Vehicle control for automated highway systems for improved lateral maneuverability

Pushkin Kachroo
University of Nevada, Las Vegas, pushkin@unlv.edu

M. Tomizuka
Virginia Polytechnic Institute and State University

Follow this and additional works at: https://digitalscholarship.unlv.edu/ece_fac_articles

Citation Information

This Conference Proceeding is brought to you for free and open access by the Electrical & Computer Engineering at Digital Scholarship@UNLV. It has been accepted for inclusion in Electrical and Computer Engineering Faculty Publications by an authorized administrator of Digital Scholarship@UNLV. For more information, please contact digitalscholarship@unlv.edu.
Abstract

In this paper, longitudinal and lateral vehicle control for Automated Highway Systems (AHS) are studied together for their coupling effects. It is shown that longitudinal controllers which directly control the wheel slip are inherently more stable, especially during lateral maneuvers on very slippery road conditions, than longitudinal controllers which do not take wheel slip into account.

1. INTRODUCTION

For highway automation of vehicles a complete motion control strategy incorporating both longitudinal and lateral control algorithms must be designed. This paper describes how to integrate longitudinal traction control with lateral control. Active traction control is important not only for longitudinal motion but also for producing a desirable lateral response. Since wheel slip has an important influence over longitudinal as well as lateral tractive forces, longitudinal traction control, which regulates the wheel slip at commanded values, can be used to affect the lateral performance of a vehicle. Specifically, on an icy section of a curved path, traction control can be used to maintain a high lateral tractive force by keeping control over the wheel slip. It is more difficult to control vehicles on icy curved paths using passive (tractionless) controllers, since they do not regulate wheel slip.

A nonlinear bicycle model of the vehicle [1] is briefly introduced in this paper to explain the essential dynamics of the overall system. This model has five degrees of freedom: three degrees for longitudinal motion, and two degrees for lateral motion. The lateral dynamics are characterized by the yaw rate and the lateral velocity, whereas the longitudinal motion dynamics are characterized by the longitudinal velocity and the front and rear wheel angular velocities. The longitudinal controller is designed using sliding mode principles. The lateral nonlinear dynamics are linearized about some nominal operating conditions in order to facilitate the design of a linear control law. The frequency-shaped linear quadratic (FSLQ) control theory is used to design the lateral feedback controller. By using this design theory, the ride quality can be included in the performance index explicitly. Meanwhile, the high-frequency robustness characteristic can be improved by properly choosing the weighting factors of the performance index.

2. MODELING

Two models are described for the vehicle system. A five degrees of freedom nonlinear model is introduced first to represent the essential dynamics of the system. A simplified lateral dynamics model is obtained by linearizing the nonlinear model and retaining the lateral and yaw motion dynamics. The longitudinal feedback law is based on the sliding mode longitudinal traction control of the previous paper. The lateral feedback controller is designed using the simplified model. The performance evaluations are based on simulations performed on the nonlinear model. Both models can describe four-wheel-steering, four-wheel-drive vehicles. However, in this paper they are used for front-wheel-steering, four-wheel-drive vehicles only. We have considered four wheel drive instead of two wheel drive in this paper, because four wheel drive is a more generalized case. The mathematical model for a two wheel case can be easily derived from a four wheel model by ignoring the longitudinal friction terms on the two non-driving wheels. Although, in this paper, the simulations are performed for four wheel drive vehicle, the control design is very similar for the two wheel drive.

A. Nonlinear Vehicle Model

Free body diagram of the vehicle model is shown in Figure 1. The nonlinear bicycle model of the vehicle, described here, is adopted from Taheri [1]. This model has five degrees of freedom: longitudinal and lateral velocities, yaw rate, and rotational velocities for the front and rear wheels. Although this model is described for the acceleration case only, it can be easily modified for the deceleration case. Since, Taheri and Law's description in [1] is concise and suits for the purpose of the present study, Appendix A in [1] is inserted below, with the addition of wind disturbance.

