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**Simulation Evaluation of Green Driving Strategies Based on  
Inter-Vehicle Communications**

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August 2010

1 **SIMULATION EVALUATION OF GREEN DRIVING STRATEGIES BASED ON**  
2 **INTER-VEHICLE COMMUNICATIONS**

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## 34 **ABSTRACT**

35 Transportation system produces a large percentage of local pollutants including hydrocarbons  
36 (HC), carbon monoxide (CO), carbon dioxide (CO<sub>2</sub>), and oxides of nitrogen (NO<sub>x</sub>), etc. Apart  
37 from switching to alternative fuels, one measure would be to apply information and communi-  
38 cation technologies to help us drive more smoothly so as to decrease pollutants emissions. This  
39 paper studies potential benefits of two green driving strategies based on inter-vehicle communi-  
40 cation (IVC). Here green driving strategies are similar to intelligent speed adaptation , but we assume  
41 that an IVC-equipped vehicle is able to receive detailed trajectory information from other such ve-  
42 hicles with the help of IVC. For the purpose of evaluation, we integrate Newell's car-following  
43 model and VT-Micro to establish a simulation platform. Market penetration rates of IVC-equipped  
44 vehicles and delivery delays of messages are two prominent features of IVC systems. We simulate  
45 stop-and-go traffic to calculate potential reductions in air pollutant emissions and fuel consumption  
46 under different market penetration rates and delivery delays. Results show that significant savings  
47 under frequent stop-and-go traffic conditions may be obtained with our strategies (HC: -88.3%,  
48 CO: -95.8%, NO<sub>x</sub>: -91.5%, CO<sub>2</sub>: -36.3%, Fuel Consumption: -71.3%) for the same travel time  
49 and almost the same overall travel distance. It is also shown that relatively large savings can be  
50 achieved even for a market penetration rate as low as 1% and communication delays larger than  
51 2 minutes. In the future we will investigate environmental benefits of green driving strategies for  
52 more traffic scenarios and realistic communication scenarios.

53 **Keywords:** Green Driving, Emissions, Fuel Consumption, VT-micro Emission Model, Newell  
54 Car-following Model, Intelligent Adaptation System, Inter-vehicle Communication

# 55 1 INTRODUCTION

56 According to the Energy Information Administration, the transportation sector in the U.S. is re-  
57 sponsible for one third of CO<sub>2</sub> emissions, over one half of NO<sub>2</sub> emissions, and over three quarters  
58 of CO emissions. Globally, the situation is worsening with the rapid development of motor vehicle  
59 transportation in developing countries. It is well known that excessive speed (defined as exceeding  
60 the posted speed limit or driving too fast for ambient conditions [1]) and stop-and-go traffic on road  
61 can significantly increase fuel consumption and vehicle emissions [2]. Many strategies have been  
62 proposed to address this problem. In [3], effects of speed bumps on road were investigated to con-  
63 trol speed. In [4], effects of police enforcement were studied to monitor speed in road. However,  
64 both of these two traditional methods have proven to have only moderate effects on controlling  
65 excessive speed [2].

66 In the past few years, many telecommunications and information technologies have been adopted  
67 by drivers to improve their daily driving experience. For example, the sales of global positioning  
68 systems (GPS) units are up 488% during the holiday season of 2008 [5], and adaptive cruise control  
69 systems have helped drivers reduce their workload and its associated stress [6]. In the near future,  
70 with the development of IntelliDrive technologies, especially inter-vehicle communications (IVC),  
71 including vehicle-to-vehicle and vehicle-to-infrastructure communications, will be available to re-  
72 lay time-critical and location-based traffic information between vehicles so that people can drive  
73 more smoothly and more safely. As the number of cars equipped with these technologies increases,  
74 we expect that drivers will adapt their behaviors accordingly [7]. Such collective behavior changes  
75 will result in different traffic flow characteristics, transportation systems performance, and envi-  
76 ronmental impacts. Therefore instead of using alternative fuels[8] and traditional methods, new  
77 technologies, such as IVC and cooperative autonomous cruise control (CACC) can also be used  
78 to improve traffic flow, fuel consumption economy, and reduce emissions.

79 Inter-vehicle Communications (IVC) can help establish self-organized, decentralized, real-

80 time traffic information systems. Many studies are underway to investigate IVC based on mobile ad  
81 hoc networking technology as a mean of developing the "internet on the road" [9, 10]. In [11, 12,  
82 13], researchers describe potential applications and properties of Autonet, including connectivity,  
83 adthe impacts of market penetration rate (MPR), and delivery delay, and the effect of IVC on  
84 vehicle travel time. However, there have been no systematic studies of potential environmental  
85 benefits of IVC.

86 In the literature there have been studies on intelligent speed adaptation (ISA) strategies to  
87 smooth traffic. ISA systems use aggregate-level road congestion information to adjust speed limits  
88 of vehicles on specific road sections [2]. Moreover, ISA systems monitor vehicle speeds and  
89 current traffic conditions, and, based on these, they provide corrective actions or optimal process  
90 for drivers. The information collected for ISA is usually obtained from loop-detectors or on-  
91 board sensors. In ISA systems, there are three basic methods to adjust speed limits [14, 2]:  
92 fixed, variable and dynamic. Such speed limits could be implemented in advisory, voluntary, or  
93 mandatory fashions [14, 2].

