
Assessing the Traffic and Energy Impacts of Connected and Automated Vehicles (CAVs)

Steven E. Shladover, Sc.D.

(Retired from) California PATH Program

University of California, Berkeley

SIP-adus Workshop

Tokyo, November 15, 2017

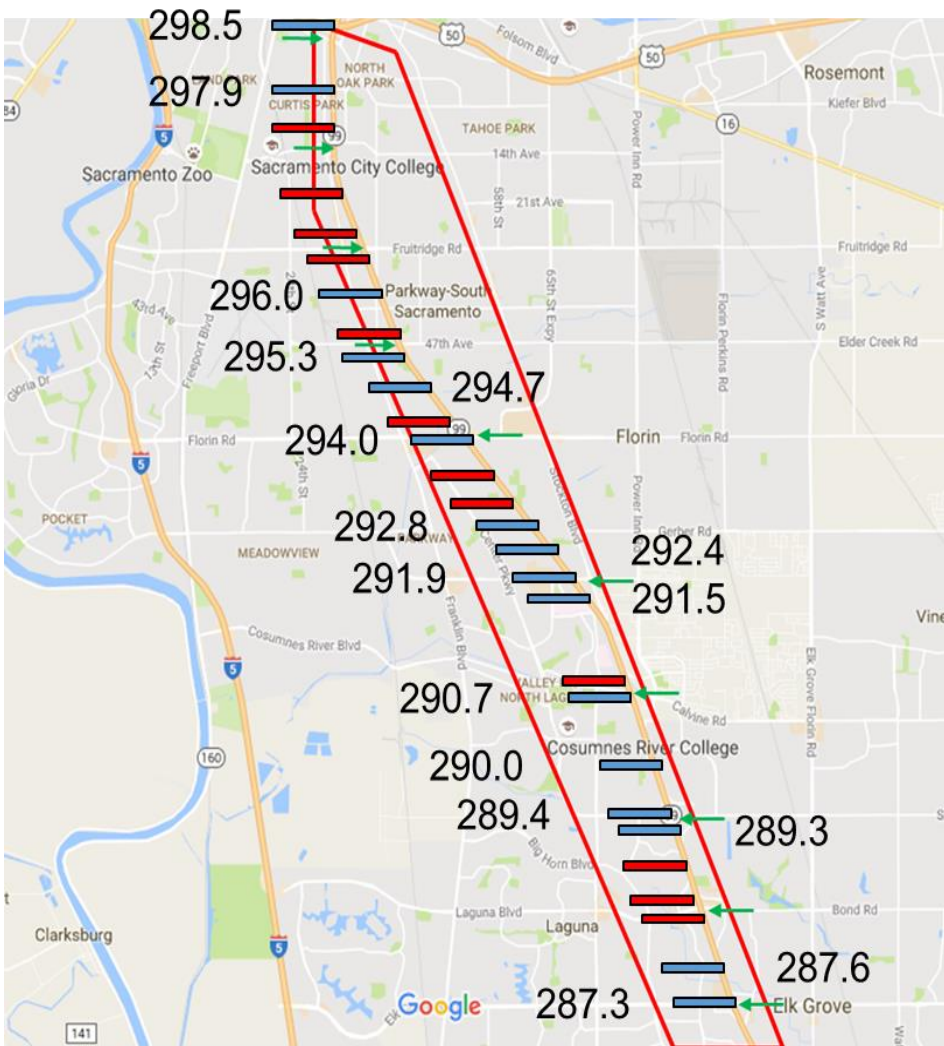
Impact Assessment Challenges

- **Traffic and energy impacts scale strongly with market penetration of CAVs**
 - **Large numbers of CAVs are not available for full-scale testing, and such testing would be very expensive even if they were available**
- **Must rely on microscopic computer simulations to estimate these impacts**
- **Needs high-fidelity, well calibrated models of normal driving behavior**
 - **Needs high-fidelity models of CAV behavior, derived from vehicle testing**

Traffic Microsimulations of CAVs

- **Start from high-fidelity representations of human driver car following and lane changing**
- **Calibrate human driver model to traffic data from a real freeway corridor**
- **First, model ACC and CACC car following based on full-scale vehicle experimental data**
- **Model traffic management strategies for taking advantage of CAV capabilities**
- **Analyze simulated vehicle speed profiles to estimate energy consumption**
- ***Results for Level 1 automation are relevant for higher levels of automation***

Manual Driving Model Calibration on CA SR-99 Corridor (Sacramento)



- Length: 13 miles = 21 km
- Morning peak: 6-9 AM
- 16 on-ramps
- 11 off-ramps, metered
- Recurrent delay mainly caused by high on-ramp demand

5-minute interval vehicle count and speed data at reliable detectors are used for calibration

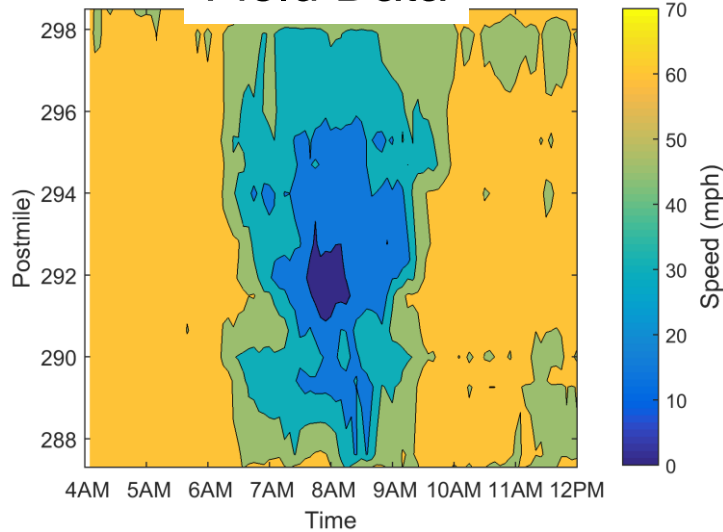
 **Unreliable Detector: not considered in calibration**

 **Reliable Detector: considered in calibration**

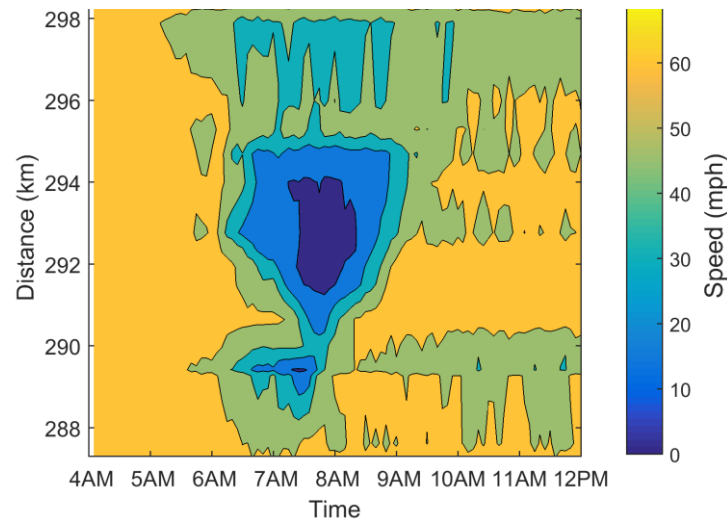
 **Interchange**

Manual Driving Model Calibration on CA SR-99 Corridor (Sacramento)