The lateral components of the forces of the roads on the tires are \( F_{xy} \) and \( F_{yr} \), the longitudinal components are \( F_{x} \) and \( F_{r} \), where the \( f \) and \( r \) subscripts refer to front and rear, respectively. The longitudinal wind thrust is \( F_{wx} \), and the lateral wind thrust is \( F_{wy} \). The effects of camber and self aligning moments are neglected. Summing the lateral forces along the body y axis leads to

\[
F_{xy} \cos \delta_{y} + F_{yr} \sin \delta_{y} + F_{x} \cos \delta_{x} + F_{r} \sin \delta_{r} + F_{wy} = M_{r}(\dot{v}_{y} + \alpha_{r})
\]

(1)

where, \( M_{r} \) is the vehicle mass, \( v_{x} \) and \( v_{y} \) are the longitudinal and lateral components (on body axis) of the vehicle velocity, and \( \alpha \) is the yaw rate. The angles \( \delta_{x} \) and \( \delta_{r} \) are the front and rear wheel steering angles. Summing the longitudinal forces along the body x axis gives

\[
F_{xf} \cos \delta_{x} - F_{xr} \sin \delta_{x} + F_{x} \cos \delta_{x} \sin \delta_{r} - F_{r} \sin \delta_{r} = M_{r}(\dot{v}_{x} - \alpha_{x})
\]

(2)

The sum of the yaw moments about the center of gravity of the vehicle yields

\[
L_{c}(F_{xf} \cos \delta_{x} + F_{x} \sin \delta_{x}) - L_{c}(F_{xr} \cos \delta_{r} + F_{r} \sin \delta_{r}) = I \dot{\alpha}
\]

(3)
where, \( I \) is the yaw moment of inertia of the vehicle. For the front and rear wheels, the sum of torques about the axle results in
\[
T_r - F_r R_w = I_w \omega_w
\]
and
\[
T_f - F_f R_w = I_w \omega_w
\]
where, \( \omega_w \) are the angular velocities of the front and rear wheels, \( I_w \) is the inertia of the front wheels about the axle, \( R_w \) is the wheel radius, and \( T_r \) and \( T_f \) are the applied torques for the front and rear, respectively.

The forces predicted by the tire model depend on the instantaneous value of the road's normal force on the tire. The normal forces change due to the longitudinal acceleration. For the model used, the effects of the suspension system are neglected. Thus, the normal forces on the front and rear tires are obtained by summing moments about the two contact patches. The resulting equations for the total normal force on the front tires, \( N_f \), and the total normal force on the rear tires, \( N_r \), are
\[
N_f = \frac{L_f M_x g}{(L_f + L_r)}
\]
and
\[
N_r = \frac{L_r M_x g}{(L_f + L_r)}
\]

The nonlinear tire forces are evaluated using the slip angle and the longitudinal slip for each tire. The tire slip angle \( \beta _i \) is the angle between the vehicle centerline and the velocity vector of the vehicle center of gravity. The tire slip angles are
\[
\alpha _f = \beta _f - \tan^{-1}(V_y + L_f r)/V_x
\]
and
\[
\alpha _r = \beta _r - \tan^{-1}(V_y - L_r r)/V_x
\]
The values of the longitudinal slip are
\[
\lambda _f = (\alpha _f R_w - V_u v_f)/(\alpha _f R_w)
\]
and
\[
\lambda _r = (\alpha _r R_w - V_u v_r)/(\alpha _r R_w)
\]
where \( V_u v_f \) and \( V_u v_r \) are the longitudinal components of the velocities of the front and rear axles, respectively.

When the characteristics of the tire (tire pressure, road and tire surface condition, temperature, etc.) are fixed, the traction and turning forces generated from the tire are solely determined by the tire slip angle and the wheel slip (tire slip ratio). The longitudinal tire adhesion coefficient is defined as the ratio of the longitudinal tire force and the normal force on the same tire. Similarly, the lateral tire adhesion coefficient is defined as the ratio of the lateral tire force and the normal force on the same tire. These adhesion coefficients are nonlinear functions of slip angle and slip ratio. The longitudinal adhesion coefficient versus the slip ratio curve looks like a serpentine curve which gets flatter and flatter for increasing values of slip angle. On the other hand, the lateral adhesion coefficient versus the slip angle curve resembles a Gaussian curve which gets flatter for decreasing slip angles. Since the adhesion coefficients are functions of slip ratio and slip angle, they can be represented by three dimensional curves. Figure 2 shows the longitudinal adhesion coefficient on the z-axis, while slip ratio and slip angle are plotted on the x and y axes, respectively. Figure 3 shows the lateral adhesion coefficient on the z-axis, while slip ratio and slip angle are plotted on the x and y axes, respectively. These plots were drawn by using approximate analytical functions for the adhesion coefficient versus wheel slip curves. A mathematical serpentine function was used for the longitudinal adhesion coefficient and a Gaussian function was used for lateral adhesion.