94 Recently, a lot of energy has been devoted to testing the impacts of ISA systems, including on  
95 road injuries, the release of air pollutants and fuel consumption. These studies have shown that  
96 ISA can effectively improve safety and reduce traffic congestion. In [2], a set of speed limits and  
97 corrective actions are communicated to drivers. In addition, ISA has potential to mitigate conges-  
98 tion by smoothing the dynamics of congested traffic. ISA equipped vehicle has a much smoother  
99 trajectory (with smaller speed variation), which leads to fuel savings and emission reductions. Re-  
100 sults show that ISA can reduce fuel consumption up to 70 percent, and cut emissions of CO, HC  
101 and NOx by 93 percent, 90 percent and 86 percent respectively. Even for realistic traffic adjust-  
102 ment, fuel consumption can decrease by 13 percent. But it was shown that ISA systems could  
103 increase travel time by a small percentage (6 percent). In addition, many field implementations of  
104 ISA systems have been done to test the influence of ISA on traffic safety and the environment. ISA  
105 experiments in Tilburg (Netherlands) show that with speed limits control, driving is much safer

106 [15, 16, 17]. Road injuries are reduced by 15 to 20 percent, and carbon dioxide emissions are  
107 reduced by approximately 11 percent. Moreover, in [18], with optimal speed limits adjustment,  
108 freeway traffic conditions are more stable, which also benefits to driving safety and reduces air  
109 pollutants emissions. Another concern with ISA systems is that they may worsen road congestion.  
110 However, in [19, 20], Liu and Tate show that under very congested levels, ISA does not change  
111 traffic conditions.

112 In this paper, we will study green driving strategies based on IVC and, in particular, their effects  
113 in emission reductions and fuel consumption savings in different traffic conditions. We assume  
114 that IVC-equipped vehicles share their trajectories with each other. With detailed information of  
115 vehicles' trajectories, we propose two green driving strategies to maximize energy efficiency of  
116 vehicles in road. These green driving strategies are similar to ISA schemes, but, with the help of  
117 IVC, vehicles can get information from other vehicles directly. One advantage of such IVC-based  
118 green driving strategies is that vehicles can get more relevant information. But such strategies could  
119 be restricted by limited market penetration rates of IVC devices and communication delays. To  
120 evaluate the potential benefits of such green driving strategies, Newell's car-following model [21]  
121 and the VT-Micro emission model [22] are integrated into a simulation platform.. Newell's model  
122 is a trajectory translation model, which is based on vehicle locations. The model is simple and  
123 straightforward to describe vehicle movement in traffic streams. Moreover, studies in [23] show  
124 that Newell's model matches realistic vehicle trajectories very well. So, with proper parameter  
125 values, using Newell model can lead to well description of traffic streams. Moreover, we can  
126 change the desired speed of individual drivers based on green driving strategies. With the integrated  
127 simulation model we then study environmental benefits of green driving strategies for different  
128 market penetration rates and communication delays.

129 This paper is organized as follows. In Section 2, We first describe green driving strategies to  
130 smooth traffic streams. In Section 3, we combine a microscopic traffic model with an emission  
131 model to study green driving strategies. In Section 4, we summarize results from our simulations

132 that study strategies described in Section 2. Section 5 presents concluding remarks.

## 133 **2 GREEN DRIVING STRATEGIES BASED ON INTER-VEHICLE** 134 **COMMUNICATIONS**

135 In this section, we first present two IVC-based green-driving strategies and then introduce commu-  
136 nication delays to the strategies.

### 137 **2.1 Two Green Driving Strategies**

138 With IVC-based green driving strategies, speed limits of all IVC-equipped vehicles are set based  
139 the information they gather from other IVC-equipped vehicles. In this study we propose to set an  
140 IVC-equipped vehicle's desired speed to the average speed calculated from other IVC-equipped  
141 vehicles.

142 Suppose that  $N$  vehicles run in a selected region of one traffic network and market penetra-  
143 tion rate of IVC equipped vehicles is  $p$ , the number of IVC-equipped vehicles is  $n$  (where expected  
144 value of  $n$  is  $Np$ ). For all vehicles with new technologies, we have two methods to set the speed lim-  
145 its under global and sectional traffic information. Then, based on messages broadcasted among ve-  
146 hicles, speed limits are modeled in the following ways. Suppose that spacing of all IVC-equipped  
147 vehicles are  $s_1^{IVC}(t), s_2^{IVC}(t), \dots, s_n^{IVC}(t)$ , and their speeds at time  $t$  are  $v_1^{IVC}(t), v_2^{IVC}(t), \dots, v_n^{IVC}(t)$ , then  
148 dynamic speed limits at time  $t$  can be modeled in the following two models. The first model is  
149 based on average value of speeds collected by IVC-equipped vehicles.

$$v_{lk}(t) = \frac{\sum_{i=1}^n v_i^{IVC}(t)}{n} \quad (1)$$

150 where  $v_{lk}(t)$  is the speed limit set for equipped vehicle  $k$  at time  $t$ . The second model is based on  
151 desired average speed of all IVC-equipped vehicles. The speed limit of equipped vehicle  $i$  is set as



152 following equation.

$$v_{lk}(t) = \frac{\sum_{i=1}^n (s_i^{IVC}(t) - d_j)}{\sum_{i=1}^n \tau_i} \quad (2)$$

153  
154 Both of the two strategies have their own advantages. For average speed adjustment, only  
155 speed information is necessary to be delivered, and speed can be obtained directly from vehicle  
156 engines or GPS devices. While for desired speed adjustment, we need more information, including  
157 time gap and jam spacing, which are only available when distance sensors are installed. However,  
158 the first model only considers global information, and the second strategy also incorporates local  
159 information. Therefore theoretically the second strategy should be more robust.

