicles is

$$v_{rm_max} = v_{lim}$$

Estimated Arrival Time

If $v_{hs_avg} \leq v_{rm_max}$, then $v_m = v_{hs_avg}$

$$t_{h_i} = \frac{S_h}{v_{hs_i}}$$

$$t_{r_j} = \frac{2a_{max}S_r + (v_{hs_avg} - v_{rs_j})^2}{2a_{max}v_{hs_avg}}$$

Estimated Arrival Time

If $v_{hs-avg} > v_{rm-max}$, then $v_m = v_{rm-max}$

$$t_{h_i} = \frac{2a_{max}(s_h - s_r) - (v_{hs_i}^2 + v_{rs_{avg}}^2) + 2v_{hs_i}\sqrt{v_{rs_{avg}}^2 + 2a_{max}s_r}}{2a_{max}\sqrt{v_{rs_{avg}}^2 + 2a_{max}s_r}}$$

$$t_{r_j} = \frac{-v_{rs_j} + \sqrt{v_{rs_j}^2 + 2a_{max}s_r}}{a_{max}}$$

Vehicle Sequence Identification

Estimated arrival time of every vehicle is sent to the infrastructure with V2I communication area



The infrastructure sorts vehicles in the network in order of time



Vehicles are assigned with consecutive SIDs

Distributed Consensus-Based Cooperative Merging Protocol

Input: estimated arrival time and SID of vehicle k (T_k, n_k) and other vehicles in communication range

Output: acceleration of vehicle k

if a vehicle p with SID ($n_p = n_k - 1$) has its estimated arrival time satisfy ($T_k - t_{head_v2v} \leq T_p \leq T_k$)

if vehicle p is on the same lane with vehicle k

 Vehicle p becomes the physical predecessor of vehicle k ;
 Acceleration of vehicle k is calculated by *Algorithm 1*;

else

 Vehicle p becomes the “ghost” predecessor of vehicle k ;
 Acceleration of vehicle k is calculated by *Algorithm 2*;

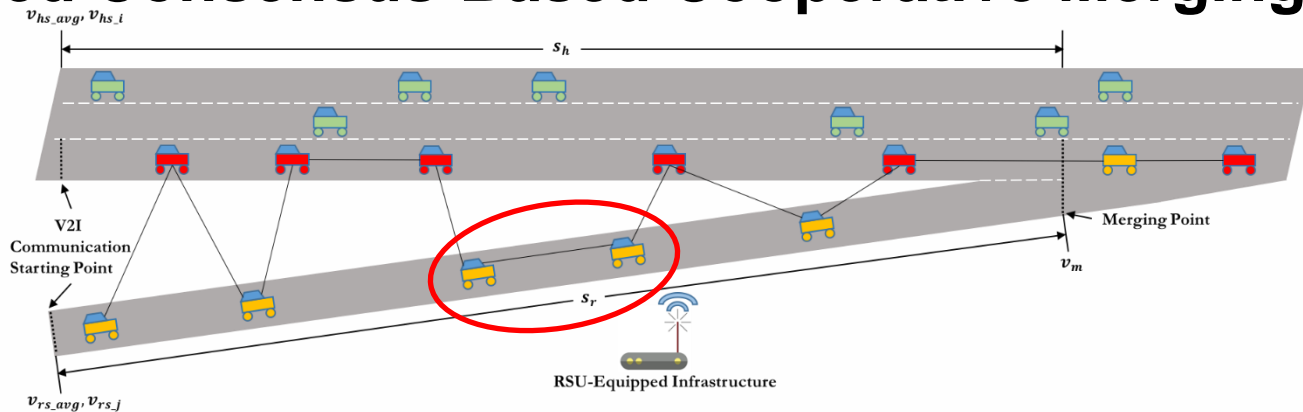
end

else

 Acceleration of vehicle k is calculated by the default car following model;

