



Lecture 5: Vehicular Control

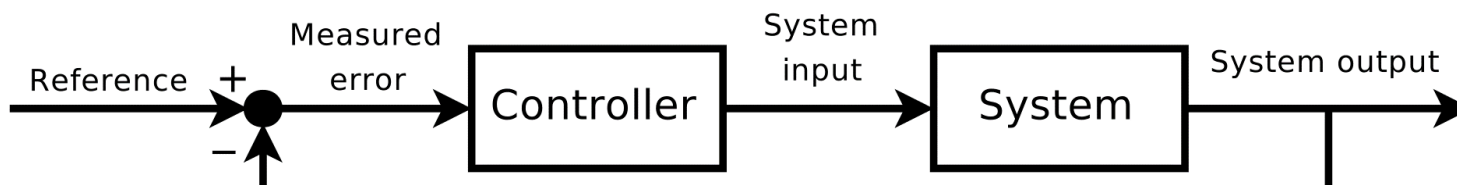
Vehicular Control

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Module "Vehicle-2-X: Communication and Control"

- Basics of Control Theory
- Vehicular Control

- Open-loop control vs. Closed-loop control
- Open-loop control: Control action of the controller is independent of the „process output“ (no feedback)
- Closed-loop control: Control action of the controller is dependend on feedback from the process in the form of the value of the process output

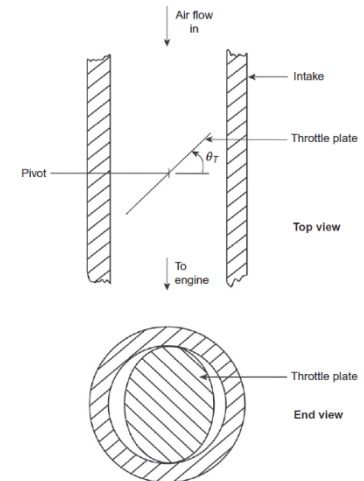


Source: Control theory, Wikipedia

- Vehicle cruise control example
 - Open-loop control
 - Lock the throttle position (recall the figure below?): controls the air intake
 - Vehicle will travel slower when climbing uphill
 - Cannot compensate for changes in circumstances
 - Closed-loop control
 - Data from sensor monitoring the vehicle speed
 - Controller continuously compared the sensor output with the desired speed
 - The „error“ determines the throttle position