160 Additionally, with different considerations of network scales, speed limit adjustments are dif-  
161 ferent because of various numbers of equipped vehicles. In this paper, we set two different levels  
162 of network scales: *whole network (global)*, *downstream section (sectional)*. When we study the  
163 whole network, all equipped vehicles in transportation system communicate with each other. They  
164 share traffic information to improve the entire network conditions. The more advanced strategy is  
165 identifying dynamic speed limits for individual vehicles. The settings are based on downstream  
166 flow for a given vehicle. All IVC-equipped vehicles in selected region deliver information to the  
167 chosen vehicle and speed limits for this individual vehicle are calculated based on this informa-  
168 tion. Those two adjustments work under the two different network scales (global and sectional)  
169 and satisfy different planning targets.

## 170 **2.2 Communication Delays**

171 Using information provided by IVC, many interesting and useful applications have recently  
172 been studied, such as information warning system, traffic control, or cooperative assistance systems  
173 [24]. The most general platforms to apply IVC systems are cellular networks and mobile wireless

174 networks. Different applications of ICC depend differently on properties of the vehicular network.  
 175 For example, communication delays affect the quality of message delivery. For cellular networks,  
 176 the accuracy of traffic system delay, caused by communication is treated as constant value [25].  
 177 By contrast, for mobile ad hoc wireless network, communication delays dependent on routing  
 178 protocols and vehicle distributions [26]. . In [12], it was shown that delivery delay is highly  
 179 related to routing protocols, flow-rates, and market penetration rates. The conclusion of delay for  
 180 IVC system is that  $delay = 1/(flowrate * IVC(\%))$ . For environmental applications, delay is an  
 181 important consideration because the amount of pollutants released is sensitive to vehicles speed  
 182 and acceleration, which may change a lot during a non-trivial delay. Green driving strategies in  
 183 this paper process delay as a key parameter.

184 In this study, we consider two types of delays: constant delays, and delays linearly proportional  
 185 to distances between vehicles. The first type of delays could occur when IVC are enabled with  
 186 cellular networks, where communication delays are not sensitive to distance in a relatively small  
 187 region for applying green driving strategies. The second type of delays could occur when IVC are  
 188 enabled with instantaneous or delay-tolerant multi-hop ad hoc communications.

189 If we denote  $D_{i \rightarrow k}(t)$  as the delay of the information from vehicle  $i$  to vehicle  $k$  at  $t$ , then the  
 190 two green driving strategies can be written as

$$v_{lk}^{(1)}(t) = \frac{\sum_{i=1}^n v_i^{IVC}(t - D_{i \rightarrow k}(t))}{n}, \quad (3)$$

$$v_{lk}^{(2)}(t) = \frac{\sum_{i=1}^n (s_i^{IVC}(t - D_{i \rightarrow k}(t)) - d_i)}{\sum_{i=1}^n \tau_i}. \quad (4)$$

191 For constant delays,  $D_i = D, i = 1, 2, \dots, n$ . For delays linearly proportional to the distance,

$$D_{i \rightarrow k}(t) = \delta \cdot |x_i^{IVC}(t) - x_k^{IVC}(t)| \quad \forall i = 1, 2, \dots, n \quad (5)$$

192 where  $\delta$  is the coefficient of delay with distance between two equipped vehicles.

## 193 **3 AN INTEGRATED SIMULATION MODEL**

### 194 **3.1 Traffic Flow Model**

195 Newell's car-following model [21] is the simplest car-following model as it focuses on predicting  
196 vehicle trajectories. It assumes that a following vehicle tries to minimize its distance from its  
197 leading vehicle in congested traffic. And in free traffic, vehicle always keeps the free flow speed.

198 **Equation 6** describes this driving rule in congested and free traffic. We set the speed limit as  $v_{li}$   
199 for vehicle  $i$ , then from [27], we get Newell-Daganzo Car-following Model.

$$x_i(t + \tau_i) = \min \{x_{i-1}(t) - d_i, x_i(t) + v_{li} \cdot \tau_i\} \quad (6)$$

200 where, vehicle  $i - 1$  is the leader of vehicle  $i$ .

### 201 **3.2 Emission Model**

202 In 2004, Rakha *et al* [22] presented the Virginia Tech Microscopic energy and emission model  
203 (VT-Micro), which was developed to predict the emissions of different air pollutants for different  
204 vehicle classes using statistical models that relay on speed and acceleration. Their typical model,  
205 which was estimated via linear regression, linked the logarithm of a emission rate (or a fuel con-  
206 sumption rate) with a simple polynomial that contains vehicle speed and acceleration.