end

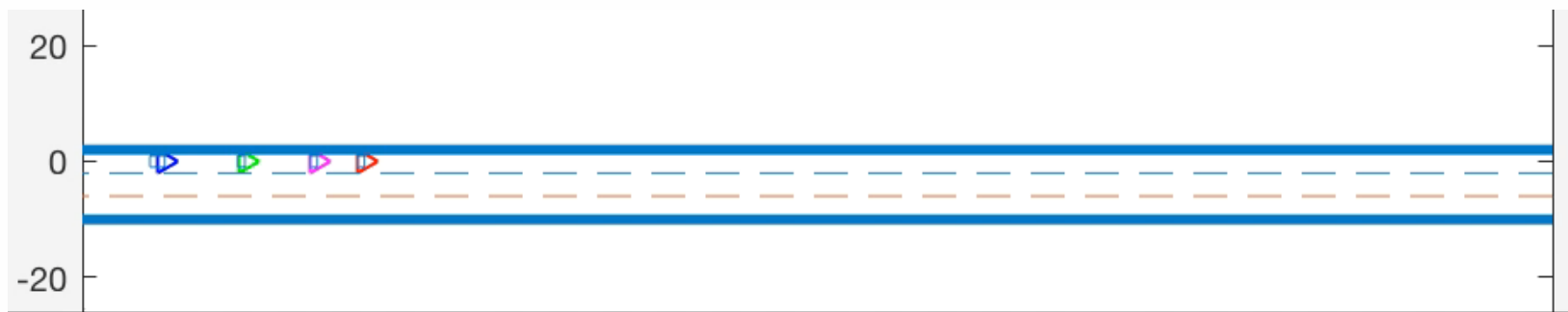
Distributed Consensus-Based Cooperative Merging Protocol



Algorithm 1. Distributed consensus algorithm for physical predecessor-follower.

$$a_k = -\delta[(s_k - s_p + s_{head}) + \gamma(v_k - v_p)]$$

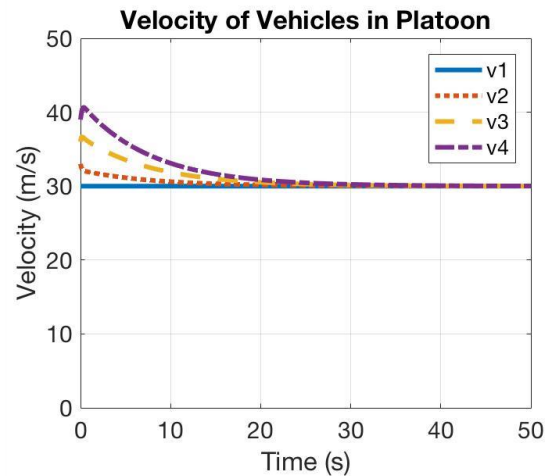
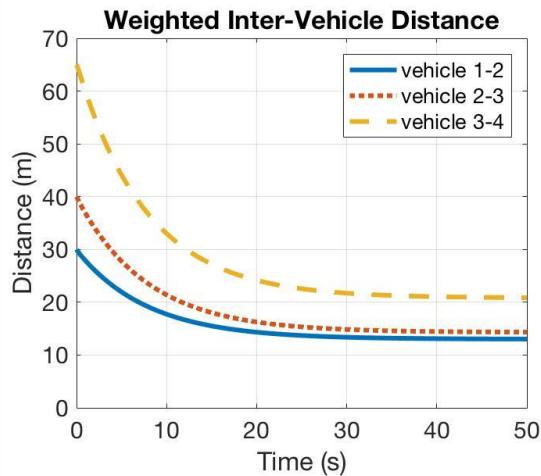
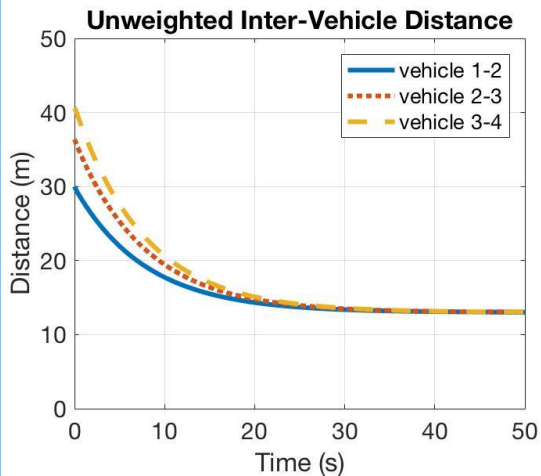
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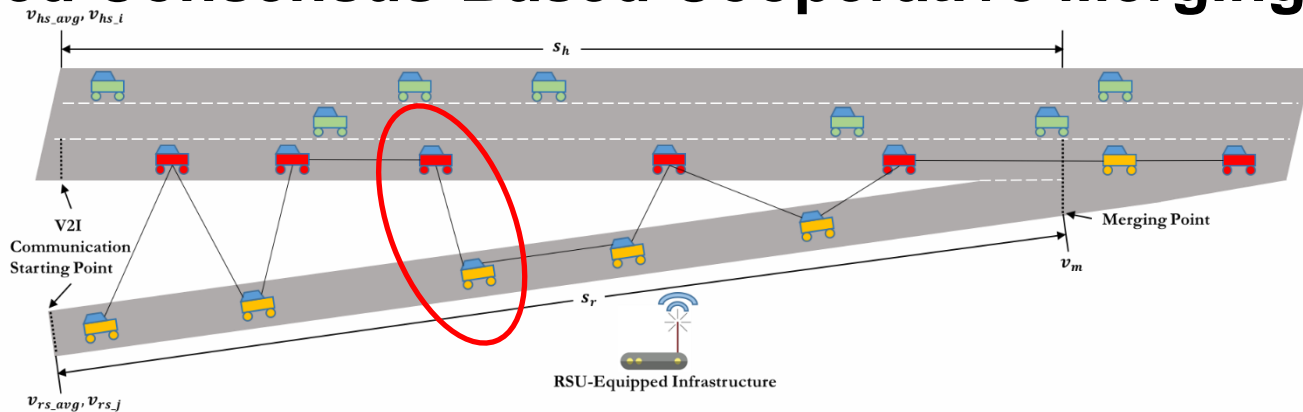
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Distributed Consensus-Based Cooperative Merging Protocol