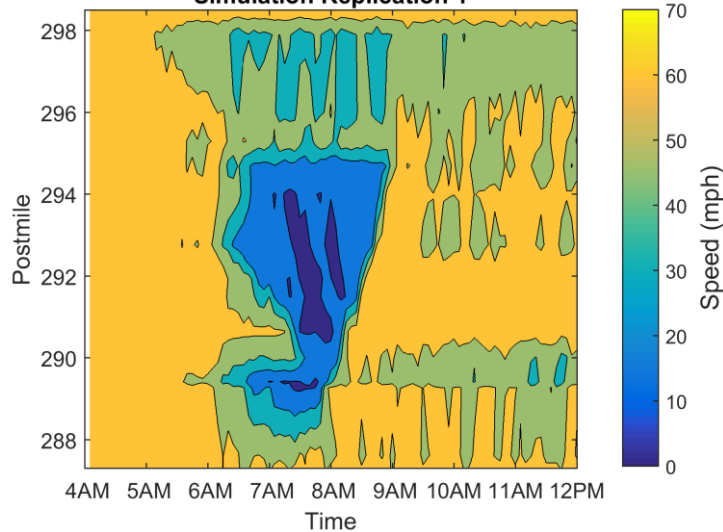
Field Data



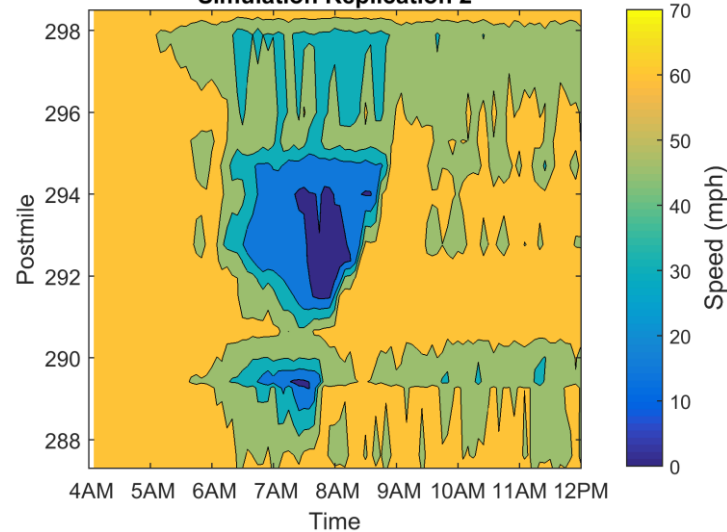
Averaged Simulation Data



Simulation Replication 1

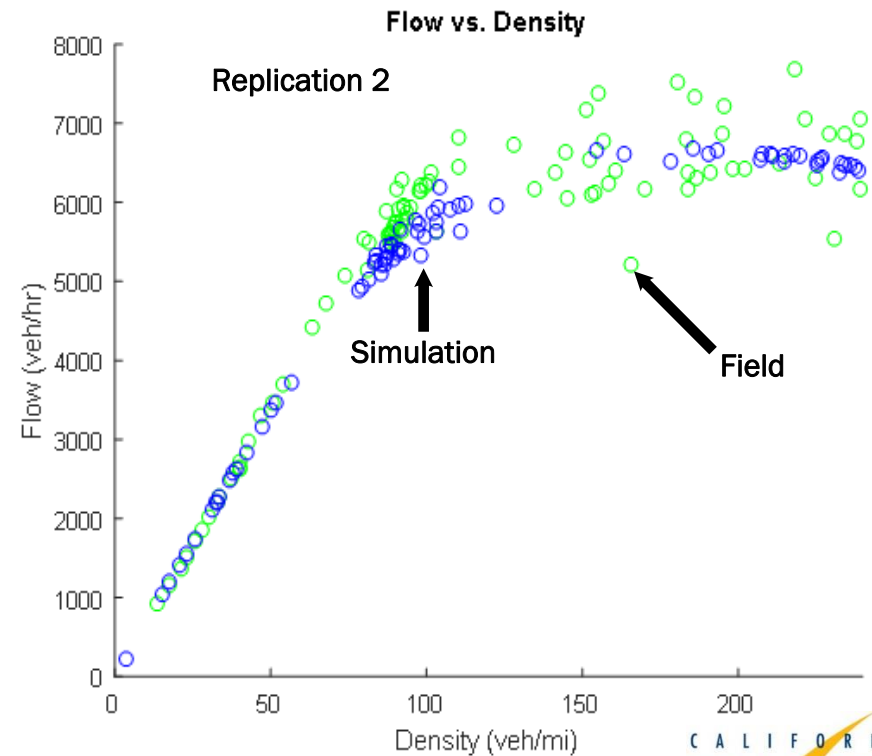
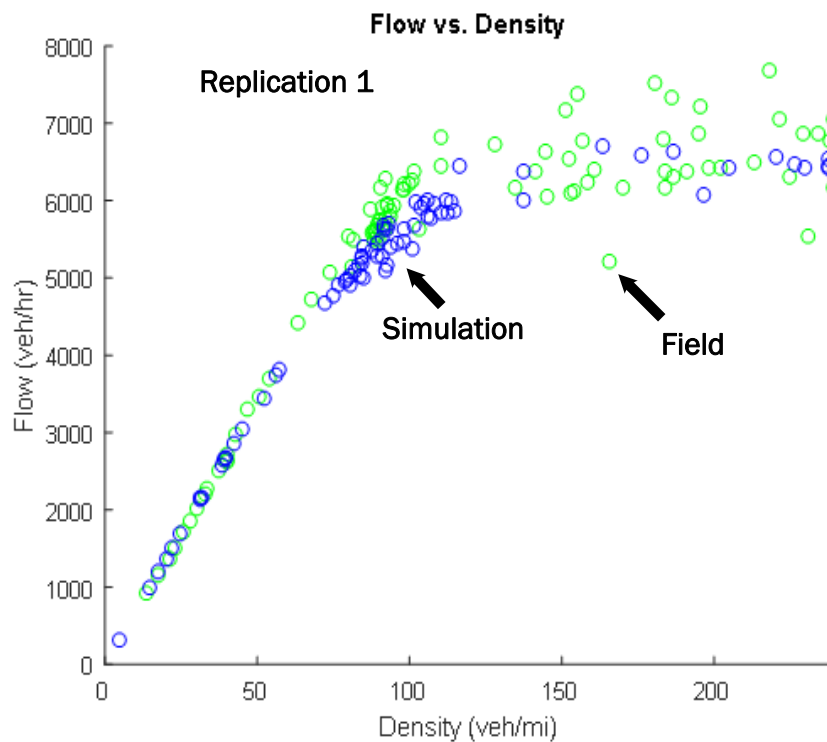


Simulation Replication 2



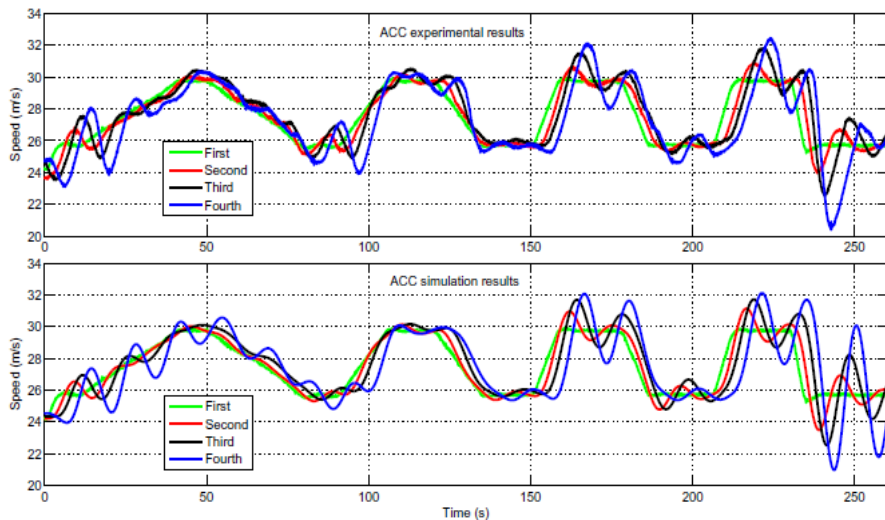
Manual Driving Model Calibration on CA SR-99 Corridor (Sacramento)

- Comparison of fundamental diagrams of simulated and field observed flow-density relationships
- Two sample replications at one detector location

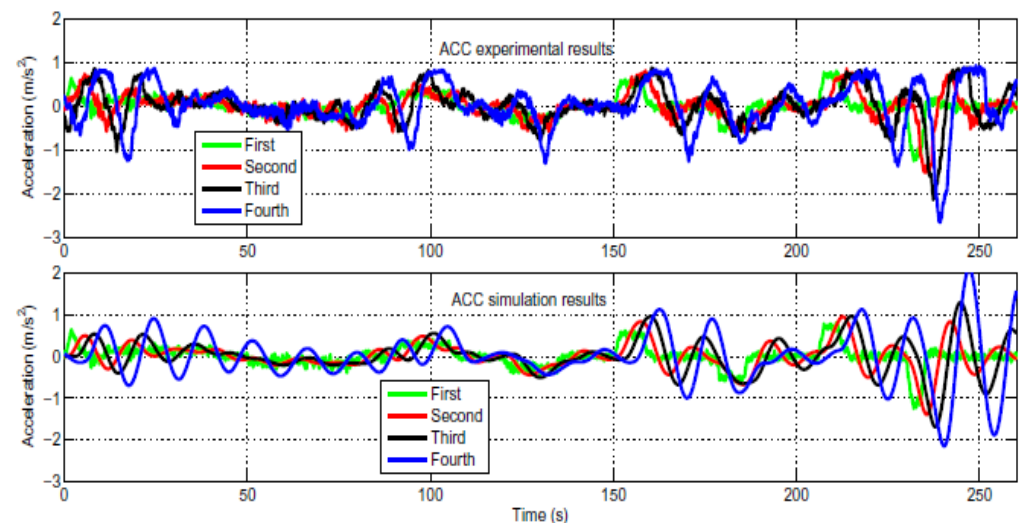


AACC Car-Following Model Predictions Compared to Calibration Test Results

Speeds
(Test above, model below)



