Traffic flow control via PDEs: Delay-compensating and coordinated designs

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Acknowledgements

PADECOT

PArtial Differential Equation model-based COntrol of Traffic flow





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Real-time traffic control reduces costs/improves quality of daily transport via

- i. Traffic congestion mitigation and travel times minimization
- ii. Fuel consumption and emissions decrease
- iii. Safety and comfort improvement



Traffic evolves/may be described in **continuous** time and space. Develop control/estimation designs for **PDEs & PDEs-ODEs** from traffic:

- Explicit (e.g., appealing to implementation)
- Boundary actuation/sensing (e.g., minimum actuator/sensor requirements)
- Efficient use of available actuators/sensors (e.g., fault-tolerant)
- With stability guarantees (e.g., quantify performance)



Outline

- Motivation
- ACC design
- Predictor feedback
- Traffic flow control at distant bottlenecks
 - Quasilinear transport PDE-ODE interconnection
- Coordinated traffic flow control
 - Viscous Hamilton-Jacobi PDEs
- Current & future steps

ACC design

(w/ Claudio Roncoli & Markos Papageorgiou)



- Delays in traffic with ACC/CACC vehicles
 - Actuator delay (engine response, throttle actuator, brake actuator, computational delay, ...)
 - Sensor delay (radar or lidar filter, wireless communication, sampling, wheel speed sensor, ...)



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- Negative effects
 - Decrease in capacity
 - String instability (comfort, safety, fuel consumption, tracking performance ...)
 - Individual vehicle instability (comfort, safety, fuel consumption, tracking performance ...)



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 - Decrease in capacity
 - String instability (comfort, safety, fuel consumption, tracking performance ...)
 - Individual vehicle instability (comfort, safety, fuel consumption, tracking performance ...)
- Goal: Compensate the delay to
 - Improve throughput
 - Improve string stability
 - Improve vehicle's stability

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Measurements & Parameters

• relative spacing s_i vehicle's speed v_i vehicle's control variable U_i (e.g., desired acceleration).



Measurements & Parameters

- relative spacing s_i vehicle's speed v_i vehicle's control variable U_i (e.g., desired acceleration).
- Combined delay D.



Vehicle Model



Figure: Homogenous platoon of vehicles in a single lane.

Vehicle's *i* dynamics

$$\dot{s}_i(t) = v_{i-1}(t) - v_i(t)$$

 $\dot{v}_i(t) = U_i(t - D),$

where

$$s_i = x_{i-1} - x_i - l,$$

 x_i position *l* length



Simulation (Set-up)

 $\begin{array}{l} D = 0.4, \ h = \frac{2}{\pi} \\ U_i(t) = \frac{\alpha}{h} s_i(t) - \alpha v_i(t) + b \left(v_{i-1}(t) - v_i(t) \right), \ a = 1, \ b = 0.8. \end{array}$



Figure: Acceleration maneuver of the leader with $\ddot{y}_{\rm L}(t) = a_{\rm L}(t)$.

PArtial Differential Equation model-based COntrol

Simulation (Uncompensated)



Figure: Spacing of four vehicles following a leader under the uncompensated ACC strategy.

Simulation (Uncompensated)



Figure: Speed (left) and acceleration (right) of four vehicles following a leader under the uncompensated ACC strategy.

Simulation (Predictor-Based)



Figure: Spacing of four vehicles following a leader under the predictor-based ACC strategy.

Simulation (Predictor-Based)



Figure: Speed (left) and acceleration (right) of four vehicles following a leader under the predictor-based ACC strategy.

Simulation (Comparison)

Table: Performance indices.

Performance index	Percentage improvement
$J_{ m fuel}$	28
$J_{ m comfort,1}$	90
$J_{ m comfort,2}$	20
$J_{ m comfort,3}$	66
$J_{ m safety}$	53
$J_{ m tracking,1}$	83
$J_{ m tracking,2}$	51



Predictor Feedback



LTI Systems with Constant Delay

$$\dot{X}(t) = AX(t) + BU\left(t - D\right)$$

A - possibly unstable; D - arbitrarily large Assume: (A, B) controllable and matrix K found such that A + BK is Hurwitz.