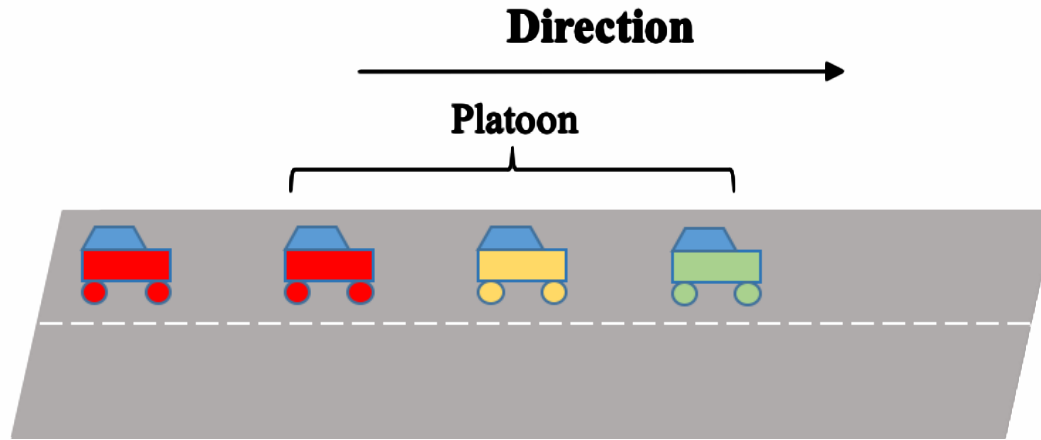
Distributed Consensus-Based Cooperative Merging Protocol