### B. Linearized Model for Lateral Control

The model for lateral control includes only the lateral and the yaw motions of the mass center of the vehicle. The derivation of the linearized model, described below, is adapted from the model used by Matsumoto and Tomizuka in [2]. For the sake of linearization, it is assumed that the steering angles are small, so that (1) and (3) can be replaced by
\[
\dot{\psi}_y = [F_{yf} + F_{yr} + F_{v_f} + F_{v_r} + F_{\psi_f} + F_{\psi_r}]/M_v - v_f
\]
and
\[
\dot{\psi}_x = [L_f F_{yf} + L_r F_{yr} - L_f F_{v_f} - L_r F_{v_r}]/I_f
\]

The lateral tire forces \( F_{yf} \) and \( F_{yr} \) are functions of the lateral road-tire adhesion coefficients \( \mu_{yf} \) and \( \mu_{yr} \), respectively so that
\[
F_{yf} = \mu_{yf} N_f
\]
and
\[
F_{yr} = \mu_{yr} N_r
\]
Lateral road-tire friction is dependent on the road-tire condition and the slip ratio \( \lambda_f \) and \( \lambda_r \). Furthermore, \( \mu_{yf} \) and \( \mu_{yr} \) are approximately proportional to the wheel slip angles \( \alpha_f \) and \( \alpha_r \), respectively. Thus, \( \mu_{yf} \) and \( \mu_{yr} \) can be described as
\[
\mu_{yf} = f_1(\lambda_f) \alpha_f
\]
and
\[
\mu_{yr} = f_1(\lambda_r) \alpha_r
\]
where, \( f_1 \) and \( f_2 \) are nonlinear functions which depend on the road-tire condition. Hence, the lateral tire forces can be rewritten as
\[
F_{yf} = C_{yf} \alpha_f
\]
and
\[
F_{yr} = C_{yr} \alpha_r
\]
with the cornering stiffnesses originally defined as [3]
\[
C_{yf} = \frac{\partial F_{yf}}{\partial \alpha_f} = 0
\]
given here by
\[
C_{yf} = f_2(\lambda_f) N_f
\]
3. CONTROLLER DESIGN

The controller design for the overall system is decoupled into independent longitudinal and lateral control laws, although their performance is interdependent. The longitudinal control design is based on the nonlinear longitudinal dynamics of the system, and the lateral control design is based on the linearized lateral dynamics of the system. Sliding mode traction control is used for maintaining a pre-specified distance between platoon vehicles, or in general, for maintaining some desired acceleration or deceleration. Lateral control is designed utilizing Frequency Shaped Linear Quadratic (FSLQ) control based on the linearized model of the vehicle lateral motion, which includes lateral deviation and the yaw angle. Since lateral control is designed for nominal conditions, gain scheduling is considered for varying operating conditions. Another way to deal with varying operating conditions would be to use adaptive control. The details of the two controllers used in the simulations are discussed next.

A. Sliding Mode Longitudinal Traction Controller

The longitudinal traction controller is designed as a twin sliding surface mode. In the dynamics (2) for the longitudinal velocity, the input term for the first sliding surface is \( F_d \cos \delta + F_r \cos \delta \), which is evaluated from the desired dynamics for the longitudinal velocity. The two terms in the input for the first sliding surface represent the front wheel and the rear wheel components of the longitudinal tractive force. In four wheel drive vehicles, we have the freedom to choose the distribution of the tractive force between the front and the rear wheels. In the present design, we are using equal distribution of the tractive force, which implies that the two terms in the input for the first sliding surface are kept equal to each other. For a two wheel drive vehicle, one of the terms in the input for the first sliding surface would be zero, and hence, all the longitudinal tractive force would be provided by the two driving wheels. From the desired value of the longitudinal tractive force for the four wheel drive vehicle we are considering, the desired value of the front and rear wheel slips are calculated by inverting the nominal adhesion coefficient versus wheel slip curve for a given side slip angle. These desired values of the wheel slips are used to drive the second sliding mode surface to obtain the needed torque inputs. The details of the sliding mode control design for traction control are shown in [5].