Accelerations
(Test above, model below)

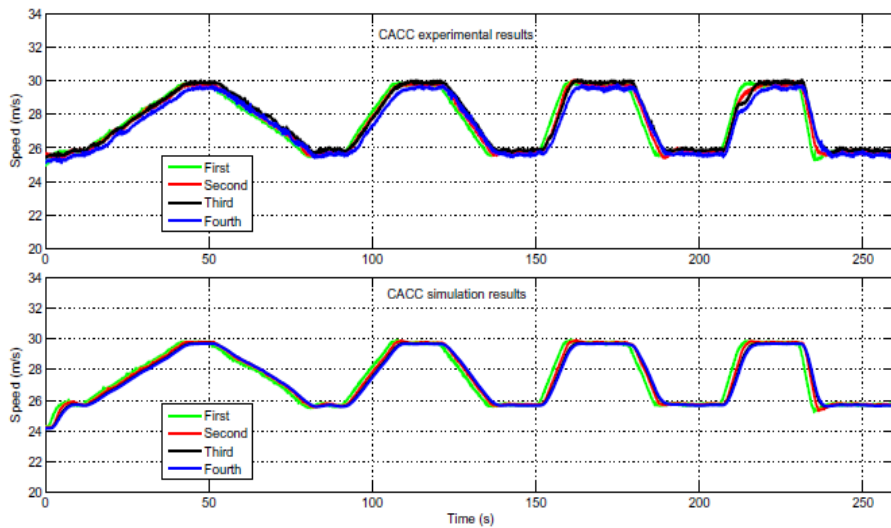


Note string instability (amplification of disturbance)

CACC Car-Following Model Predictions Compared to Calibration Test Results

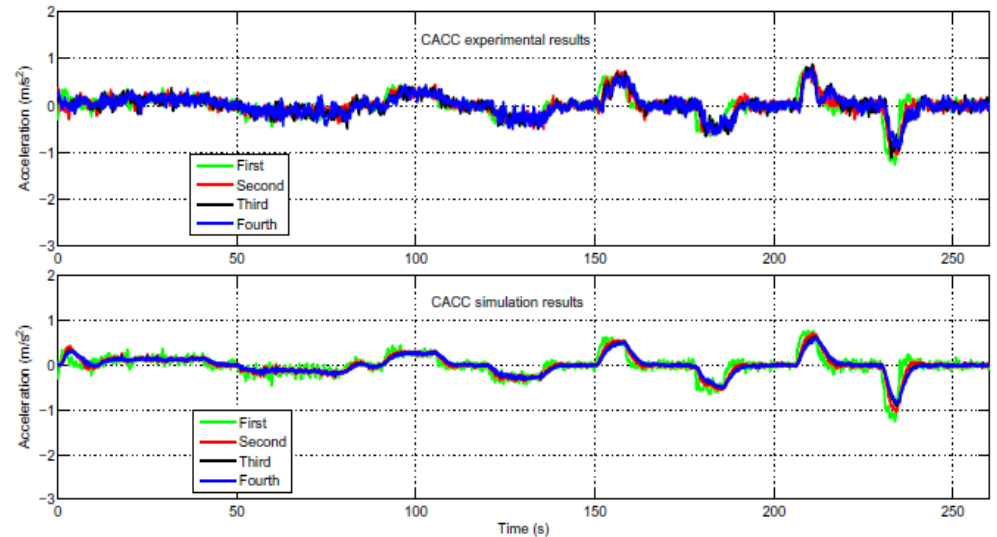
Speeds

(Test above, model below)



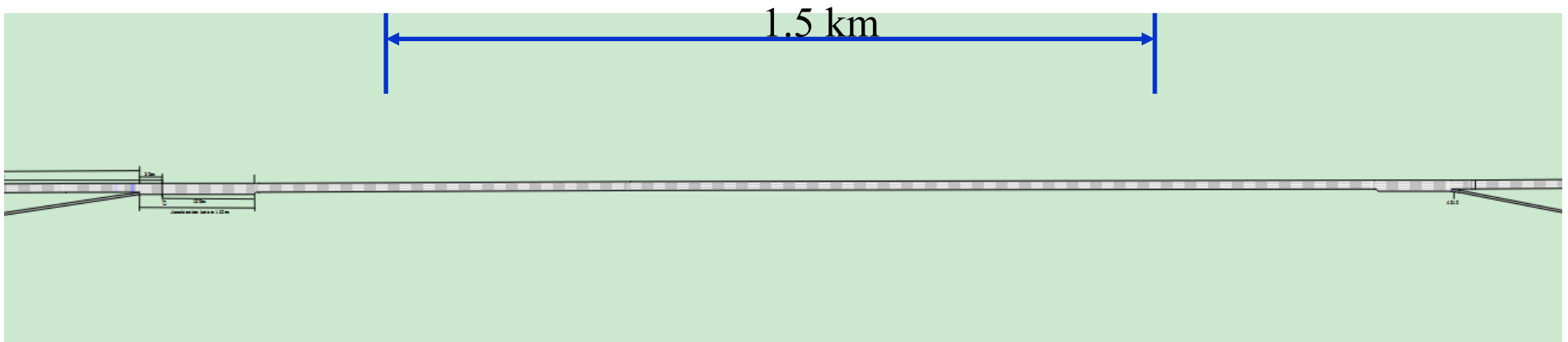
Accelerations

(Test above, model below)



Simple Highway Network Layout for Simulating Key Performance Trends

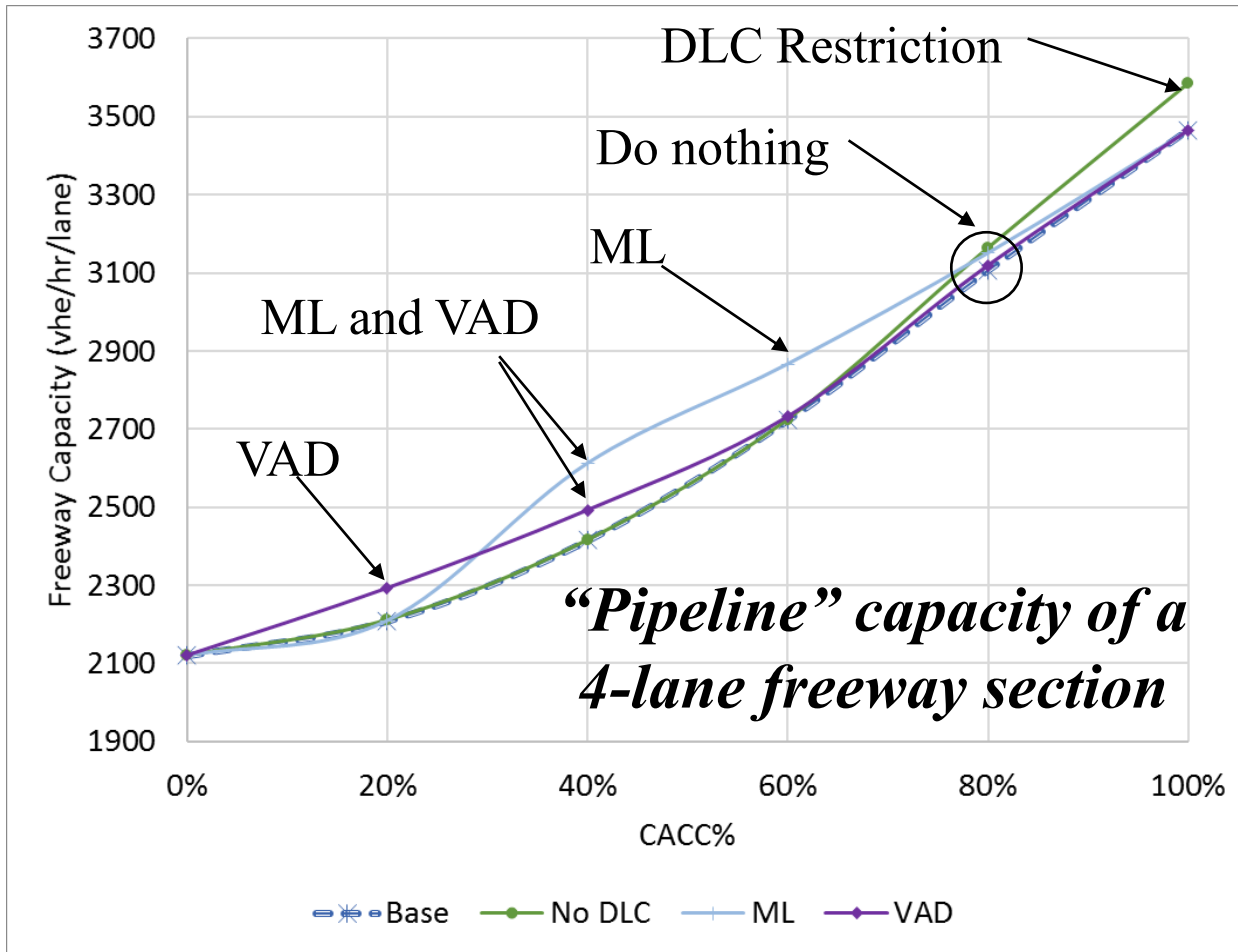
- **Four-lane mainline highway, traffic generated further upstream**
- **One-lane on-ramp, volumes from 300 to 1200 veh/hr**
- **One-lane off-ramp, volume from 5% to 25% of mainline**
- **On-ramp and off-ramp are 1.5 km apart**
- **Simulate far enough upstream and downstream to stabilize results**