LTI Systems with Constant Delay

$$\dot{X}(t) = AX(t) + BU(t - D)$$

Predictor feedback

$$U(t) = K \underbrace{\left[e^{AD} X(t) + \int_{t-D}^{t} e^{A(t-\theta)} BU(\theta) d\theta \right]}_{X(t+D) = P(t)}$$



Predictor-Based ACC Design

$$U_{i}(t) = K\left(e^{\Gamma D}X_{i}(t) + \int_{t-D}^{t} e^{\Gamma(t-\theta)}BU_{i}(\theta)d\theta\right),$$

with

$$\Gamma = \begin{bmatrix} 0 & 0 & -1 \\ \frac{1}{h} & 0 & -1 \\ 0 & 0 & 0 \end{bmatrix}$$
$$K = \begin{bmatrix} k_1 & k_2 & k_3 \end{bmatrix}$$
$$X_i = \begin{bmatrix} s_i \\ \sigma_i \\ v_i \end{bmatrix}$$
$$B = \begin{bmatrix} 0 \\ 0 \\ 1 \end{bmatrix},$$

where

$$\dot{\sigma}_i(t) = \frac{1}{h} s_i(t) - v_i(t), \quad i = 1, \dots, N$$

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Theorem & Implications

 $\exists~K~s.t.~each~individual vehicle is stable <math display="inline">\forall~D>0$, and the platoon is $p\in[1,\infty]$ string stable $\forall~D< h$.



Theorem & Implications

 $\exists K \text{ s.t. each individual vehicle is stable } \forall D > 0$, and the platoon is $p \in [1,\infty]$ string stable $\forall D < h$.

Implications:

- stability
- zero steady-state spacing error
- string stability
- non-negative impulse response



Nonlinear Predictor Feedback



Nonlinear Systems with Constant Delay

$$\dot{X}(t) = f\left(X(t), U(t-D)\right)$$

Assumptions:

$$\dot{X} = f(X, \kappa(X)), \text{ g.a.s.}$$

 $\dot{X} = f(X, U), \text{ forward complete}$



Nonlinear Systems with Constant Delay

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Assumptions

$$\dot{X} = f(X, \kappa(X)), \text{ g.a.s.}$$

 $\dot{X} = f(X, U), \text{ forward complete}$

Predictor-feedback controller (predictor given implicitly in general):

$$U(t) = \kappa (P(t))$$

$$P(\theta) = X(t) + \int_{t-D}^{\theta} f(P(\tau), U(\tau)) d\tau, \quad t - D \le \theta \le t$$







Figure: A highway stretch with one actuated on-ramp and a distant bottleneck.

Challenge: Long distance (delay) until vehicles (control input) reach the bottleneck area (plant) **Goal:** Compensate delay and regulate the bottleneck flow





Figure: Fundamental diagrams of mainstream (black) and bottleneck areas (blue).





Figure: Fundamental diagrams of mainstream (black) and bottleneck areas (blue).

Model

$$\begin{split} \dot{X}(t) &= \frac{1}{\Delta} \left(u(0,t) \left(1 - u(0,t) \right) - \frac{1}{2} X(t) \left(1 - X(t) \right) \right) \\ u_t(x,t) &= \left(1 - 2u(x,t) \right) u_x(x,t) \\ q\left(u(1,t) \right) &= d(t) + r(t). \end{split}$$



Simulation of the Traffic Flow Control Model

Goal: Regulate bottleneck density to an uncongested equilibrium, say X^* .



Figure: Uncompensated (dashed) and predictor-feedback law (solid) with P nominal law.



(w/ Miroslav Krstic)





$$\begin{aligned} \dot{X}(t) &= f(X(t), u(0, t)) \\ u_t(x, t) &= v(u(x, t))u_x(x, t) \\ u(1, t) &= U(t). \end{aligned}$$



$$\dot{X}(t) = f(X(t), u(0, t)) u_t(x, t) = v(u(x, t))u_x(x, t) u(1, t) = U(t).$$

Assumptions:

$$\begin{split} \dot{X} &= f\left(X, \kappa\left(X\right) + \omega\right), \quad \mathsf{ISS} \\ \dot{X} &= f\left(X, U\right), \quad \mathsf{forward \ complete} \\ v &\in \quad C^2\left(\mathbb{R}; \mathbb{R}_+\right) \end{split}$$





$$\dot{X}(t) = f(X(t), u(0, t))
u_t(x, t) = v(u(x, t))u_x(x, t)
u(1, t) = U(t).$$

Challenge:

p(1,t) = value of the state at the time when control applied at t reaches the plant

$$= X\left(t + \underbrace{\frac{1}{v(u(1,t))}}_{\text{prediction}}\right)$$



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PDE predictor

$$\begin{split} p\left(x,t\right) &= X(t) + \int_{0}^{x} f\left(p(y,t), u(y,t)\right) \Gamma\left(u(y,t), u_{y}(y,t), y\right) dy, \\ x \in [0,1] \\ \Gamma\left(u(x,t), u_{x}(x,t), x\right) &= \frac{1}{v\left(u(x,t)\right)} - \frac{xv'\left(u(x,t)\right)u_{x}(x,t)}{v\left(u(x,t)\right)^{2}} \end{split}_{\text{for all parameter intermediated Character strategy of the set of th$$