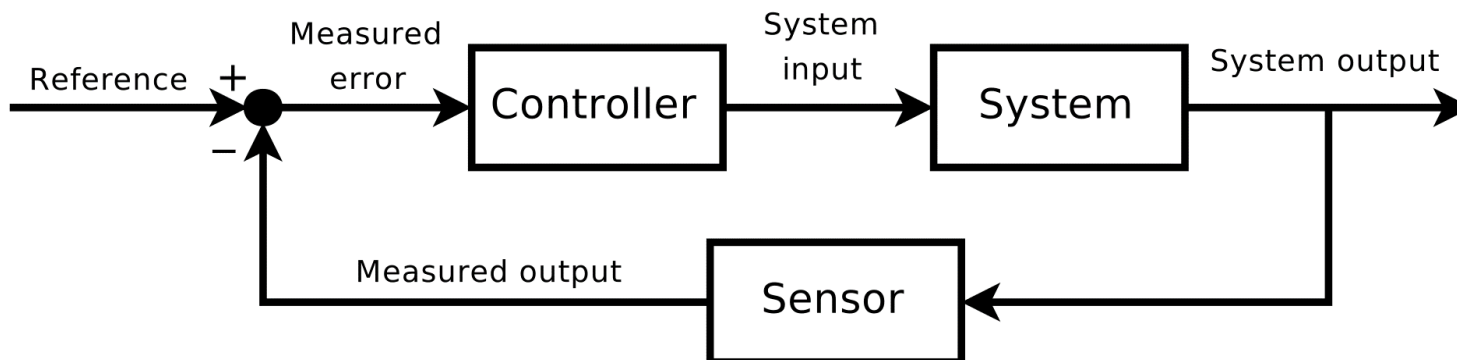


**Throttle
valve**

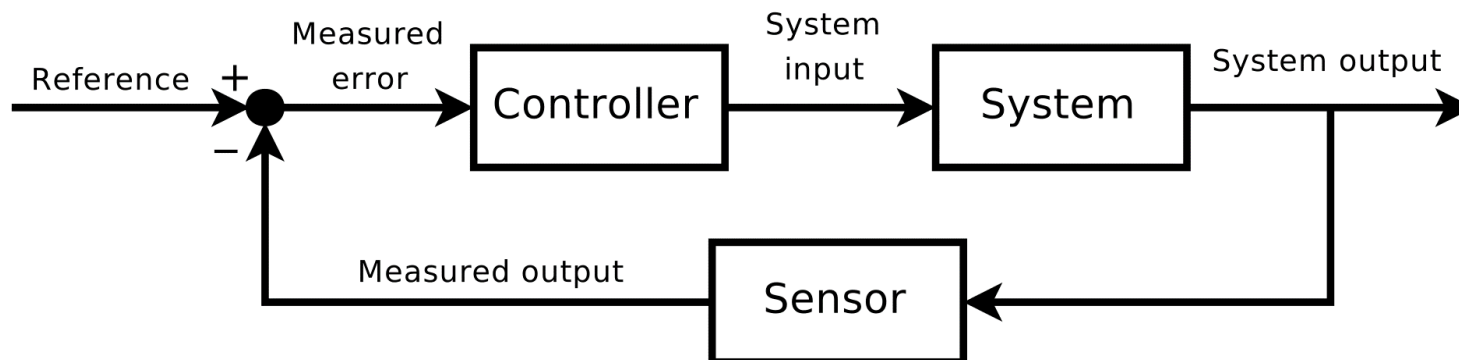


Source: W. Ribbens,
“Understanding
automotive electronics”

- Sensor: Component for measurement of a variable (signal)
- Plant (or system): Is the part to be controlled
- Controller: Provides the satisfactory characteristics for the total system
- Two types of control systems
 - Regulator: Maintains a physical variable at some constant value in presence of perturbances
 - Servomechanism: A physical variable is required to follow or track some time-varying function



- Control system is often described using block diagrams
- Block diagrams contain *models*, a mathematical description of input-output relation of components combined with block diagram



- A transfer function of a **linear** system is defined as the ratio of the Laplace transform of the output and the laplace transform of the input

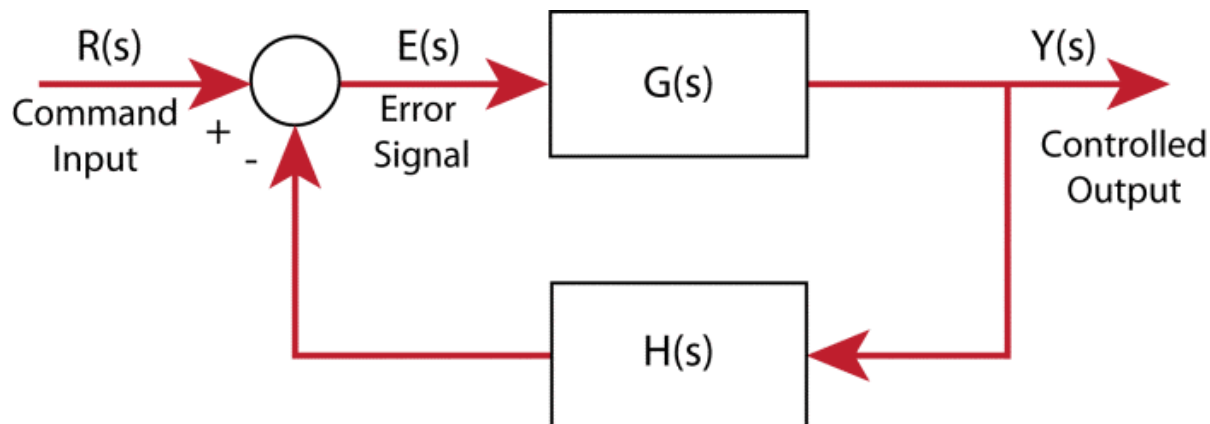
$$Y(s) = G(s)E(s)$$

$$E(s) = R(s) - H(s)Y(s)$$

$$Y(s) = G(s)[R(s) - H(s)Y(s)]$$

$$\frac{Y(s)}{R(s)} = \frac{G(s)}{1 + G(s)H(s)}$$

- System gain = forward gain / (1 + loop gain)



