# Driver assistance system design A

#### Autonomous maneuvers

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## Outline

Introduction

2 Autonomous maneuvers

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#### SAE **J3016**™ LEVELS OF DRIVING AUTOMATION™

Learn more here: sae.org/standards/content/i3016 202104

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What does the human in the driver's seat have to do? You are driving whenever these driver support features are engaged - even if your feet are off the pedals and you are not steering

You are not driving when these automated driving

You must constantly supervise these support features: you must steer, brake or accelerate as needed to

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These are driver support features				These are automated driving features			
What do these features do?	These features are limited to providing warnings and momentary assistance	These features provide steering OR brake/ acceleration support to the driver	These features provide steering AND brake/ acceleration support to the driver	These features can drive the vehicle under limited conditions and will not operate unless all required conditions are met		This feature can drive the vehicle under all conditions	
Example Features	automatic emergency braking     blind spot warning     lane departure	lane centering     OR     adaptive cruise control	lane centering     AND     adaptive cruise control at the same time	•traffic jam chauffeur	local driverless taxi     pedals/ steering wheel may or may not be installed	• same as level 4, but feature can drive everywhere in all conditions	

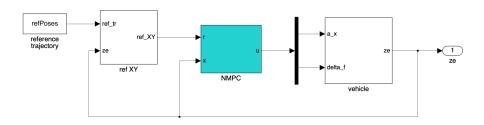
- SAE level 2 and higher levels: The automated system takes control
  of the vehicle: accelerating, braking, and steering.
  - Vehicle control is based on lateral and longitudinal control (lane keeping and cruise control).
  - ► The joint use of these two technologies allows the vehicle to accomplish autonomous maneuvers.
- NMPC can jointly perform lateral and longitudinal control.
- Lateral/longitudinal control algorithms are supported by higher level blocks:
  - Decision Making Module (DMM): in charge of deciding the maneuver the ego vehicle has to accomplish.
  - ▶ Path planning/trajectory planning algorithm: in charge of planning a suitable trajectory to track.

#### Trajectory planning and control

- Global trajectory planning (path planning): Find an optimal path between two points on a map, avoiding obstacles.
- Local trajectory planning: Similar to the global one but:
  - ▶ The trajectory is planned over a shorter time interval.
  - ▶ The planned trajectory must be consistent with the vehicle dynamics.
  - ► The trajectory is planned in real-time.
- Trajectory planning and control: Trajectory planning + providing the control command that makes the vehicle track the planned trajectory.
- NMPC can jointly perform local trajectory planning and control.

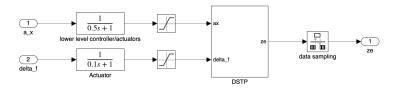
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#### Closed-loop scheme



- vehicle: DSTP model with input  $(a_x, \delta_f)$ .
- NMPC: on-line solution of an optimization problem receding horizon strategy.
- reference trajectory: set of points giving the whole reference trajectory (from a global planner).
- $\bullet$  ref XY: on-line computation of the reference trajectory segment corresponding to the prediction time interval  $[t,t+T_p]$  .

#### Vehicle model



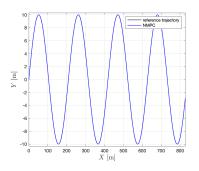
- DSTP: dynamic single-track vehicle model with Pacejka's tire formula and input  $u=(a_x,\delta_f)$ .
  - ▶ Vehicle parameters:  $l_f = 1.2 \,\mathrm{m}, \; l_r = 1.6 \,\mathrm{m}, \; m = 1575 \,\mathrm{kg}, \\ J = 4000 \,\mathrm{kg} \,\mathrm{m}^2, \; c_f = 27e3 \,\mathrm{N/rad}, \; c_r = 20e3 \,\mathrm{N/rad}.$
  - ▶ Tire parameters:  $p_1 = \xi \, 3863 \, \text{N}, \, \xi \in [0,1], \, p_2 = 1.5, \, p_4 = -0.5, \, p_3 = c_f/p_1/p_2$  (front tire) or  $p_3 = c_r/p_1/p_2$  (rear tire).
- Other blocks:
  - actuators
  - ▶ saturations  $(a_x \in [-10, 3] \cdot 10^4 \,\mathrm{m/s^2}, \,\delta_f \in [-0.4, 0.4] \,\mathrm{rad})$
  - ightharpoonup data sampling block (sampling time  $0.05\,\mathrm{s}$ ).