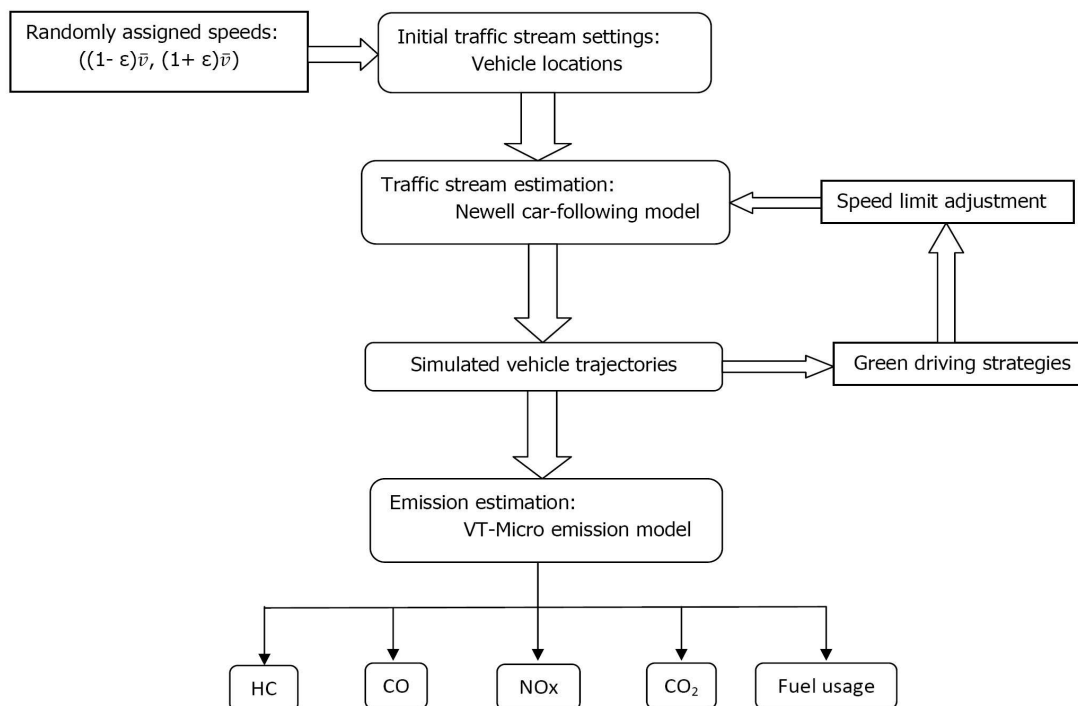
$$\log MOE_e = \sum_{i=0}^3 \sum_{j=0}^3 (K_{ij}^e u^i a^j) \quad (7)$$

207 where  $MOE$  is an instantaneous fuel consumption or emission rate (mg/s),  $K_{ij}^e$ 's are regression  
208 coefficients,  $u$  is a vehicle's instantaneous speed (km/h), and  $a$  is its instantaneous acceleration rate

209 (km/h/s).

### 210 3.3 Integrated Model

211 In this subsection, one integrated model with traffic flow and emissions models is described. Since  
212 both Newell model and VT-Micro emission model are microscopic models, the connection be-  
213 tween these two models are straightforward. **Figure 1** describes the flow chart of applying Newell  
214 model and VT-Micro emission model to estimate emissions and fuel consumption under different  
215 green driving strategies.



**Figure 1: Flow Chart of Integrating Newell Model and VT-Micro Emission Model**

216 The integrated model has four basic components: Initial traffic stream setting, traffic stream  
217 simulation, speed limit adjustment with green driving strategies and emission estimation. In initial

218 traffic stream setting, distribution of initial vehicle speeds is arbitrarily provided, which is applied  
 219 to set the initial vehicle locations in road. Secondly, for traffic stream simulation, all vehicle trajec-  
 220 tories are simulated with proper parameter settings (e.g. time gap, jam spacing, speed limit, etc). In  
 221 the third components, historical trajectories are packed to be communicated between informed ve-  
 222 hicles, which are used to adjust speed limits based on the strategies described in section 2. Finally,  
 223 with well adjusted vehicle trajectories, VT-Micro emission model helps to estimate emissions and  
 224 fuel consumption. With different green driving strategies, we compare emissions and fuel usage to  
 225 study effects of these new technologies.