Source: <http://bodetechnics.com/control-engineering-tutorials/transfer-function-block-diagram-manipulation/>

- Laplace transform of $f(t)$ denoted by $F(s)$ or $L\{f(t)\}$, is an integral transform given by the Laplace integral:

$$L\{f(t)\} = F(s) = \int_0^{\infty} e^{-st} f(t) dt$$

- Provided that this integral exists
- Transformation to the frequency domain is one-to-one

- $f(t) = 1, F(s) = \frac{1}{s}$

$$L\{f(t)\} = \int_0^{\infty} e^{-st} dt = -\frac{1}{s} e^{-st} \Big|_0^{\infty} = \frac{1}{s}$$

- $f(t) = t, F(s) = \frac{1}{s^2}$

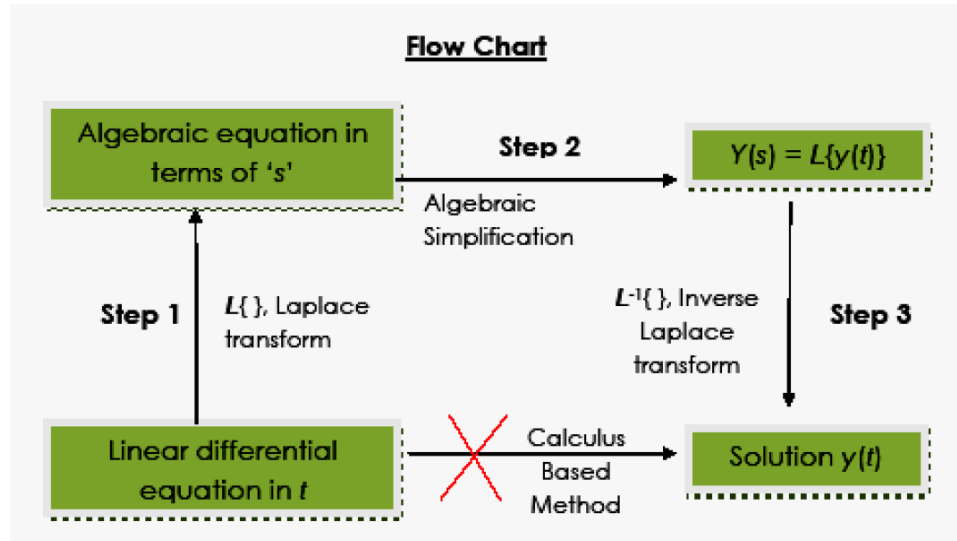
- $f(t) = e^{at}, F(s) = \frac{1}{s-a}$

- Some useful properties

- $L\{f'(t)\} = sL\{f(t)\} - f(0)$
- $L\{f''(t)\} = s^2L\{f(t)\} - sf(0) - f'(0)$
- $L\{f'''(t)\} = s^3L\{f(t)\} - s^2f(0) - sf'(0) - f''(0)$

- Useful for solving linear differential equations

$$y'' - 6y' - 5y = 0, y(0) = 1, y'(0) = -3$$

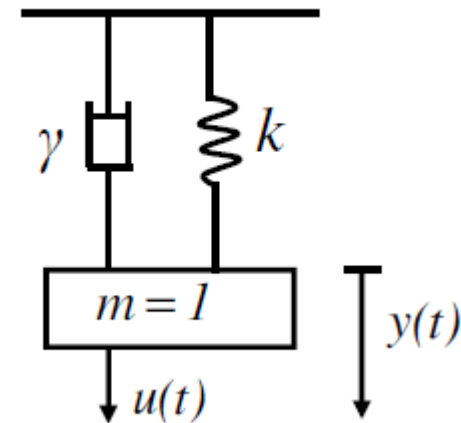


Source: Z. S. Tseng, „The Laplace Transform“, 2008

- Dynamic system modeling example
- k : spring constant, γ : damping constant, $u(t)$: force

$$\ddot{y} = -ky(t) - \gamma\dot{y}(t) + u(t)$$
$$\ddot{y}(t) + \gamma\dot{y}(t) + ky(t) = u(t)$$
$$y(0) = y_0, \dot{y}(0) = \dot{y}_0$$