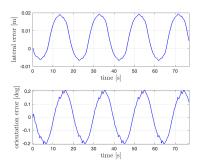
#### NMPC control design

- NMPC design:
  - ▶ prediction model: DSTA model = DST model with  $\beta_f = \operatorname{atan}\left(\frac{v_y + l_f \omega_\psi}{v_x}\right) \delta_f$  and  $\beta_r = \operatorname{atan}\left(\frac{v_y l_r \omega_\psi}{v_x}\right)$  (no Pacejka's formula; parameters difficult to measure/estimate in real scenarios);
  - plant input:  $u = (a_x, \delta_f)$ ;
  - output: y = (X, Y) (other options:  $(X, Y, \psi)$ ,  $(e_{ct}, e_h)$ ,  $(e_y, e_{\psi})$ );
  - $T_s = 0.05 \,\mathrm{s}, \, T_p = 3 \,\mathrm{s};$
  - weight matrices:  $R = \operatorname{diag}(0.1, 0.5)$ ,  $Q = \operatorname{diag}(5, 5)$ ,  $P = \mathbf{0}$ ;
    - ★ R penalizes high accelerations and steering angles;
  - ▶ input constraints:  $u_1 \in [-10, 3] \text{ m/s}^2$ ,  $u_2 \in [-0.4, 0.4] \text{ rad}$ ;
  - no state and output constraints.
- This controller is used in all the maneuvers considered in the following, with possible inclusion of state/output constraints.

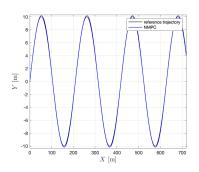
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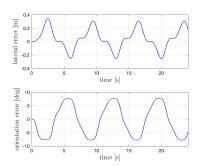
Simulation results. Sinusoidal road,  $v_x = 40 \, \mathrm{km/h}$ , dry.



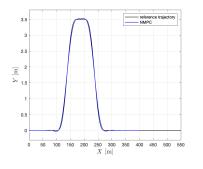


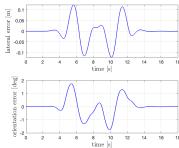
Simulation results. Sinusoidal road,  $v_x = 100 \, \mathrm{km/h}$ , dry.



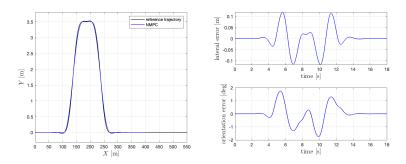


Simulation results. Double lane change,  $v_x = 80 \, \mathrm{km/h}$ , dry.



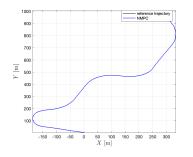


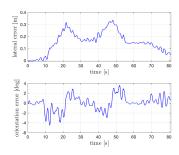
Simulation results. Double lane change,  $v_x = 80 \, \mathrm{km/h}$ , wet.



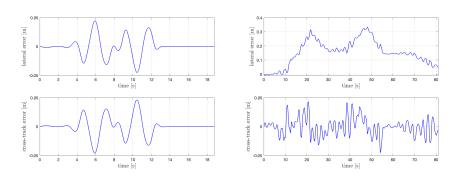
• In general, NMPC does not need VSC.

Simulation results. Real road,  $v_x = 60 \, \mathrm{km/h}$ , dry.





Lateral and cross-track errors.



- The lateral and cross-track errors are both useful for control design, implementation and test.
- Cross-track error perhaps more reliable.

Simulation results. Obstacle avoidance,  $v_x = 70 \, \mathrm{km/h}$ , dry road.

Same design as above, but with the following trajectory constraint:

$$||(X,Y) - (X_{con}, Y_{con})|| \ge 2$$

where  $(X_{con}, Y_{con})$  is the position of an obstacle.

- The simulation shows that NMPC
  - allows obstacle avoidance;
  - can accomplish local trajectory planning (combined with control).