## 226 4 SIMULATION

**Table 1 Simulation Settings**

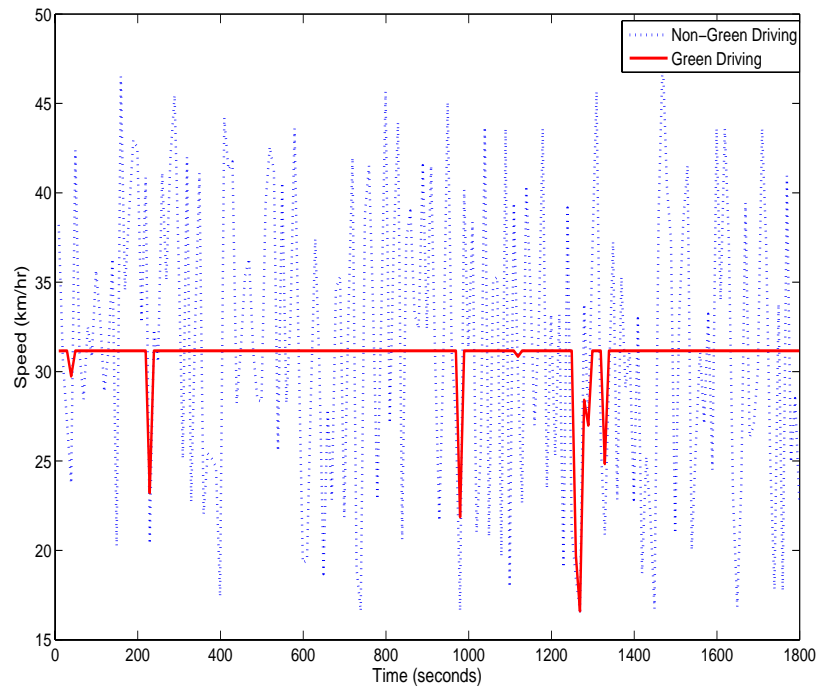
Parameters	Value
Road Length	20 miles
Section Length	2.5 mile
Vehicle Number	1600
Simulation Period	30 minutes
Market Penetration Rate	{0.01,0.02, ...,1}
Free Flow Speed	65 mph
Jam Spacing	29.33 ft
Time Gap	1.55 seconds

227 In this study, we simulate traffic on a one-lane ring road with settings in **Table 1**. In our simu-  
 228 lation, we set boundary of initial speed for all vehicles. All initial speed are randomly distributed  
 229 in the region of  $[1 - \varepsilon, 1 + \varepsilon] * \bar{v}_{desired}$  (where  $\bar{v}_{desired}$  is the average speed calculated from overall  
 230 vehicle density in road). This initial setting is applied to make the traffic scenarios more reason-  
 231 able and reduce extreme accelerations. In the simulation runs,  $\varepsilon = 0.5$ . In addition, we assume that

232 all IVC-equipped vehicles rigorously comply with suggested speed limits through green driving  
233 strategies.

#### 234 4.1 Effect of Different Strategies and Network Scales

235 In section 2, we proposed two different strategies to maintain speed limits. These two strategies  
236 make the speed variation smaller than that in non-Green Driving system. **Figure 2** shows the  
237 speed trajectory of one vehicle during half hour. In this figure, velocity trajectory of Green Driving  
238 system applying desired speed (red) is much smoother than that of normal non-Green Driving  
239 system. Moreover, the actual average speeds of both scenarios are approximately same (Green  
240 Driving: 31.0km/hr, non-Green Driving: 31.1km/hr).



**Figure 2: Speed trajectories of non-Green Driving system (blue) and Green Driving system (red)**

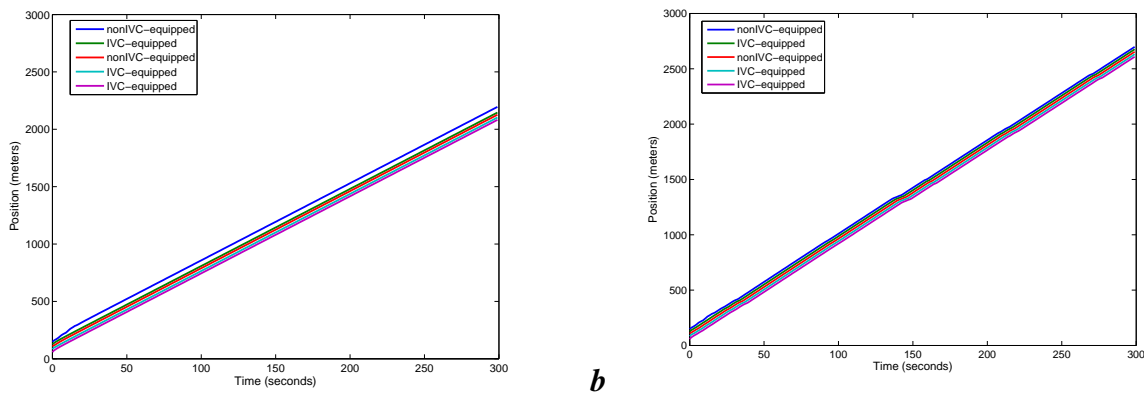
241 Furthermore, **Table 2** lists the emissions and fuel consumption savings from these strategies.  
 242 The table indicates that applying green driving strategies, definitely, emissions and fuel consump-  
 243 tion are reduced. In this example, all vehicles are IVC-equipped. We find that savings for different  
 244 types of emissions: HC: 87.90% - 88.33%, CO: 93.08% - 95.79%, NOx: 88.92% - 91.52%, CO2:  
 245 28.66% - 36.32%, FUEL USE: 68.47% - 71.31%. With random initial traffic, emission and fuel  
 246 consumption savings are large and green driving strategies are all efficient.