Aspects of Performance Evaluated in Simulations

- **Maximum downstream throughput achievable**
- **Travel times and delays traversing test section**
- **Energy consumption**
- **Effects of variations in:**
 - **AACC, CACC market penetration**
 - **On-ramp and off-ramp traffic volumes**
 - **Maximum allowable CACC string length**
 - **Minimum gap between CACC strings**
 - **Priority use of left-side managed lane**
 - **Availability of automated merge/lane change coordination**

Lane Capacity Increases for Different Management Strategies with CACC



- Strong increase with CACC market penetration

Managed lane (ML) strategy works best under the following conditions:

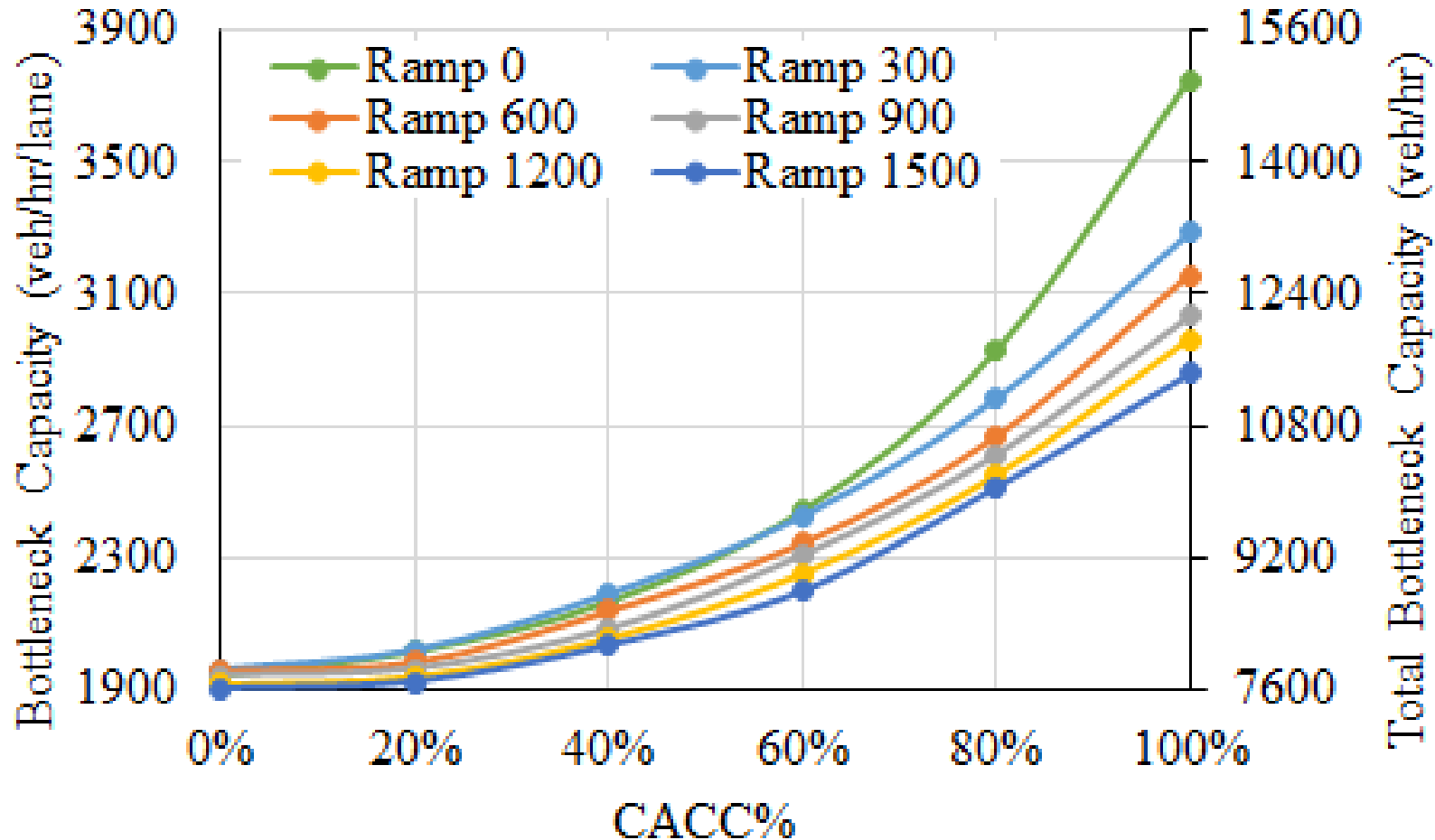
- 40% CACC with 1 ML,
- 60% CACC with 2 MLs,
- 80% CACC with 3 MLs