B. FSLQ Lateral Controller

The FSLQ control theory [6, 7] provides a controller design tool for a linear system, based on the minimization of a quadratic performance index, which includes frequency as a parameter. Frequency shaped designs combine the techniques of classical control design and linear quadratic methods to utilize the strengths of each. Hence, combining the two methods in FSLQ provides greater flexibility in the control design.

Peng and Tomizuka have successfully shown the viability of using FSLQ technique to design vehicle lateral controllers for the highway automation, as it relates to PATH [4]. In the lateral control design, there are numerous advantages in using the FSLQ theory. The main advantages, adopted from [4] are listed below:

1. Frequency dependent weighting factors are placed on tracking error, lateral velocity error, yaw rate error, yaw angle error, lateral acceleration and control effort terms in the performance index to compromise these conflicting objectives.

2. The weighting factor on the lateral acceleration term can be shaped in the frequency domain to achieve a good ride quality in the frequency range where passengers are sensitive.

3. The weighting factors on the tracking error terms can be shaped in the frequency domain appropriately to enhance the tracking performance at low frequencies and the robustness of the controller to high frequency measurement noises and unmodeled dynamics.

The lateral feedback controller is designed by minimizing the following performance index:

\[
J = \frac{1}{2\pi} \int [\mathbf{x}(j\omega)Q_0(j\omega)\mathbf{x}(j\omega) + \mathbf{v}(j\omega)Q_v(j\omega)\mathbf{v}(j\omega) + \mathbf{a}(j\omega)Q_a(j\omega)\mathbf{a}(j\omega)]d\omega
\]

where \( \mathbf{x} \) is the state vector, \( \mathbf{v} \) is the disturbance vector, \( \mathbf{a} \) is the control vector, \( Q_0 \) is the diagonal weighting matrix for the state error, \( Q_v \) is the diagonal weighting matrix for the disturbance, and \( Q_a \) is the diagonal weighting matrix for the control input.

In Equation (32), \( \mathbf{a} \), the difference between the lateral acceleration, \( \dot{\mathbf{v}} \), and its desired value, \( \dot{\mathbf{v}}_d \), is expressed as:

\[
\mathbf{a} = \dot{\mathbf{v}} - \frac{\dot{\mathbf{v}}_d}{\rho} = \dot{\mathbf{v}}_d
\]

where \( \rho \) is the radius of curvature of the road, and \( \dot{\mathbf{v}}_d \) is the lateral deviation velocity of the mass center from the reference. The lateral deviation of the vehicle from the center of the lane is obtained by using magnetic markers in the center of the lane. The lateral deviation is differentiated numerically or using hardware to obtain lateral deviation velocity. The first term of the performance index is used to represent the ride quality, the second, third, fourth, fifth and sixth terms are included for tracking capability, and the fifth term represents the control effort. The frequency dependent weighting factors, \( Q_0 \), \( Q_v \), \( Q_v \), \( Q_v \), \( Q_v \), and \( Q_v \) are designed to produce satisfactory ride quality, high frequency robustness, and desirable transient and steady-state responses.

The ride quality is reflected in the lateral acceleration term of the performing index. Many specifications such as ISO [8] and rms [9] have been developed to express the ride quality in terms of a frequency dependent weighting index on the lateral acceleration. All these specifications can adequately describe the ride quality [10]. In order not to increase the number of augmented states excessively, the weighting factor is chosen as:

\[
Q_a = \frac{\alpha}{1 + \lambda \omega^2}
\]