**Table 2 Emissions and Fuel Consumption Obtained from Non-delay System with 100% MPR**

MPR (%)	scale	strategies	HC (mg /km)	CO (mg/km)	Nox (mg/km)	CO2 (g/km)	Fuel Use (liter/km)	VDT (km)
0			952.48	29939.97	1078.81	286.36	0.36	24922.10
100	Global	Average speed	113.97	1261.13	91.54	204.26	0.11	19310.30
		ajustment	(-88.03%)	(-95.79%)	(-91.51%)	(-28.67%)	(-68.48%)	(-22.52%)
		Desired speed	114.98	1800.23	109.23	183.80	0.10	24758.50
		adjustment	(-87.93%)	(-93.99%)	(-89.88%)	(-35.82%)	(-70.99%)	(-0.66%)
	Sectional	Average speed	113.90	1260.23	91.60	204.21	0.11	19313.60
		ajustment	(-88.04%)	(-95.79%)	(-91.51%)	(-28.69%)	(-68.48%)	(-22.50%)
		Desired speed	111.12	1684.88	103.44	182.35	0.10	24816.90
		adjustment	(-88.33%)	(-94.37%)	(-90.41%)	(-36.32%)	(-71.31%)	(-0.42%)

247 Moreover, considering total vehicle distance traveled, desired speed adjustment has much bet-  
 248 ter performance than that of average speed adjustment. Under average speed adjustment, total  
 249 distance traveled decreases more than 22%; while for desired speed adjustment, it is less than  
 250 0.7%. This difference comes from the properties of the strategy. As we explained in section 3,  
 251 average speed adjustment can leads large gap ahead of IVC-equipped vehicles. **Figure 3** shows  
 252 several trajectories picked from our simulation. In **Figure 3(a)**, when global average speed adjust-  
 253 ment is applied, in front of IVC-equipped vehicles, large gap exists, but it does not accelerate to  
 254 approach its leader due to its lower speed limit. This gap does not appear on the second graph.  
 255 Since traveling speed takes an important role in transportation study, people will not accept any

256 new strategies if they reduce traveling speed significantly. So, we claim that using desired speed  
 257 adjustment has better effect on transportation system.



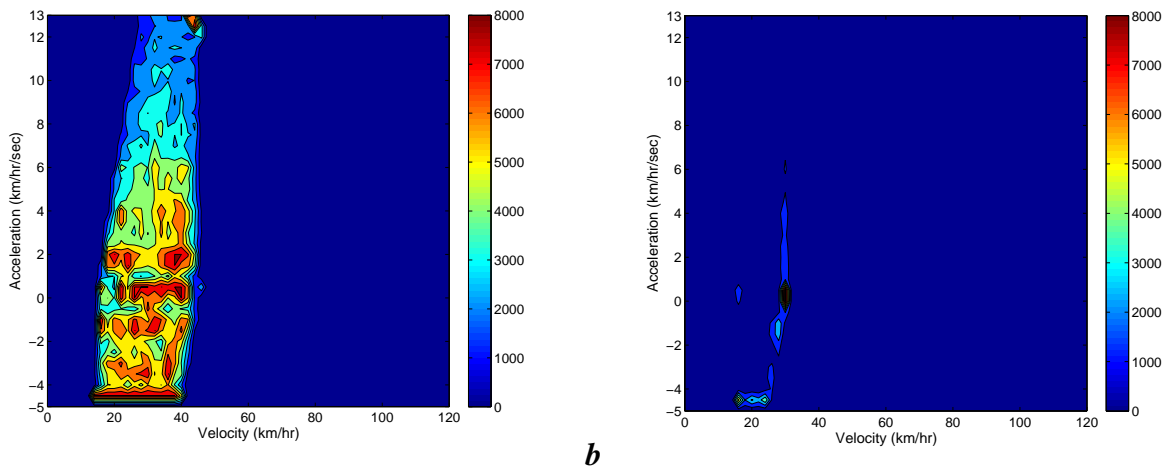
**Figure 3: Vehicle Trajectories (a) Global Average Speed Adjustment, (b) Global Desired Speed Adjustment**

## 258 4.2 Effect of MPR

259 In this subsection, the same initial traffic condition is set, but different market penetration rates  
 260 are proposed. Traffic scenarios based on global desired speed adjustment are simulated. **Figure**  
 261 4 shows speed and acceleration histograms of all vehicles during half hour. **Figure** 4(a) comes  
 262 from non-Green Driving system, while **Figure** 4(b) describes Green Driving system with 50% of  
 263 IVC-equipped vehicles. Comparing these two graphs, speed concentrates on a narrow region after  
 264 using global desired speed adjustment. It seems that the speed control scheme really works for  
 265 traffic stream.

266 Results of emission and fuel consumption savings are shown in **Figure** 5. As expected, emis-  
 267 sion savings can gradually increase when we apply green driving strategy with global desired speed  
 268 adjustment. For HC, its reduction increases from 63.45% at 1% MPR to 89.0% at 100% MPR; for  
 269 CO, it increases from 67.32% to 94.0%; for NOx, it is from 60.60% to 89.9%; for CO2, it is from