Different strategies are best for different CACC market penetrations

CACC Throughput with Varying On-Ramp Volumes

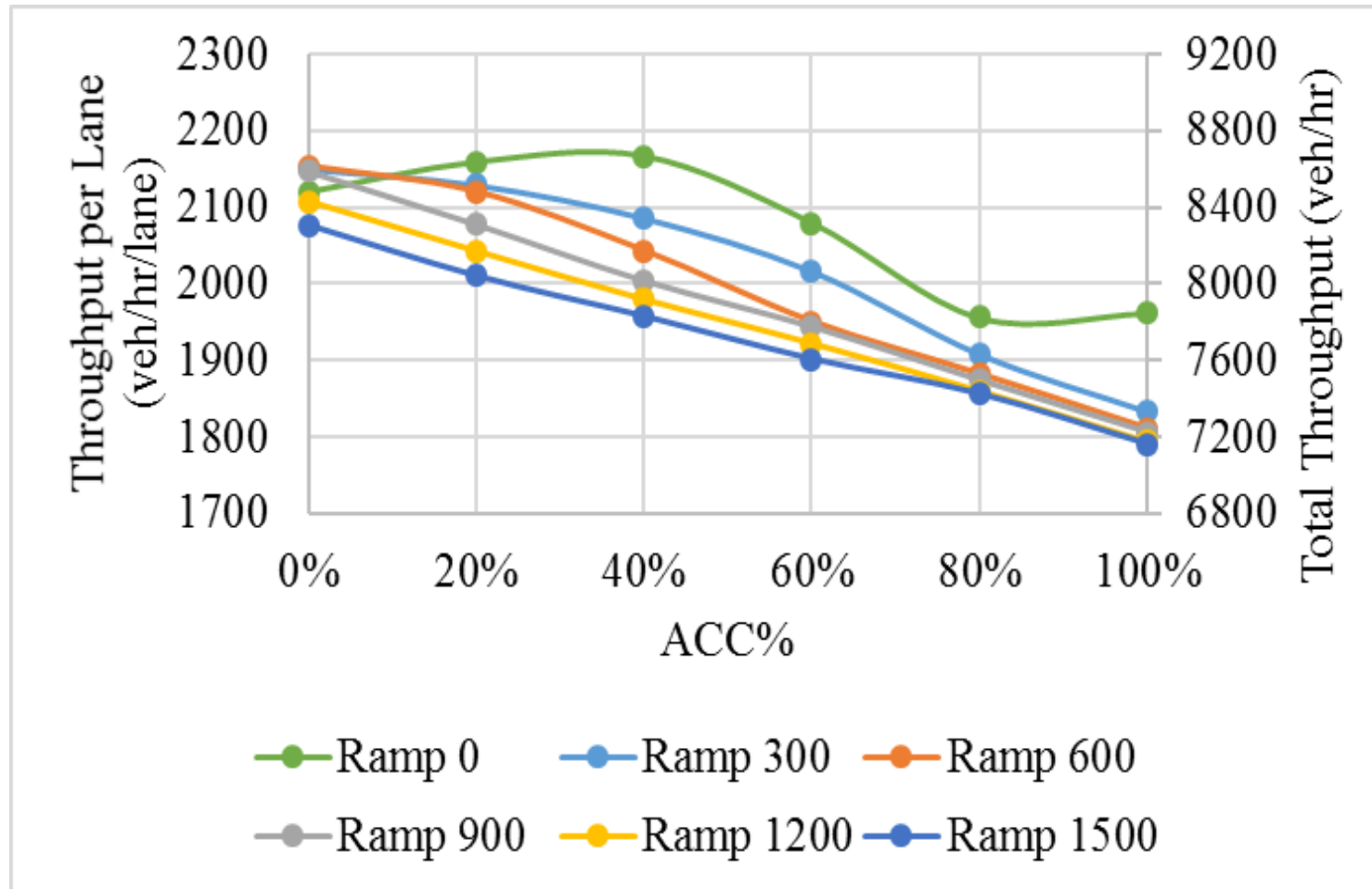
Ramp traffic entering in veh/hr

Mainline input traffic volume is at pipeline capacity for that market penetration



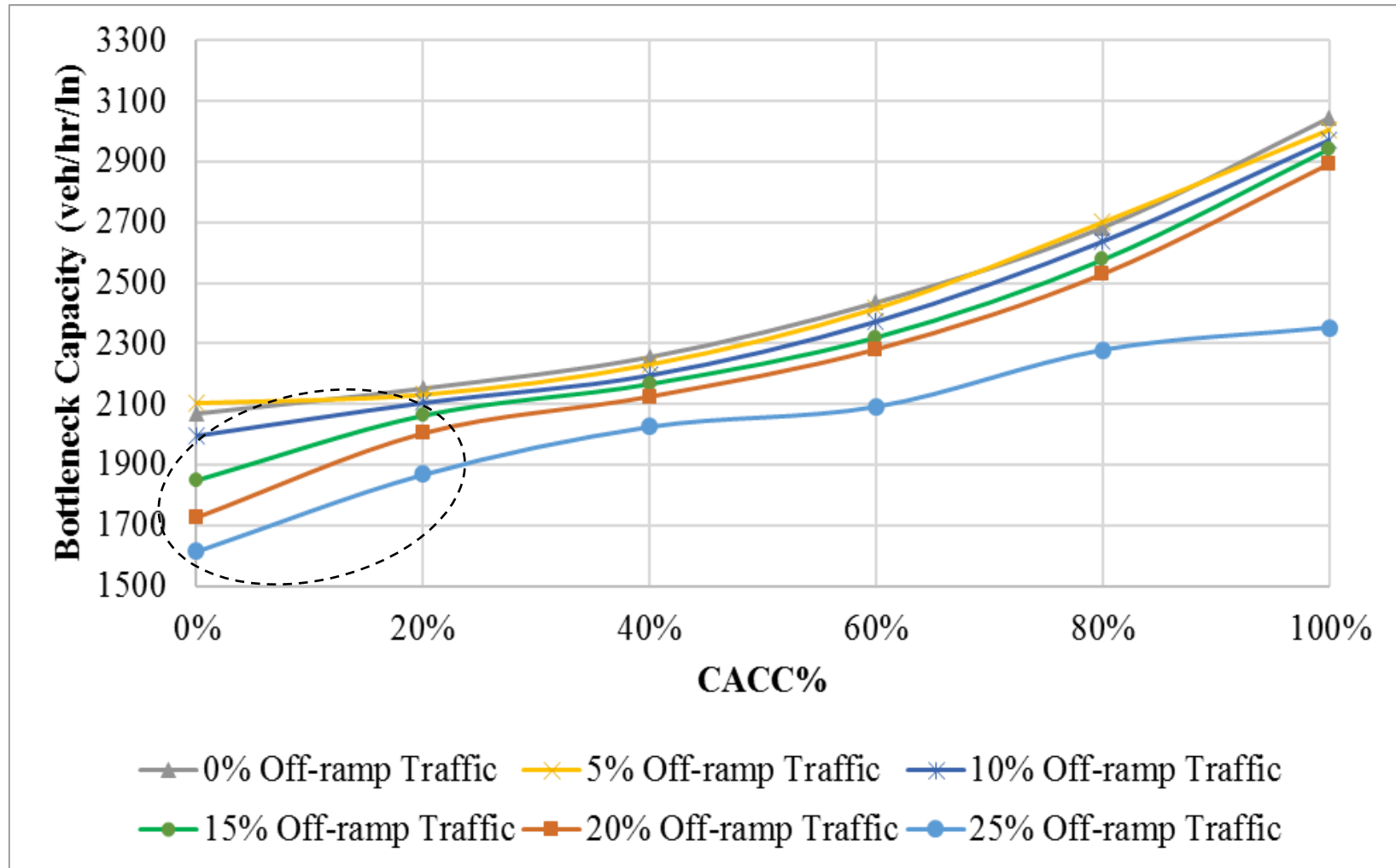
Downstream throughput reduces as on-ramp traffic increases

AACC Throughput with Varying On-Ramp Volumes



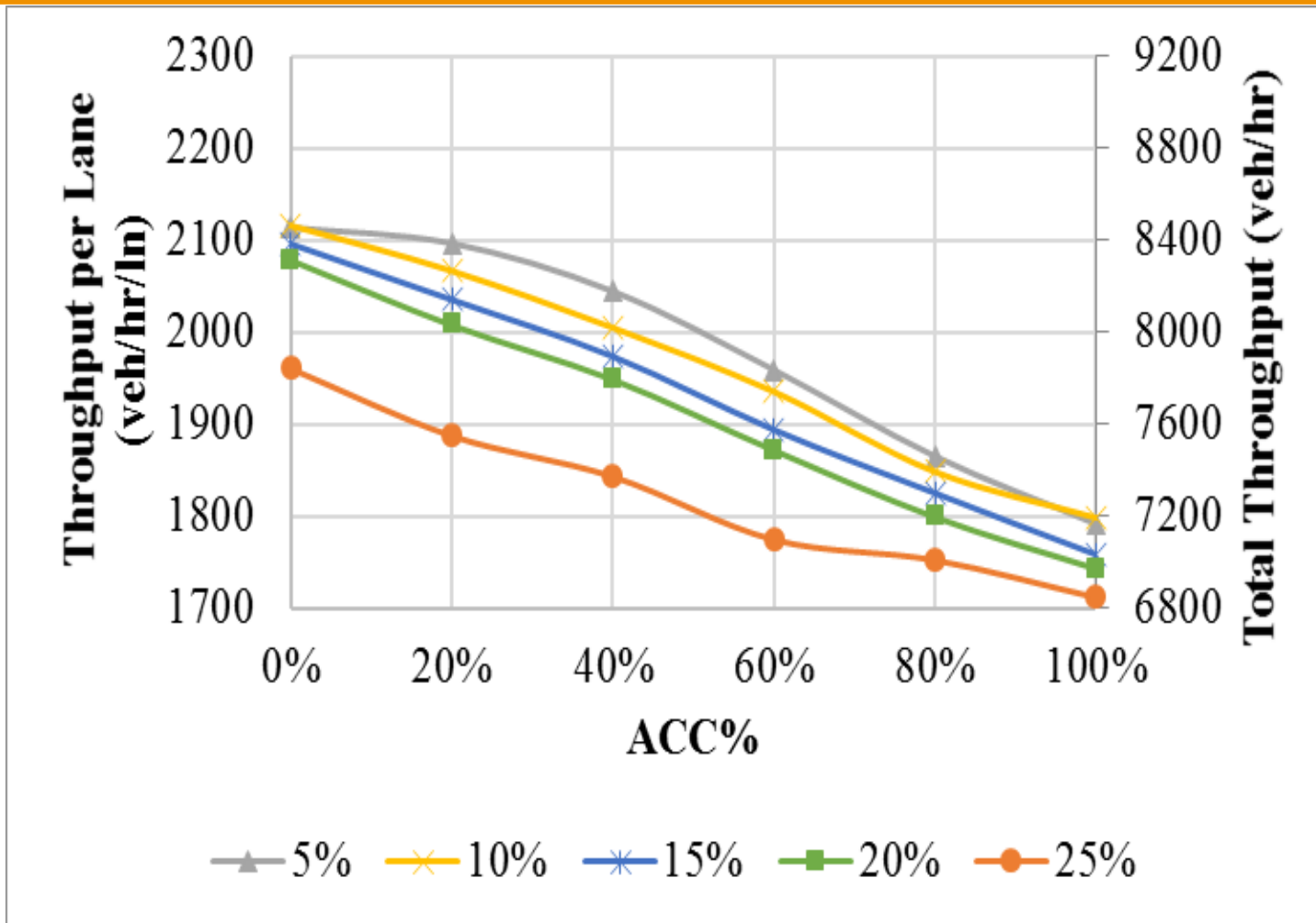
Traffic flow instability with more AACC (lacking V2V communication capability)