PDE Predictor Feedback

$$U(t) = \kappa (p(1,t)) = \kappa \left(X \left(t + \frac{1}{v(u(1,t))} \right) \right)$$

$$p(x,t) = X(t) + \int_0^x f(p(y,t), u(y,t)) \Gamma(u(y,t), u_y(y,t), y) \, dy,$$

$$x \in [0,1]$$

$$(u(x,t), u_x(x,t), x) = \frac{1}{v(u(x,t))} - \frac{xv'(u(x,t)) u_x(x,t)}{v(u(x,t))^2}$$

Constant transport speed

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$$\begin{array}{lll} U(t) & = & \kappa\left(p\left(1,t\right)\right) = \kappa\left(X\left(t+\frac{1}{v}\right)\right) \\ p\left(x,t\right) & = & X(t) + \frac{1}{v}\int_{0}^{x}f\left(p(y,t),u(y,t)\right)dy, \quad x \in [0,1] \end{array}$$



Theorem

 $\exists \delta > 0 \text{ and } \beta \in \mathcal{KL} \text{ s.t. } \forall X_0 \in \mathbb{R}^n \text{ and } u_0 \in C^1[0,1] \text{ satisfying compatibility and}$

 $|X(0)| + \|u(0)\|_{C^1} < \delta,$

then

 $|X(t)| + \|u(t)\|_{C^1} \quad \leq \quad \beta \left(|X(0)| + \|u(0)\|_{C^1}, t\right), \quad t \geq 0$



Coordinated Traffic Flow Control



Coordinate available boundary actuators/sensors (e.g., via RM/VSL/VACS)



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First-order and accounts of drivers' look-ahead ability



Coordinate available boundary actuators/sensors (e.g., via RM/VSL/VACS) **First-order** and **accounts** of drivers' look-ahead ability.

Consider

$$\begin{aligned} \rho_t(x,t) + (\rho(x,t)V(\rho(x,t)) - \epsilon \rho_x(x,t))_x &= 0 \\ \rho(0,t) &= -U_0(t) \\ \rho(1,t) &= -U_1(t), \end{aligned}$$

with Greenshield's FD

$$V\left(\rho\right) = a\left(b - \rho\right)$$



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with Greenshield's FD

$$V\left(\rho\right) = a\left(b - \rho\right)$$

Use alternative representation of "label" variable cumulative number of vehicles

$$u(x,t) = \int_{x}^{1} \rho(y,t) dy + \int_{0}^{t} Q(\rho(1,s), \rho_{x}(1,s)) ds, \quad Q(\rho,\rho_{x}) = \rho V(\rho) - \epsilon \rho_{x}.$$



Viscous Hamilton-Jacobi PDEs

(w/ Rafael Vazquez)



Nonlinear Viscous Hamilton-Jacobi PDE

$$\begin{array}{lll} u_t(x,t) &=& \epsilon u_{xx}(x,t) - a u_x(x,t) \left(b + u_x(x,t) \right) \\ u_x(0,t) &=& U_0(t) \\ u_x(1,t) &=& U_1(t), \end{array}$$

 $\epsilon > 0$, $a, b \in \mathbb{R}$ (and $a \neq 0$), U_0 , U_1 control inputs



Nonlinear Viscous Hamilton-Jacobi PDE

$$u_t(x,t) = \epsilon u_{xx}(x,t) - a u_x(x,t) (b + u_x(x,t)) u_x(0,t) = U_0(t) u_x(1,t) = U_1(t),$$

$\epsilon > 0$, $a, b \in \mathbb{R}$ (and $a \neq 0$), U_0 , U_1 control inputs

Solve the problems of **bilateral**

• Trajectory generation

Find U_0^{r} , U_1^{r} generating $u^{\mathrm{r}}(x,t)$ s.t. $u^{\mathrm{r}}(x_0,t) = y_1^{\mathrm{r}}(t)$, $u_x^{\mathrm{r}}(x_0,t) = y_2^{\mathrm{r}}(t)$

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Observer-based output-feedback trajectory tracking

Find U_0 , U_1 to achieve tracking of $u^{\rm r}(x,t)$, measuring u(0,t), u(1,t)

Simulation

Set a = b = 1 (FD with $q_{cap} = \frac{1}{4}$, $\rho_{cr} = \frac{1}{2}$)

Regulate outlet density at $\rho_{\rm cr}$ and outlet flow $u_t(1,t)$ at $q_{\rm cap}$



Figure: Left: Highway density. Right: Cumulative number of vehicles at the outlet.