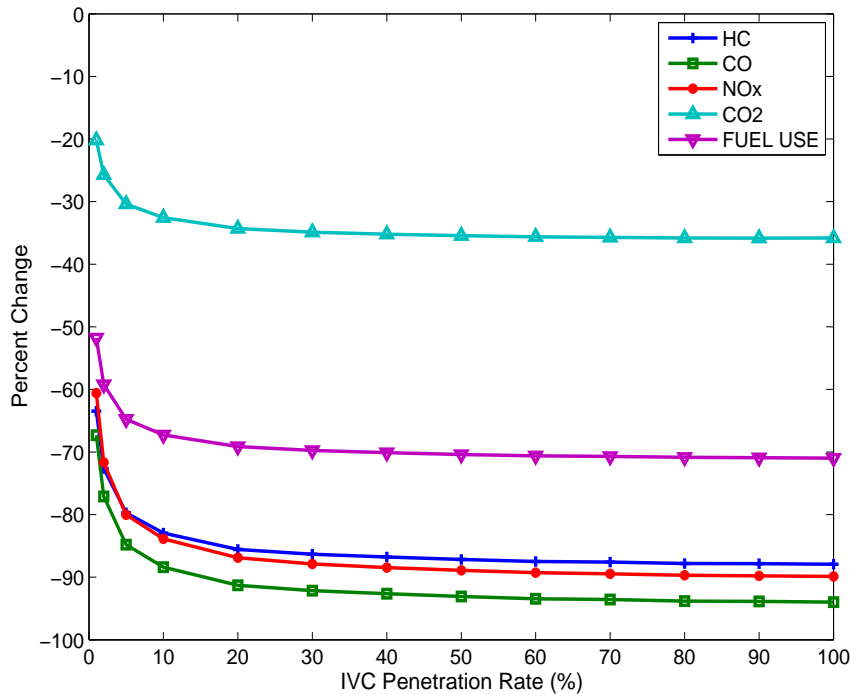


**Figure 4: Speed-Acceleration Histograms (a) non-Green Driving system, (b) Green Driving system with 50% MPR**

270 20.18% to 35.8%; and for fuel consumption, it is from 51.78% to 71.0%. All these reduction are  
 271 huge, but the improvements of reduction with MPR are not significant when MPR is greater than  
 272 20%. The cause of this observation is that we only apply car-following behaviors in our simula-  
 273 tion, which leads to the situation that one IVC-equipped vehicle not only adjusts its own driving  
 274 behavior, but also affects its followers in road. After a while, location trajectories of both equipped  
 275 vehicle and its followers are all smoothed due to green driving strategies and car-following rule.  
 276 An important observation is that, even with an MPR as low as 1%, savings of emission and fuel  
 277 consumption can still be huge. We expect that, in real world, due to lane-changing and other activ-  
 278 ities, savings at MPR's may not be as high as 60%. But reasonable savings are still possible due to  
 279 car-following behaviors.

### 280 4.3 Effect of Communication Delay

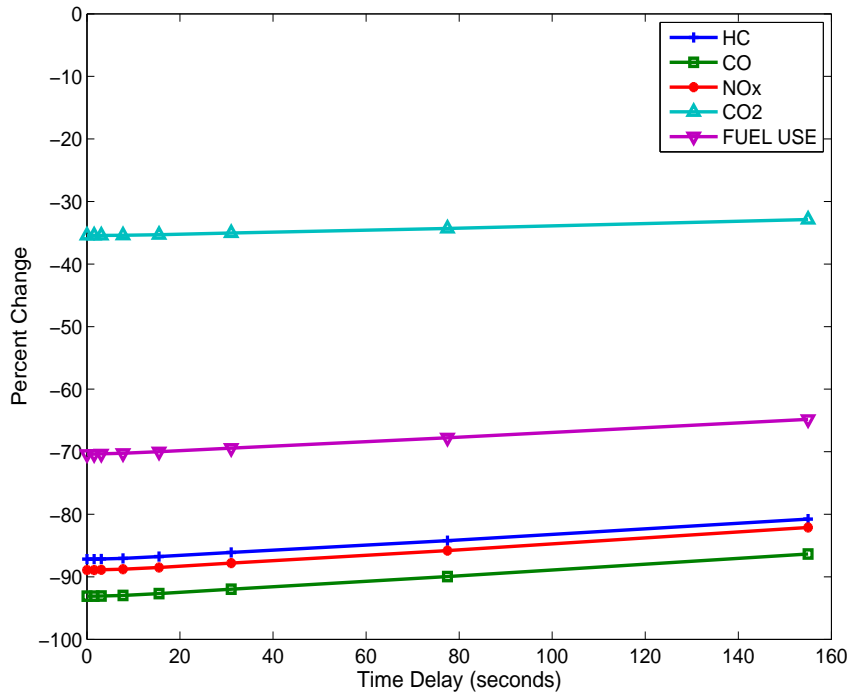
281 In this subsection, MPR of IVC-equipped vehicles is 50% and constant delivery delay are assigned  
 282 for all vehicles. Considering delay, when larger delay in the communication system exists, the



**Figure 5: Emission/Fuel Consumption Reductions at different MPR with Global Desired Speed Adjustment**

283 information vehicles receive is older and less useful for current speed limit adjustment. So, it  
 284 is straightforward to predict that high delay can reduce the effect of green driving strategies. In  
 285 these simulations, various delivery delays are assigned, and their effects on emission and fuel  
 286 consumption reductions are studied. **Figure 6** verifies our prediction. With higher delivery delay,  
 287 all emissions and fuel consumption savings are increasing (approximately 3-5% for 150 seconds  
 288 delay).