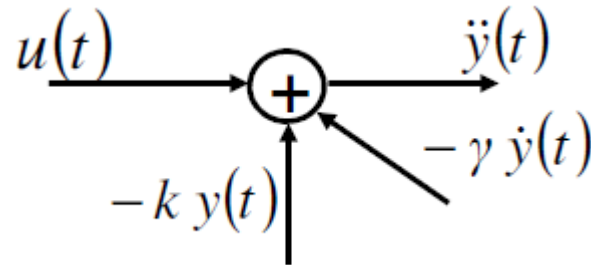
- This is an linear ordinary differential equation
 - Linear: no y^2
 - Ordinary: one independent variable
(as opposed to partial differential equations)



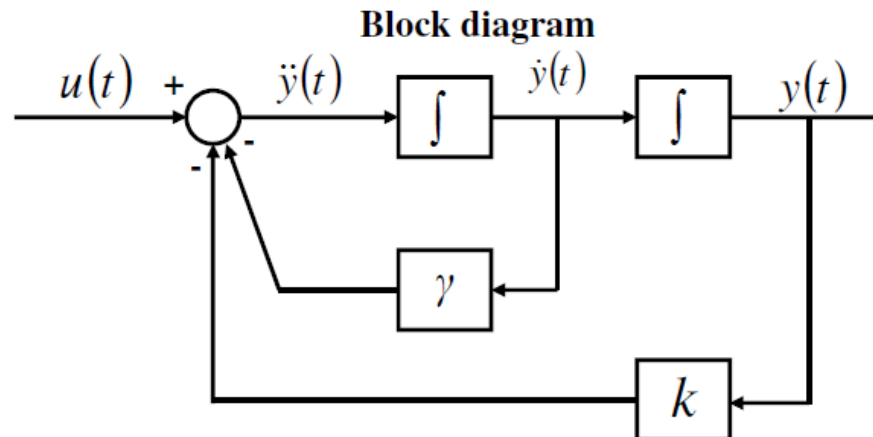
- Express the highest order term

$$\ddot{y}(t) = -ky(t) - \gamma \dot{y}(t) + u(t)$$

- Put adder in front



- Synthesize all other terms using integrators



- Any system which can be presented by LODE can be represented in **state space form** (matrix differential equation)

- Example

$$\ddot{y} = -ky(t) - \gamma\dot{y}(t) + u(t)$$

- Step 1: Deduce set off first order differential equation in variables

$x_j(t)$: states of system

$x_1(t)$: Position $y(t)$

$x_2(t)$: Velocity $\dot{y}(t)$

$$\dot{x}_1(t) = \dot{y}(t) = x_2(t)$$

$$x_2(t) = \ddot{y}(t) = -kx_1(t) - \gamma x_2(t) + u(t)$$

- One** linear ordinary differential equation (LODE) of order **two** is transformed into **two** LODE of order of **one**

- Step 2: Put everything together in a matrix differential equation

$$\begin{bmatrix} \dot{x}_1(t) \\ \dot{x}_2(t) \end{bmatrix} = \begin{bmatrix} 0 & 1 \\ -k & -\gamma \end{bmatrix} \begin{bmatrix} x_1(t) \\ x_2(t) \end{bmatrix} + \begin{bmatrix} 0 \\ 1 \end{bmatrix} u(t)$$

- State equation

$$\dot{x}(t) = Ax(t) + Bu(t)$$

- Measurement equation: related observed value to the state vector

$$y(t) = \begin{bmatrix} 1 & 0 \end{bmatrix} \begin{bmatrix} x_1(t) \\ x_2(t) \end{bmatrix}$$
$$y(t) = Cx(t) + Du(t)$$