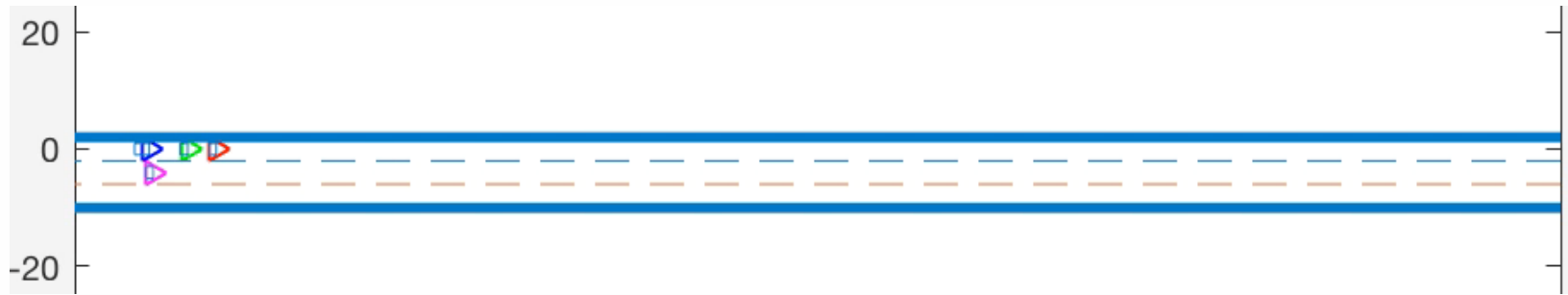
Algorithm 2. Distributed consensus algorithm for **“ghost”** predecessor-follower.

$$a_k = -\alpha\delta\left[(s_k - s_p + v_m t_{head_safe}) + \gamma(v_k - v_p)\right] - \beta(v_k - v_m)$$

Distributed Consensus-Based Cooperative Merging Protocol



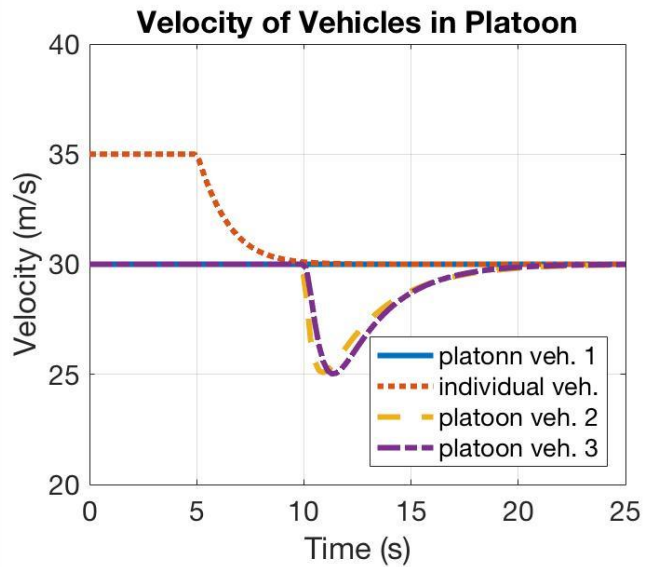
Distributed Consensus-Based Cooperative Merging Protocol