289 Besides of effect of constant delay, linear delivery delay is another reasonable assumption. In  
 290 section 3, we assume a simple linear relationship between delay and distance (**Equation 5**). It  
 291 is obvious that higher delay causes less emissions and fuel consumption reductions. We expect  
 292 that with larger coefficient  $\delta$ , savings under sectional desired speed adjustment is smaller, because

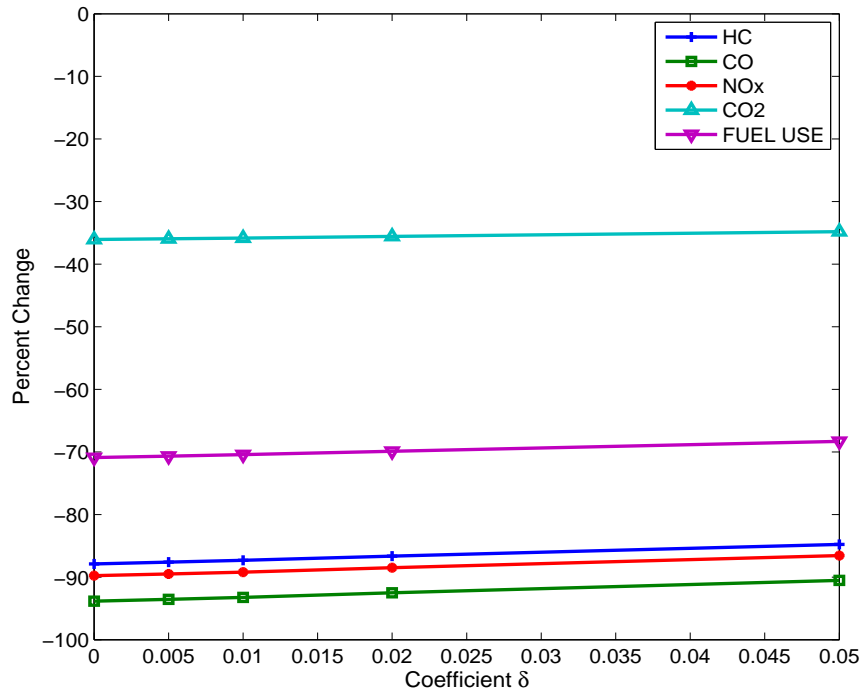


**Figure 6: Emission/Fuel Consumption Reductions at different MPR with Global Desired Speed Adjustment**

293 higher coefficient value leads higher delay for all IVC-equipped vehicles. In simulations, various  
 294  $\delta$  values are set:  $\{0, 0.005, 0.01, 0.02, 0.05\}$  *second/meter*, and savings of all five emissions and  
 295 fuel consumption are calculated. From **Figure 7**, we observe the decreasing trend of reductions  
 296 with coefficient. Combining with constant delay analysis, we claim that larger delay actually  
 297 makes the reduction smaller.

## 298 5 CONCLUSION

299 In this paper, we investigated the effect of green driving strategies based on inter-vehicle communi-  
 300 cation system. Two important factors of IVC systems, market penetration rate and communication



**Figure 7: Emissions/Fuel Consumption Reduction at Different Coefficients with Sectional Desired Speed Adjustment**

301 delay, were studied. We made two major conclusions from this work. Firstly, with higher market  
 302 penetration rate (MPR) of IVC-equipped vehicles, reduction of emissions and fuel consumption  
 303 were larger. This conclusion was reasonable, since higher MPR led to more communication  
 304 and large amount of information, which could help us to find even more accurate and optimal ad-  
 305 justment of speed limits to achieve less emissions and fuel consumption. The second conclusion  
 306 was that with the effect of communication delay, savings of emissions and fuel consumption were  
 307 reduced. Larger delay made more information useless. Then, speed adjustment would not be ac-  
 308 curate enough, and this led to less smoother traffic, which was equivalent to less reduction of  
 309 emissions and fuel consumption.

310 But the more important insight with the impacts of market penetration rates and communication  
311 delays is that, even with a very low market penetration rate (1%) and a large communication delay  
312 (>2min), we can still achieve significant savings for frequent stop-and-go traffic. This feature  
313 is very promising, since it means that such green driving strategies can work even with a small  
314 adoption rate. This is different from traditional approaches, e.g., with alternative fuels, which  
315 require high market penetration rate to achieve significant savings.

316 In the future, we will investigate the potential benefits of such green driving strategies for dif-  
317 ferent traffic conditions. In this study, as shown in **Figure 2**, the frequency of stop-and-go traffic  
318 is very high, but in reality it is usually smaller. We will investigate impacts of the frequencies on  
319 emission savings in future studies. In this paper, homogeneous traffic is modeled. We want to  
320 extend our strategies to non-homogeneous traffic and evaluate savings of emission and fuel con-  
321 sumption. And, also when we apply ISA system, 100% acceptance rate are assigned to equipped  
322 vehicles, which is not obtainable in realistic world. So, in future, we can simulate the traffic and  
323 communication system with reasonable acceptance rate. Furthermore, since only arbitrary com-  
324 munication properties are assigned in this paper, the result may not match to realistic situation. So,  
325 it is important to simulate transportation system with some reasonable communication settings.  
326 Finally, the application of these green driving strategies should be tested in real world situation.

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