- System state

- **System state** x of a system at any time t_0 is the “amount of information that together with all inputs for $t \geq t_0$, uniquely determines the behavior of the system for all $t \geq t_0$ ”

- Linear time-invariant (LTI) system is described by standard form of the state space equation

$$\begin{aligned}\dot{x}(t) &= Ax(t) + Bu(t) \\ y(t) &= Cx(t) + Du(t)\end{aligned}$$

- In most cases $D=0$

Variable	Dimension	Name
$x(t)$	$n \times 1$	State vector
A	$n \times n$	System matrix
B	$n \times r$	Input matrix
$u(t)$	$r \times 1$	Input vector
$y(t)$	$p \times 1$	Output vector
C	$p \times n$	Output matrix
D	$p \times r$	Matrix representing direct coupling with input and output

- Okay why bother with state space equations?
- Computers love state space equations
- Modern control uses state space equation
- Notations are not unique

$$y^{(n)}(t) + a_{n-1}y^{(n-1)}(t) + \dots + a_1 \dot{y}(t) + a_0 y(t) = b_m u^{(m)}(t) + \dots + b_1 \dot{u}(t) + b_0 u(t)$$

- Control-canonical form

$$A = \begin{bmatrix} 0 & 1 & 0 \\ 0 & 0 & 1 \\ -a_0 & -a_1 & -a_2 \end{bmatrix}, B = \begin{bmatrix} 0 \\ 0 \\ 1 \end{bmatrix}, C = [b_0 \ b_1 \ b_2], D = b_3$$

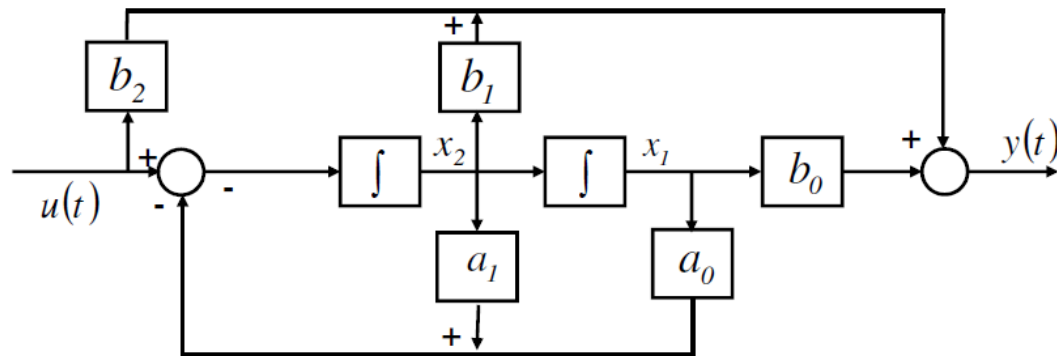
- Observer-canonical form

$$A = \begin{bmatrix} 0 & 0 & -a_0 \\ 1 & 0 & -a_1 \\ 0 & 1 & -a_2 \end{bmatrix}, B = \begin{bmatrix} b_0 \\ b_1 \\ b_2 \end{bmatrix}, C = [0 \ 0 \ 1], D = b_3$$

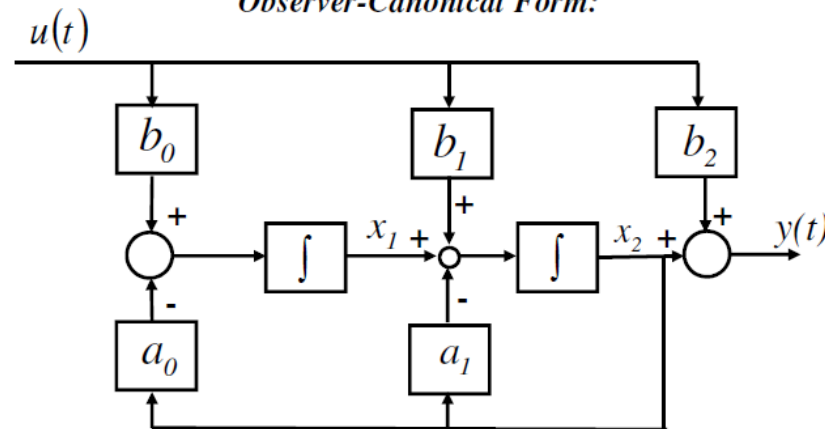
State Space Equation

Block diagrams:

Control-canonical Form:



Observer-Canonical Form:



- Example

$$\frac{d^2}{dt^2}y(t) + 4\frac{d}{dt}y(t) + 3y(t) = 2u(t)$$

- State space equation

- Let $x_1(t) = y(t)$ and $x_2(t) = \dot{y}(t)$

$$\dot{x}_1(t) = \dot{y}(t) = x_2(t)$$

$$\dot{x}_2(t) + 4x_2(t) + 3x_1(t) = 2u(t)$$

$$\dot{x}_1(t) = -3x_1(t) - 4x_2(t) + 2u(t)$$

- Write equations in matrix form

- $x(t) = \begin{bmatrix} x_1(t) \\ x_2(t) \end{bmatrix}$

$$\dot{x}(t) = \begin{bmatrix} 0 & 1 \\ -3 & -4 \end{bmatrix} x(t) + \begin{bmatrix} 0 \\ 2 \end{bmatrix} u(t)$$

$$y(t) = [1 \ 0]x(t)$$

- If we know transfer function $G(s)$, what can we say about the system stability?
- A linear time invariant system is called BIBO stable (bounded-input-bounded-output).
- For all bounded inputs $|u(t)| \leq M_1$ (for all t), exists a boundary for the output signal M_2 , so that $|y(t)| \leq M_2$ for all t , with M_1, M_2 , positive real numbers

- Example: $Y(s) = G(s)U(s)$, interator $G(s) = \frac{1}{s}$
 $u(t) = \delta(t), U(s) = 1$
 $|y(t)| = |L^{-1}[Y(s)]| = \left| L^{-1} \left[\frac{1}{s} \right] \right| = 1$
- What happens when the input is $u(t) = 1$?
 $u(t) = 1, U(s) = \frac{1}{s}$
 $|y(t)| = |L^{-1}[Y(s)]| = \left| L^{-1} \left[\frac{1}{s^2} \right] \right| = t$
- (unbounded)
- BIBO stability should be proven for ALL inputs

- $Y(s) = G(s)U(s)$
- By means of convolution theorem we get
- $|y(t)| = \left| \int_0^t g(\tau)u(t - \tau)d\tau \right| \leq \int_0^t |g(\tau)||u(t - \tau)|d\tau \leq M_1 \int_0^t |g(\tau)|d\tau \leq M_2$
- Therefore,
- If the impulse response, $\int_0^\infty |g(\tau)|d\tau < \infty$, is bounded, then the system is BIBO-stable
- But what about transfer function?

- State space model

$$\begin{aligned}\dot{x}(t) &= Ax(t) + Bu(t) \\ y(t) &= Cx(t) + Du(t)\end{aligned}$$

$$\begin{aligned}sX(s) - x(0) &= AX(s) + BU(s) \\ X(s) &= (sI - A)^{-1}x(0) + (sI - A)^{-1}BU(s) \\ &= \phi(s)x(0) + \phi(s)BU(s)\end{aligned}$$

$$\begin{aligned}Y(s) &= CX(s) + DU(s) \\ &= C[(sI - A)^{-1}]x(0) + [C(sI - A)^{-1}B + D]U(s) \\ &= C\phi(s)x(0) + C\phi(s)BU(s) + DU(s)\end{aligned}$$

- Transfer function

$$G(s) = \frac{Y(s)}{U(s)} = C\phi(s)B + D$$

- Can stability be determined if we know the transfer function of a system?
- State space model

$$\begin{aligned}\dot{x}(t) &= Ax(t) + Bu(t) \\ y(t) &= Cx(t) + Du(t)\end{aligned}$$