Simulation



Figure: Bilateral (solid) and unilateral (dashed) controllers.

Trajectory Generation/Theorem

Let y_1^r , $y_2^r \in G_{F,M,\gamma}$, with $1 \leq \gamma < 2$. $\exists \ \mu_1 > 0$ s.t. if $F \leq \mu_1$

$$\begin{split} u^{\mathrm{r}}(x,t) &= -\frac{\epsilon}{a} \ln\left(e^{\frac{ab}{2\epsilon}x} v^{\mathrm{r}}(x,t) + 1\right) \\ U^{\mathrm{r}}_{0}(t) &= -\frac{\epsilon}{a} \frac{v^{\mathrm{r}}_{x}(0,t) + \frac{ab}{2\epsilon} v^{\mathrm{r}}(0,t)}{1 + v^{\mathrm{r}}(0,t)}, \quad U^{\mathrm{r}}_{1}(t) = -\frac{\epsilon e^{\frac{ab}{2\epsilon}}}{a} \frac{v^{\mathrm{r}}_{x}(1,t) + \frac{ab}{2\epsilon} v^{\mathrm{r}}(1,t)}{1 + e^{\frac{ab}{2\epsilon}} v^{\mathrm{r}}(1,t)}, \end{split}$$

where

$$\begin{split} v^{\mathrm{r}}(x,t) &= \sum_{k=0}^{\infty} \frac{1}{\epsilon^{k}} \frac{(x-x_{0})^{2k}}{(2k)!} \sum_{m=0}^{k} \binom{k}{m} \left(\frac{a^{2}b^{2}}{4\epsilon}\right)^{k-m} y^{\mathrm{r}}_{1,v}{}^{(m)}(t) \\ &+ \sum_{k=0}^{\infty} \frac{1}{\epsilon^{k}} \frac{(x-x_{0})^{2k+1}}{(2k+1)!} \sum_{m=0}^{k} \binom{k}{m} \left(\frac{a^{2}b^{2}}{4\epsilon}\right)^{k-m} y^{\mathrm{r}}_{2,v}{}^{(m)}(t) \\ y^{\mathrm{r}}_{1,v}(t) &= e^{-\frac{ab}{2\epsilon}x_{0}} \left(e^{-\frac{a}{\epsilon}y^{\mathrm{r}}_{1}(t)} - 1\right) \\ y^{\mathrm{r}}_{2,v}(t) &= e^{-\frac{ab}{2\epsilon}x_{0}} \left(-\frac{a}{\epsilon}e^{-\frac{a}{\epsilon}y^{\mathrm{r}}_{1}(t)}y^{\mathrm{r}}_{2}(t) - \frac{ab}{2\epsilon} \left(e^{-\frac{a}{\epsilon}y^{\mathrm{r}}_{1}(t)} - 1\right)\right), \end{split}$$

satisfy the HJ PDE and $u^{\mathrm{r}}\left(x_{0},t
ight)=y_{1}^{\mathrm{r}}(t)$, $u_{x}^{\mathrm{r}}\left(x_{0},t
ight)=y_{2}^{\mathrm{r}}(t)$.

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Observer Design

Copy of linearized error plant + nonlinear output injection

$$\begin{split} \hat{v}_t(x,t) &= \epsilon \hat{v}_{xx}(x,t) - \frac{a^2 b^2}{4\epsilon} \hat{v}(x,t) + \frac{p_2(x)}{4\epsilon} \\ &\times \left(\left(e^{-\frac{a}{\epsilon} \tilde{u}(0,t)} - 1 \right) e^{-\frac{a}{\epsilon} u^r(0,t)} - \hat{v}(0,t) \right) \\ &+ p_1(x) \left(\left(e^{-\frac{a}{\epsilon} \tilde{u}(1,t)} - 1 \right) e^{-\frac{ab}{2\epsilon} - \frac{a}{\epsilon} u^r(1,t)} - \hat{v}(1,t) \right) \\ \hat{v}_x(0,t) &= \tilde{V}_0(t) + p_{00} \left(\left(e^{-\frac{a}{\epsilon} \tilde{u}(0,t)} - 1 \right) e^{-\frac{a}{\epsilon} u^r(0,t)} - \hat{v}(0,t) \right) \\ \hat{v}_x(1,t) &= \tilde{V}_1(t) + p_{11} \left(\left(e^{-\frac{a}{\epsilon} \tilde{u}(1,t)} - 1 \right) e^{-\frac{ab}{2\epsilon} - \frac{a}{\epsilon} u^r(1,t)} - \hat{v}(1,t) \right) \end{split}$$