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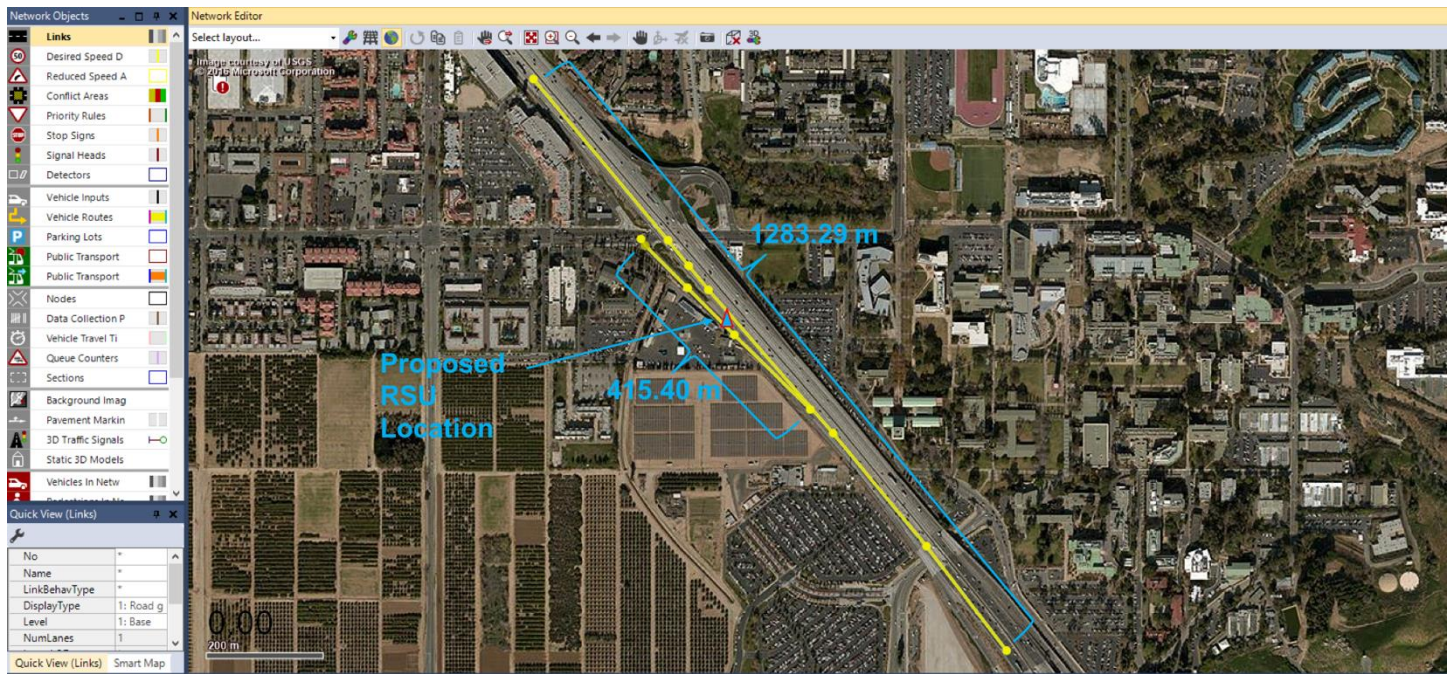
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Distributed Consensus-Based Cooperative Merging Protocol



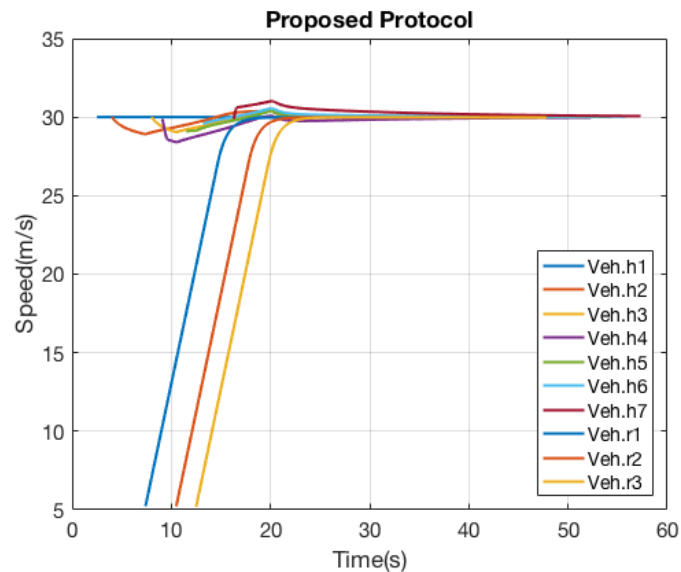
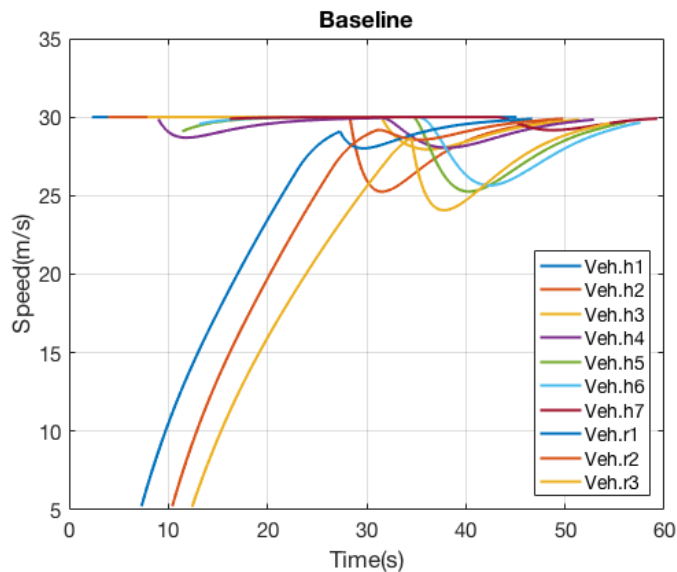
Simulation Study