- The transfer function is given by

$$H(s) = C(sI - A)^{-1}B + D = C \frac{Adj(sI - A)}{\det(sI - A)} + D$$

- $Adj(A)$ is the adjugate matrix of A
- When, $A = \begin{pmatrix} a & b \\ c & d \end{pmatrix}$, $Adj(A) = \begin{pmatrix} d & -b \\ -c & a \end{pmatrix}$
- The poles of $H(s)$ are uncanceled eigenvalues of A , assuming $D=0$
 - Let λ_i be the i^{th} eigenvalue of A , if $\lambda_i \leq 0, \forall i$, then system is stable

- Four types of information are usually considered for the longitudinal control
 - Speed and acceleration of the host vehicle
 - Distance to the preceding vehicle
 - Speed and acceleration of the preceding vehicle
 - Acceleration and speed of the first vehicle (i.e., lead vehicle)
- Speed and acceleration of the host vehicle can be measured by speed sensors and accelerometers onboard the vehicle
- Distance to the preceding vehicle can be measured by ranging sensors, e.g., radar, LIDAR, ultrasonic sensors
 - Radar has been used most commonly
 - LIDAR is affected by weather (snow and fog)

- Speed and acceleration of the preceding vehicle and lead vehicle
 - Speed and acceleration of the preceding vehicle can be derived from the host vehicle
 - However, requires differentiation of the radar sensor, which can be noisy
- Communication
 - Transmit the speed and acceleration to the succeeding vehicle
 - Reliability of communication?

- Assumptions
 - Time delays associated with power generation in the engine are negligible
 - Torque converter in the vehicle is locked
 - No torsion in the drive axle
 - Slip between the tires and the road is zero
- Then, vehicle speed V_x is directly related to the engine speed ω_e

$$\dot{x} = v_x = Rh\omega_e$$

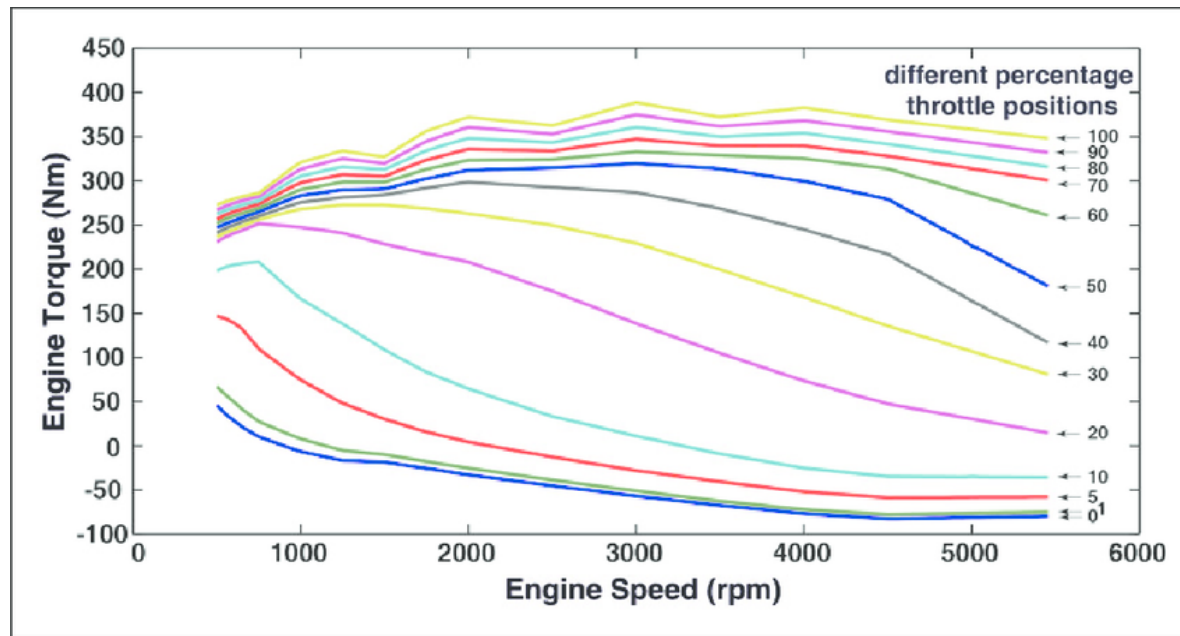
where R and h are gear ratio and tire radius