CACC Throughput for Various Exiting Traffic Volumes



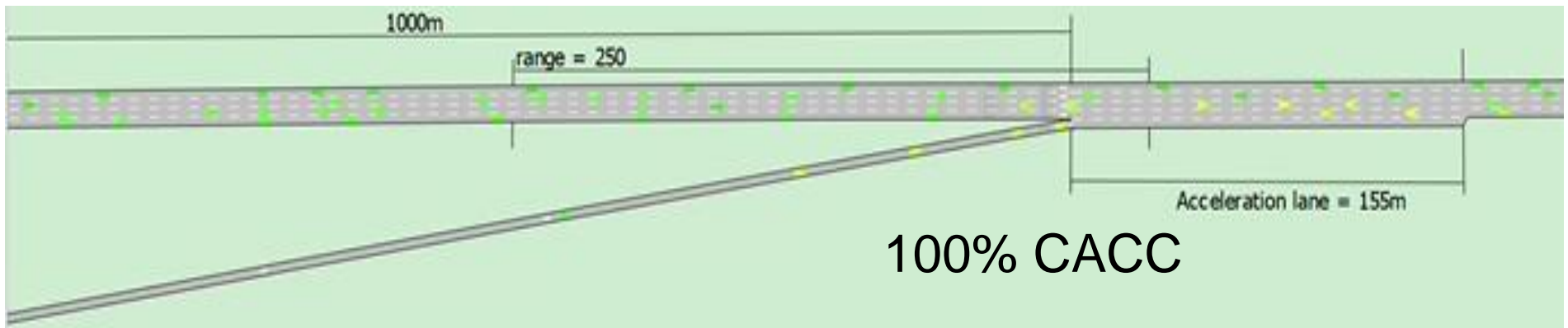
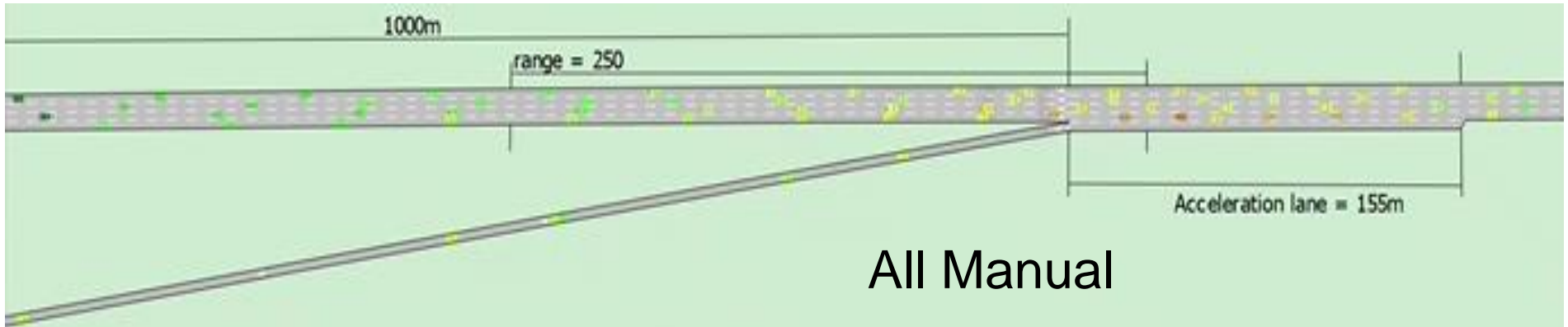
- **When off-ramp traffic exceeds 20% of mainline volume, traffic management strategies are needed**

AACC Throughput for Various Exiting Traffic Volumes



Traffic flow instability with more AACC (lacking V2V communication capability)

Animations Comparing Manual and CACC Driving at a Merge Junction for the Same Traffic Volume



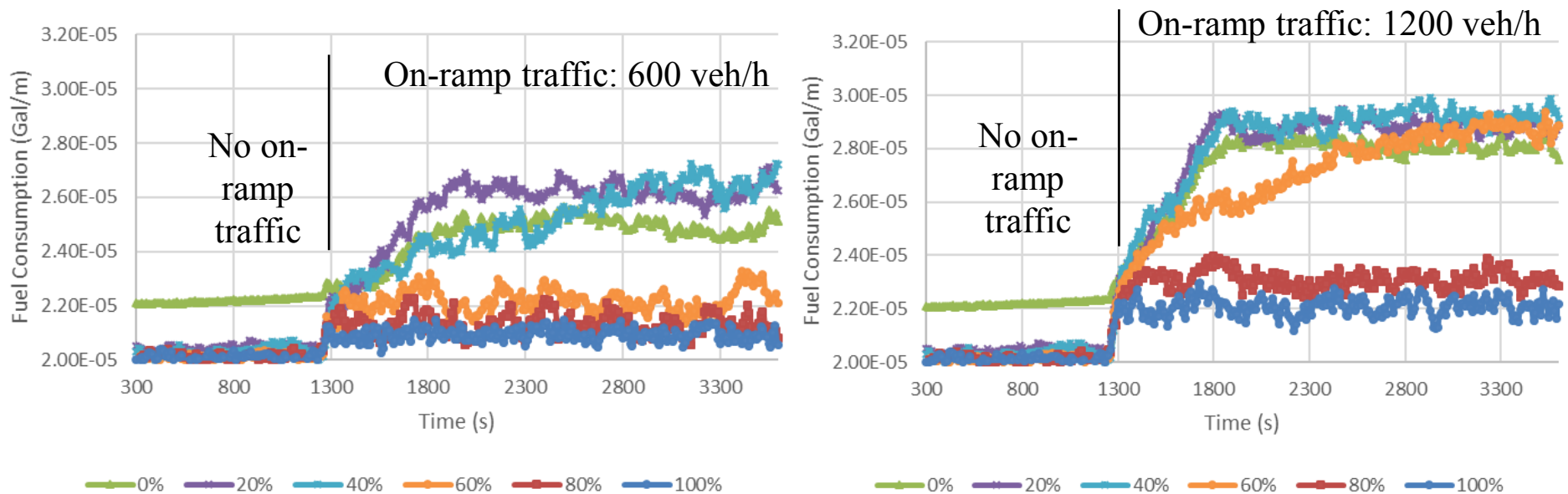
Mainline input: 7500 veh/hr

On-ramp input: 900 veh/hr

Fuel Consumption Comparisons

- **Mainline upstream input: fixed as the pipeline capacity achievable with all-manual driving**
- **On-ramp input: 300 to 1500 veh/hr**
- **CACC market penetration: 20% to 100%**
- **CACC operation strategies: CACC with Managed Lanes (ML) and Vehicle Awareness Devices (VAD)**
- **AACC also compared (without cooperation)**

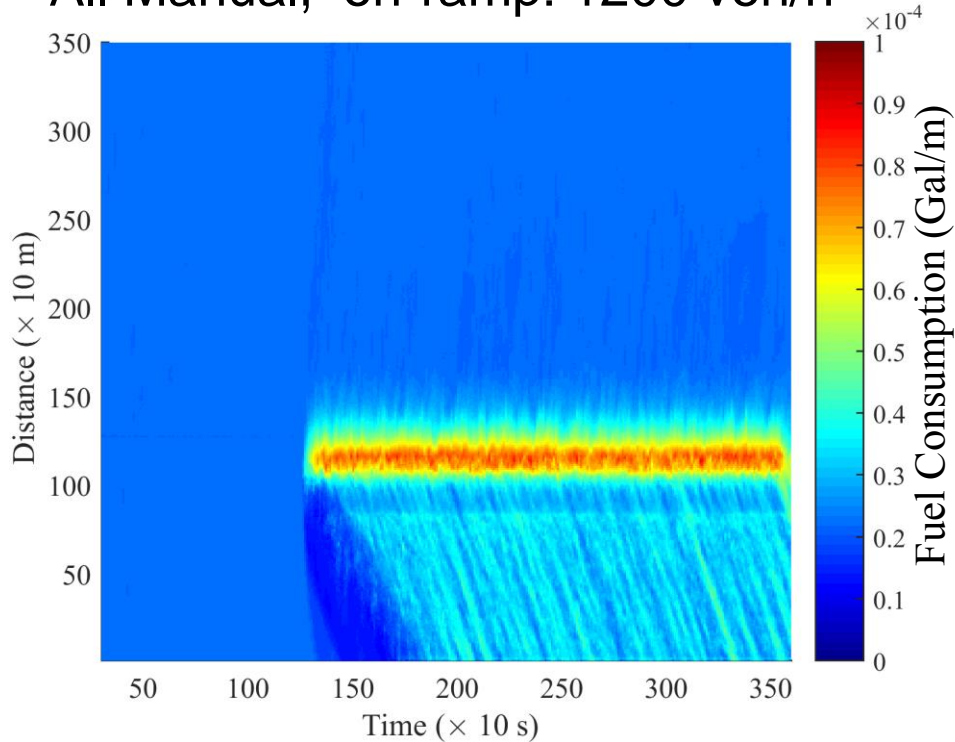
Fuel Consumption vs. Time with Addition of On-Ramp Traffic