The coefficient \( \lambda \) determines the weighting on each frequency component in the lateral acceleration to represent the desired ride quality. High frequency components in the steering input are not desirable as they can deteriorate the ride quality and may excite the unmodeled dynamics of the system. By reducing the gain in the high frequency range, better robustness in that range can be achieved. Hence, \( Q_x \) and \( Q_x \) are designed as low pass filters.
First, Equation (2) is rewritten as

\[
Q_v = \frac{q_v^2}{1 + \lambda_v s^2} \quad  (35)
\]

\[
Q_r = \frac{q_r^2}{1 + \lambda_v s^2} \quad  (36)
\]

Weights on the lateral deviation and yaw angle error are

\[
Q_{\delta} = \frac{q_{\delta}^2}{(\eta \omega)^2} \quad  (37)
\]

\[
Q_{\psi} = \frac{q_{\psi}^2}{(\eta \omega)^2} \quad  (38)
\]

to minimize their DC component. The steady state lateral deviation approaches zero because of the integral action on lateral deviation introduced by \(Q_{\psi}\).

\[
Q_{\delta} = \frac{q_{\delta}^2}{(\eta \omega)^2} \quad  (39)
\]

The weight on the input term, \(Q_i\) is chosen as a frequency independent coefficient. The coefficients, \(\lambda_v\) and \(\lambda_r\) are tuned to enhance the high frequency robustness of the controller while maintaining good tracking capability.

After choosing the values of \(\lambda_v, \lambda_r,\) and \(\lambda_{\psi}\), the values of \(q_v, q_r, q_{\psi}, q_m,\) and \(Q_i\) are adjusted for further tuning. The FSLQ problem can be transformed to a standard LQ problem by introducing augmented state variables, and the gain vector of the feedback controller can be computed by solving a Riccati equation.

If the radius of curvature and preview information of the path is available, feedforward and preview controllers can also be used to improve the lateral control performance[4, 11, 12].

The gain of the feedback controller depends on the longitudinal velocity and the cornering stiffness. The velocity is available as a sensor measurement, and the cornering stiffness can be estimated from the lateral dynamic equation [4].

4. NUMERICAL SIMULATIONS

The simulations are performed on the nonlinear model described in Section 1.1. The inertial parameters are shown in Table 1. Sliding mode controller based on twin sliding surfaces, is employed for longitudinal traction control and FSLQ controller is used for the lateral direction. A simple PID control law is employed for passive control in the longitudinal direction, which is compared with the active traction control provided by the twin surface sliding surfaces, is employed for longitudinal traction control (sliding mode) and lateral control (FSLQ).

\[
F = \begin{cases} 
1 & \text{if } \delta > \delta_c \\
0 & \text{otherwise}
\end{cases}
\]

For the case of front wheel drive, the driving torque would be divided equally between the two driving wheels. For the case of rear wheel drive only the two driving wheels would provide the longitudinal tractive force.

Table 2 shows the values of the lateral controller design parameter values for the simulations. The gains of the FSLQ controller are precomputed as functions of longitudinal velocity and cornering stiffness. The measurement rates are assumed to be 100 Hz. The simulation path is shown in Figure 4. The path is divided into five regions (A, B, C, D and E). Simulations are performed with and without the asphalt and concrete patch and the icy patch. Region A and region E are straight sections, while regions B, C and D are curved sections of the simulation path. The radius of curvature for all the curved sections is 1.5 Km. In regions A and C, the vehicle is commanded to have a longitudinal acceleration of 1 m/s^2 from 20 m/s to 25 m/s and 25 m/s to 35 m/s respectively. Region A is 112.5m long, region B is 750m long, region C is 300m long, region D is 175 m long and region E is more than 6 Km long.

First, simulation on the path without the asphalt and concrete and the icy section was performed with active traction control (sliding mode) and lateral control (FSLQ). The longitudinal velocity is followed very closely. The front wheel slip remains below 0.05. The steering commands, lateral deviation and the yaw rate errors are small.

Simulation results of active traction and lateral control on the path with the asphalt and concrete and the icy patch are shown in Figures 5-6. The asphalt and concrete patch starts at 30.5 seconds from the start and lasts for 10 seconds immediately after which, the icy patch starts, which lasts for 9 seconds. In this case also, the longitudinal velocity is followed very closely. Although the slip value is stabilized in the same region as before, the slip value increases up to approximately 0.15. The steering commands, lateral deviation and the yaw rate errors are greater than what they were in the previous case, but still the values are small.