Simulation Network



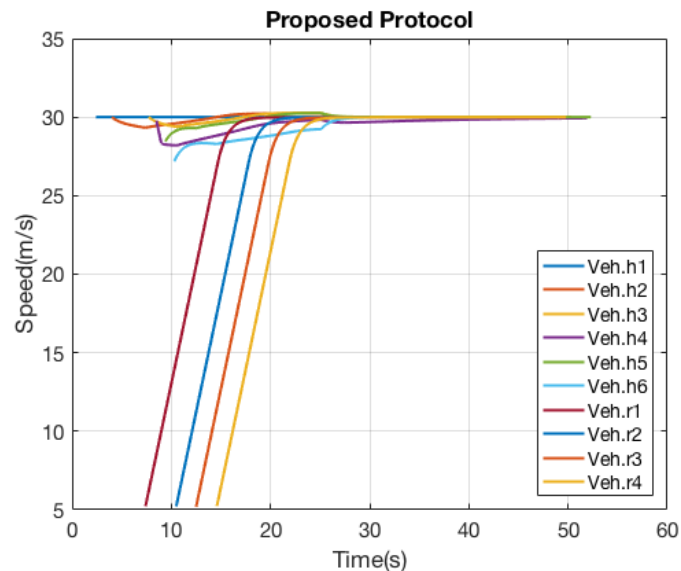
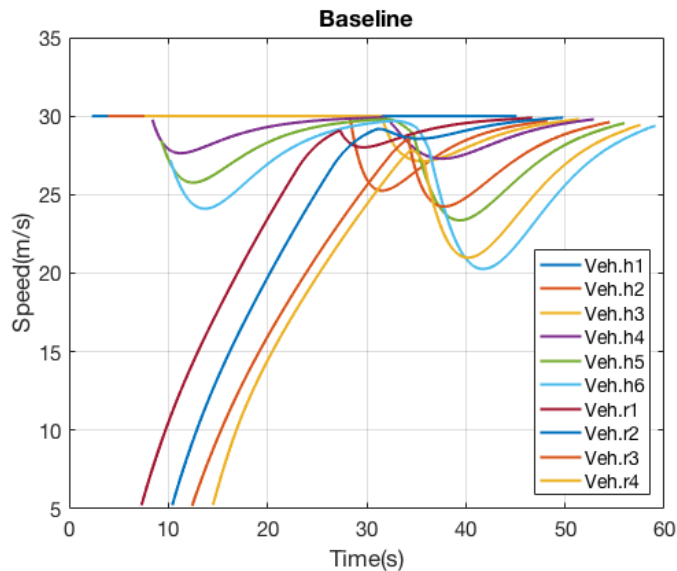
Simulation Results

Lower Traffic Flow



Simulation Results

Higher Traffic Flow



Simulation Results

	Travel Time (s)	Speed (m/s)	CO (g)	NOx (g)	CO ₂ (g)	Energy (KJ)
Baseline	42.77	29.02	1.37	0.32	270.36	3759.39
Proposed Protocol	40.49	30.02	1.36	0.31	269.99	3746.20
Improved	5.33%	3.44%	0.73%	3.13%	0.51%	0.36%

Higher Traffic Flow

Lower Traffic Flow

	Travel Time (s)	Speed (m/s)	CO (g)	NOx (g)	CO ₂ (g)	Energy (KJ)
Baseline	43.50	27.86	1.34	0.31	260.67	3624.72
Proposed Protocol	38.92	29.95	1.30	0.29	258.91	3600.31
Improved	10.50%	7.50%	2.99%	6.46%	0.67%	0.67%