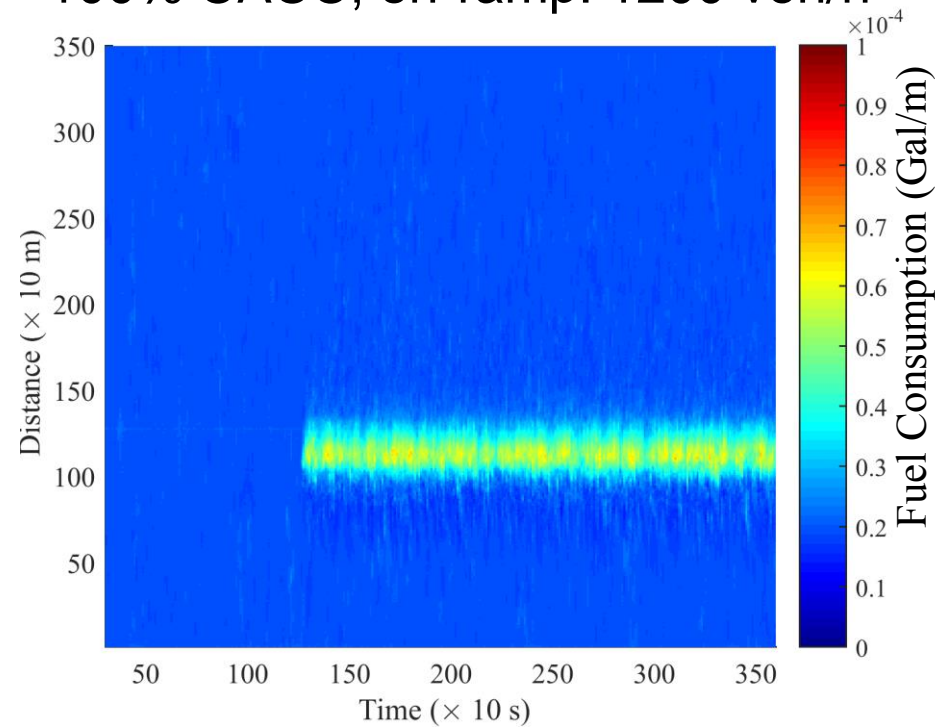
- CACC from 0% to 100%, in 20% increments
- Lower % CACC cases are worse than the all-manual case due to the negative impact of the ACC controller on the lead vehicle.
- Above a critical CACC market penetration, traffic becomes free flow, reducing fuel consumption.

Fuel Consumption: Spatiotemporal Pattern

All Manual, on-ramp: 1200 veh/h

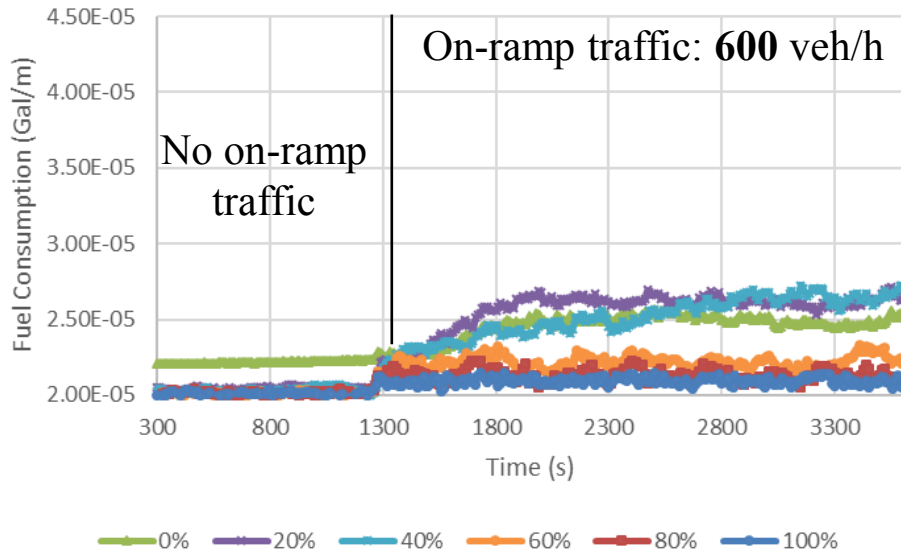


100% CACC, on-ramp: 1200 veh/h

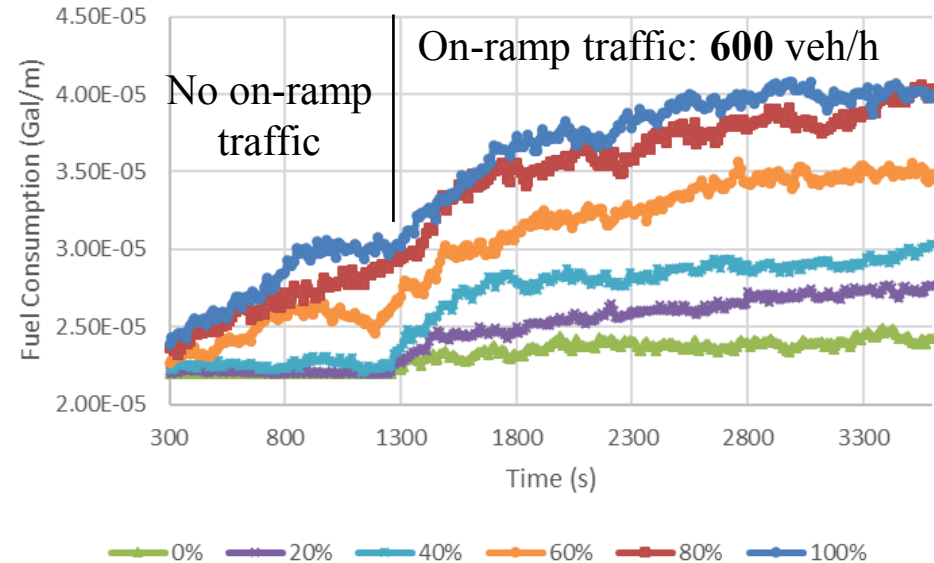


Fuel Consumption: ACC vs. CACC

CACC



ACC

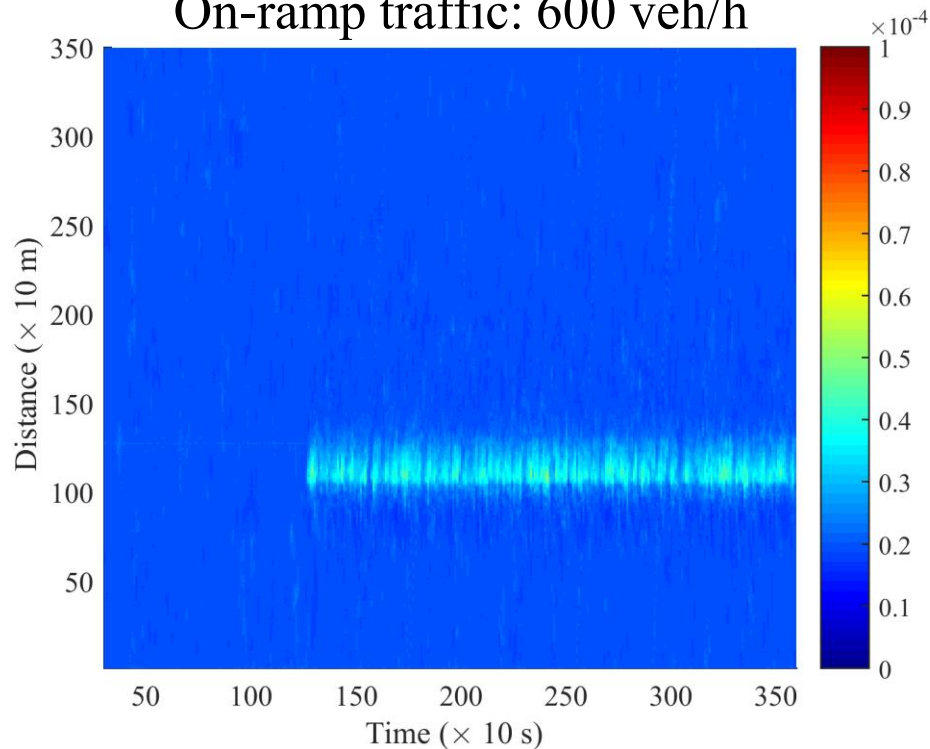


- When the mainline and on-ramp traffic volumes are the same, the fuel consumption rate is almost twice as much in the 100% ACC case as in the 100% CACC case.