Simulation is performed for passive traction (a fine tuned PID control law) and lateral control on the path with
and without the asphalt and concrete patch and the icy path. The results with the patches are shown in Figures 7-8. Without the patches, the performance of the passive traction control is satisfactory, but when the two patches are introduced on the test surface, the vehicle becomes unstable. The slip value increases in the icy patch region and stays in the undesirable negative μ-λ slope region. The steering angle input oscillates with a large amplitude and so does the lateral deviation. The yaw rate errors are also large. These simulations emphasize the importance of longitudinal traction control to the lateral stability of a vehicle.

Table 1 System parameters of the simplified model

<table>
<thead>
<tr>
<th>Parameters</th>
<th>Values</th>
</tr>
</thead>
<tbody>
<tr>
<td>Mass ( (M_s) )</td>
<td>12495 N</td>
</tr>
<tr>
<td>Distance to front axle from car cg, ( L_f )</td>
<td>1.0 m</td>
</tr>
<tr>
<td>Distance to rear axle from car cg, ( L_r )</td>
<td>1.45 m</td>
</tr>
<tr>
<td>Yaw inertia, ( I )</td>
<td>1627 Kg m²</td>
</tr>
<tr>
<td>Wheel inertia, ( (I_w, I_{wz}) )</td>
<td>4.07 Kg m²</td>
</tr>
<tr>
<td>Wheel radius, ( (R_e) )</td>
<td>0.33 m</td>
</tr>
<tr>
<td>Front cornering stiffness, ( C_f )</td>
<td>30600 N/rad</td>
</tr>
<tr>
<td>Rear cornering stiffness, ( C_r )</td>
<td>44374 N/rad</td>
</tr>
<tr>
<td>Longitudinal velocity, ( v_x )</td>
<td>25 m/sec</td>
</tr>
</tbody>
</table>

Table 2 Lateral controller design parameter values

<table>
<thead>
<tr>
<th>Parameters</th>
<th>Values</th>
</tr>
</thead>
<tbody>
<tr>
<td>( \lambda_x )</td>
<td>1/180</td>
</tr>
<tr>
<td>( \lambda_y )</td>
<td>1/1000</td>
</tr>
<tr>
<td>( q_x )</td>
<td>1</td>
</tr>
<tr>
<td>( q_y )</td>
<td>1.75</td>
</tr>
<tr>
<td>( q_z )</td>
<td>1.75</td>
</tr>
<tr>
<td>( q_{ly} )</td>
<td>2</td>
</tr>
<tr>
<td>( q_{rz} )</td>
<td>2</td>
</tr>
<tr>
<td>( Q_5 )</td>
<td>0.1</td>
</tr>
</tbody>
</table>

5. CONCLUSIONS

A nonlinear model of the vehicle system for combined longitudinal and lateral control was discussed. The control design for the overall system was decoupled into independent longitudinal and lateral control laws. Sliding mode design was used for longitudinal traction control and a PID control law was used for longitudinal passive control. The lateral controller was based on FSLQ theory.

In this paper, we have shown the superiority of active control during lateral maneuvers for a platoon of vehicles, in order to relate the results to highway automation. The simulation results of active and passive longitudinal control with lateral control on a combination of straight and curved sections with and without an icy patch, showed a superior performance of the vehicle under active traction control.

ACKNOWLEDGMENT

This work was performed as part of the PATH Program of the University of California, and "Smart Highway" project of Virginia Dept. of Transportation, in cooperation with the State of California, Business and Transportation Agency, Department of Transportation, and the United States Department of Transportation, Federal Highway Administration.

REFERENCES

Figure 1 Schematic diagram of the vehicle model for longitudinal and lateral control

Figure 2 Longitudinal adhesion coefficient versus slip ratio and slip angle

Figure 3 Lateral adhesion coefficient versus slip ratio and slip angle

Figure 4 Geometry of the desired trajectory

Figure 5 Longitudinal velocity and wheel slip plots for active traction with lateral control

Figure 6 Lateral deviation and yaw rate error plots for active traction with lateral control

Figure 7 Longitudinal velocity and wheel slip plots for passive traction with lateral control

Figure 8 Lateral deviation and yaw rate error plots for passive traction with lateral control