where

$$p_{2}(x) = -\epsilon P_{\xi}(x,0), \quad p_{1}(x) = -\epsilon P_{\xi}(x,1)$$

$$p_{00} = -P(0,0), \quad p_{11} = -P(1,1)$$

$$P(x,\xi) = -\frac{1}{2}\sqrt{\frac{c_{2}}{\epsilon}} \frac{I_{1}\left(\sqrt{\frac{c_{2}}{\epsilon}\left(\left(\xi - \frac{1}{2}\right)^{2} - \left(x - \frac{1}{2}\right)^{2}\right)\right)}}{\sqrt{\left(\xi - \frac{1}{2}\right)^{2} - \left(x - \frac{1}{2}\right)^{2}}} (\xi + x - 1)$$
Particular production of the definition o



Observer-Based Output-Feedback Laws

$$\begin{split} U_{0}(t) &= -\frac{\epsilon}{a} e^{\frac{a}{\epsilon} \tilde{u}(0,t)} \left(\left(k(0,0) + \frac{ab}{2\epsilon} \right) \left(e^{-\frac{a}{\epsilon} \tilde{u}(0,t)} - 1 \right) \right. \\ &- e^{\frac{a}{\epsilon} u^{r}(0,t)} \int_{0}^{1} k_{x}\left(0,\xi\right) \hat{\tilde{v}}\left(\xi,t\right) d\xi \right) + U_{0}^{r}(t) e^{\frac{a}{\epsilon} \tilde{u}(0,t)} \\ U_{1}(t) &= -\frac{\epsilon}{a} e^{\frac{a}{\epsilon} \tilde{u}(1,t)} \left(\left(k\left(1,1\right) + \frac{ab}{2\epsilon} \right) \left(e^{-\frac{a}{\epsilon} \tilde{u}(1,t)} - 1 \right) \right. \\ &+ e^{\frac{ab}{2\epsilon} + \frac{a}{\epsilon} u^{r}(1,t)} \int_{0}^{1} k_{x}\left(1,\xi\right) \hat{\tilde{v}}\left(\xi,t\right) d\xi \right) + U_{1}^{r}(t) e^{\frac{a}{\epsilon} \tilde{u}(1,t)}, \end{split}$$

where

$$k(x,\xi) = -\frac{1}{2}\sqrt{\frac{c_1}{\epsilon}} \frac{I_1\left(\sqrt{\frac{c_1}{\epsilon}\left(\left(x-\frac{1}{2}\right)^2 - \left(\xi-\frac{1}{2}\right)^2\right)}\right)}{\sqrt{\left(x-\frac{1}{2}\right)^2 - \left(\xi-\frac{1}{2}\right)^2}} (x+\xi-1)$$

PADECOT Partial Differential Equation model-based Control of Traffic flow



Theorem

Under conditions for y_1^r , y_2^r , $\exists \mu^* > 0$ and $\beta^* \in \mathcal{KL}$ s.t. if $(u_0, \hat{v}_0) \in H^2(0, 1) \times H^2(0, 1)$ satisfy compatibility and

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\|\tilde{u}(t_0)\|_{H^1} + \|\hat{\tilde{v}}(t_0)\|_{H^1} < \mu^*,
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then

 $\|\tilde{u}\left(t\right)\|_{H^{1}}+\|\hat{\tilde{v}}\left(t\right)\|_{H^{1}} \ \leq \ \beta^{*}\left(\|\tilde{u}\left(t_{0}\right)\|_{H^{1}}+\|\hat{\tilde{v}}\left(t_{0}\right)\|_{H^{1}},t-t_{0}\right), \quad \text{for all } t\geq t_{0}$



Current & Future Steps

Extensions to CACC, nonlinear, and nonconstant-delay predictor-based designs





Current & Future Steps

Extensions to CACC, nonlinear, and nonconstant-delay predictor-based designs

 2×2 quasilinear hyperbolic PDE/nonlinear ODE interconnection



Current & Future Steps

Extensions to CACC, nonlinear, and nonconstant-delay predictor-based designs

 2×2 quasilinear hyperbolic PDE/nonlinear ODE cascade

HJ PDE/ODE cascades or HJ PDEs with actuator/sensor PDE/ODE dynamics



Thank you for attending