Fuel Consumption: ACC vs. CACC

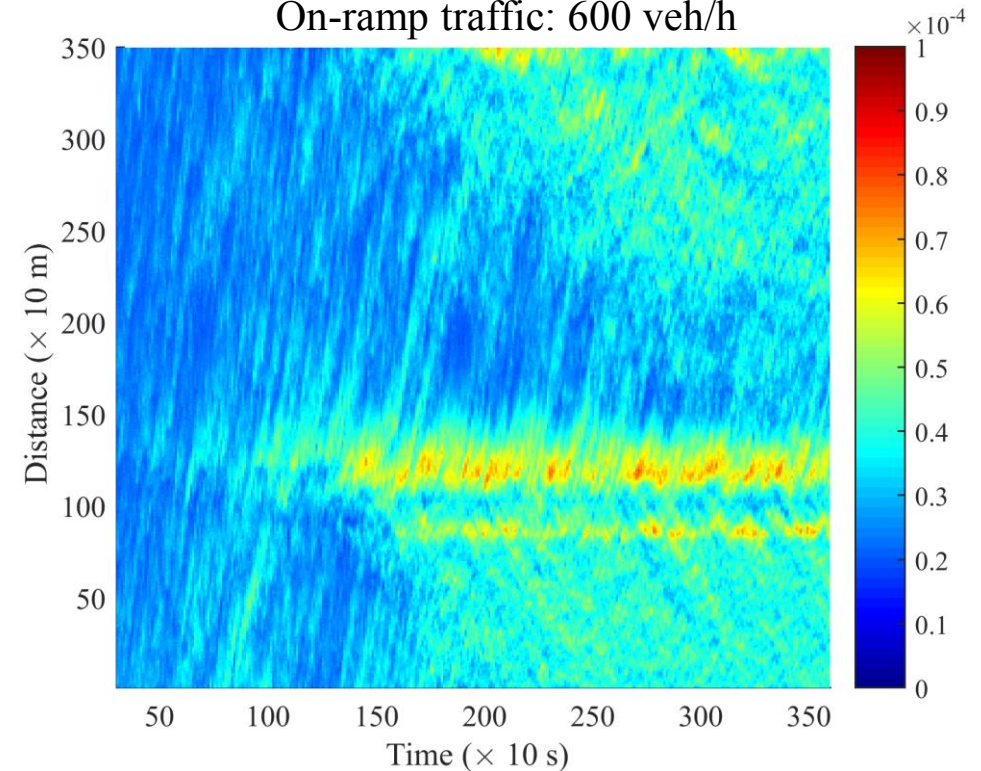
100% CACC

On-ramp traffic: 600 veh/h



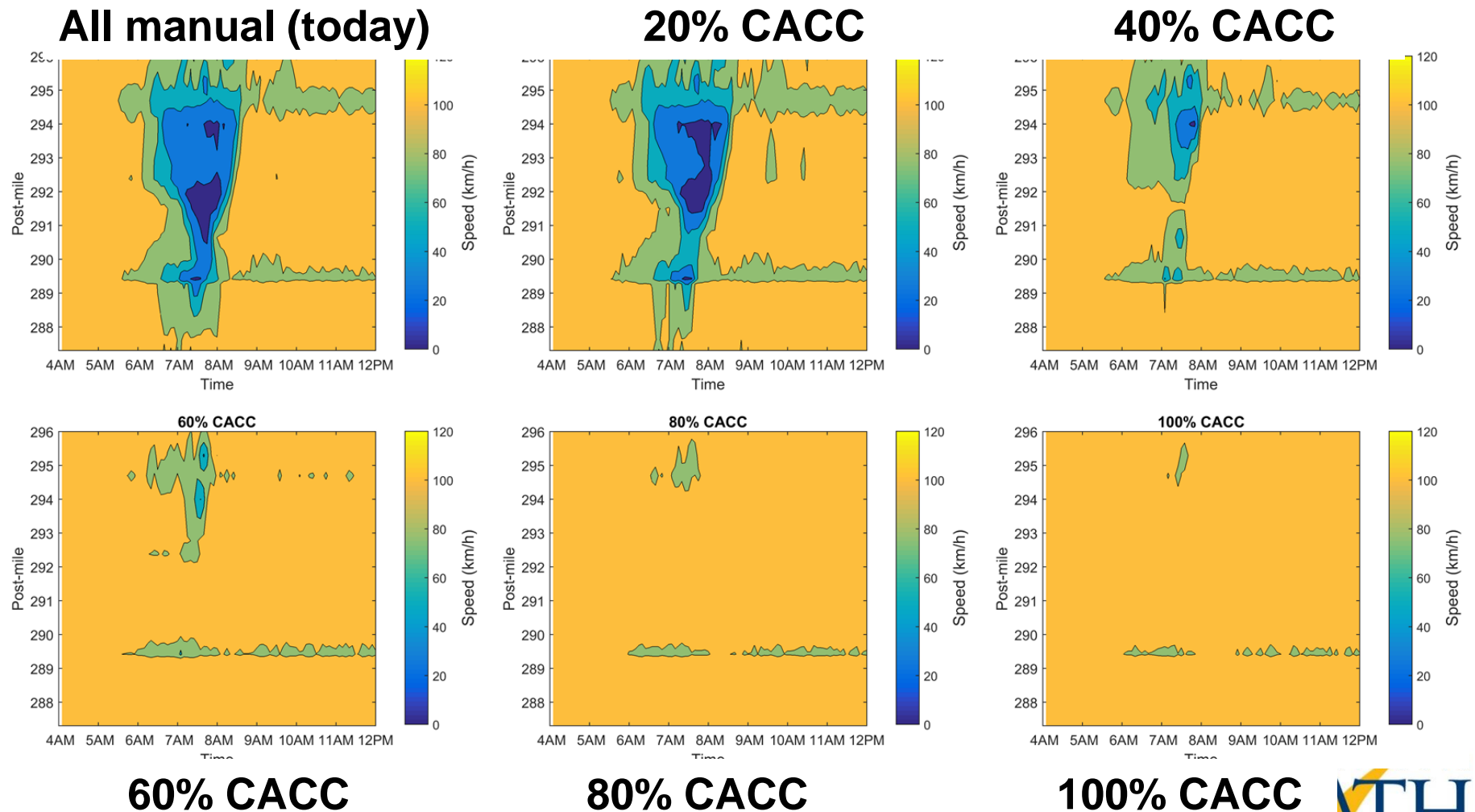
100% ACC

On-ramp traffic: 600 veh/h



Effects of CACC Market Penetration on SR-99 Corridor Congestion

Traffic speeds from 4 am to 12 noon at current traffic volume



Primary Findings from ACC/CACC Simulation Evaluations (1/2)

- **Automation without cooperation reduces traffic throughput and energy efficiency because of unstable car following**
- **Throughput improvement grows quadratically with cooperative vehicle following market penetration**
- **If cooperative automation string (platoon) length is not limited, strings grow very long, interfering with lane changing (recommend limiting to 10 cars)**
- **Choose gap between strings (platoons) to balance between efficient use of space and leaving gaps to permit lane changing (1.5 s looks reasonable)**

Primary Findings from ACC/CACC Simulations (2/2)

- **Performance is sensitive to assumptions about desire of drivers to change lanes to go faster (discretionary lane changing -- DLC)**
- **Managed lanes for CACC can improve traffic conditions in certain cases (when CACC market penetration and number of managed lanes are well matched)**
- **With CACC gap preferences of drivers in our field test, highway throughput could increase about 50% when all drivers use CACC**
- **Additional throughput increases will need active control of merging and lane changing**