Conclusions and Future Work

Conclusions

- **A distributed consensus-based cooperative methodology for highway on-ramp merging has been proposed**
- **The vehicle sequencing protocol has been developed to assign SIDs to different vehicles based on their estimated arrival time**
- **A comprehensive simulation study has been conducted based on the traffic network near UCR campus area**

Future Work

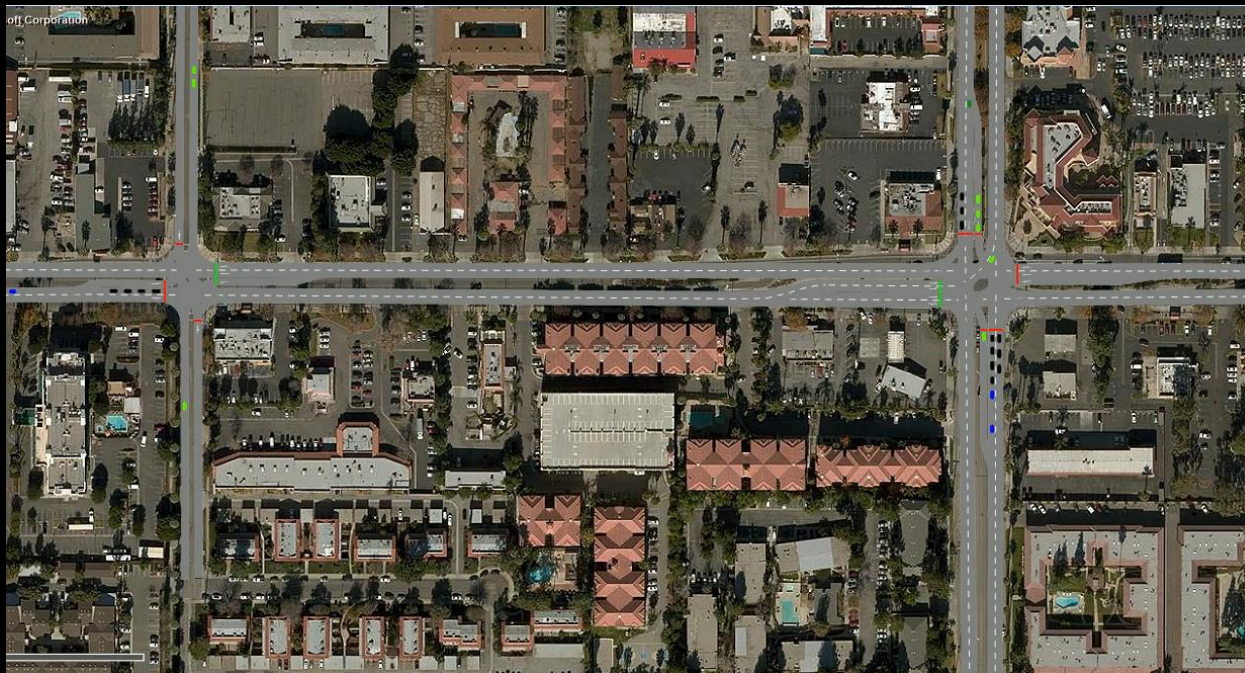
- **The study of the effect on the entire highway corridor by applying the proposed protocol**
- **More realistic factors of the traffic simulation network can be considered, e.g., road grade, communication delay**
- **No existing transportation system can guarantee all vehicles are connected and automated, i.e., mixed traffic should be studied**

City of Riverside Innovation Corridor

- All traffic signal controllers are being updated to be compatible with SAE connectivity standards
- UC Riverside is providing the Dedicated Short Range Communication modems in each traffic signal



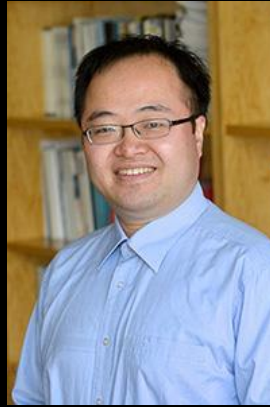
Integrate with Signalized Corridors



Contributors of the Study



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Electrical Engineering



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Electrical Engineering



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Thank you

Ziran Wang