- The simplified vehicle dynamics model takes **three** variables as states
 - Mass of air in the intake manifold: m_a
 - Engine speed: ω_e
 - Brake torque: T_{br}
- The dynamics relating engine speed to the pseudo-inputs, net combustion torque T_{net} and brake torque T_{br} can then be modeled by

$$\dot{\omega} = \frac{T_{net} - c_a R^2 h^2 \omega_e^2 - R(hF_f + T_{br})}{J_e}$$

where c_a is the aerodynamic drag coefficient, F_f is the rolling resistance of the tires, and $J_e = I_e + (mh^2 + I_\omega)R^2$ is the effective inertia reflected on the engine side

- $T_{net}(\omega_e, m_a)$ is a nonlinear function obtained from steady-state engine maps available from the vehicle manufacturer



Source: S. M. M. Jaafari, „A comparison on optimal torque vectoring strategies in overall performance enhancement of a passenger car“,

- Dynamics relating \dot{m}_a , the air mass flow in engine manifold, to the throttle angle can be modeled as

$$\dot{m}_a = \dot{m}_{ai} - \dot{m}_{ao}$$

where \dot{m}_{ai} and \dot{m}_{ao} are the flow rate into the intake manifold and out from the manifold

- \dot{m}_{ao} is a nonlinear function of ω_e and P_m , pressure of the air in engine manifold (from engine manufacturer)
- \dot{m}_{ai} is

$$\dot{m}_{ai} = MAX \cdot TC(\alpha)PRI(m_a)$$

where MAX is a constant dependend on the size of the throttle body, $TC(\alpha)$ is a nonlinear invertible function of the throttle angle, and PRI is the pressure influence function that describes the choked flow relationship which occurs through the throttle valve

- How do we measure m_a ? Ideal gas law
 - $P_m V_m = m_a R_g T$
- Where R_g is a variable that depends on the vehicle transmission gear ratio, and T is the temperature
- Pressure can be measured to calculate m_a

- Brake model is linear and modeled by a first-order lag

$$\tau_{br}\dot{T}_{br} + T_{br} = T_{br,cmd} = K_{br}P_{br}$$

where τ_{br} is the brake system time constant, K_{br} is the total proportionality between the brake pressure P_{br} and the brake torque at the wheels

- Simpler models
- Assumption
 - Vehicle reacts to the acceleration input without any delay (no inertia)

- Control input: acceleration
- Control output: inter-vehicle distance

$$\dot{v}(t) = u_i(t)$$

$$\dot{X}_i(t) = A_i X_i(t) + B_i U_i(t)$$

- What would be A and B in such a case?

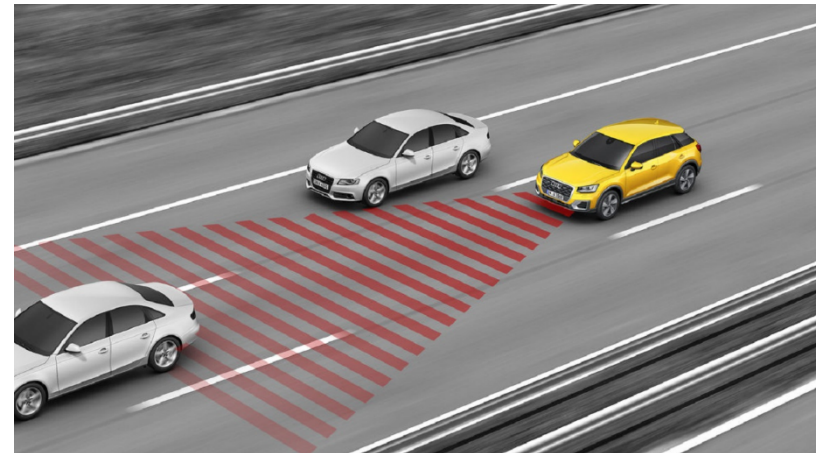
- $X_i(t) = \begin{bmatrix} x_i(t) \\ v_i(t) \end{bmatrix}, A = \begin{bmatrix} 0 & 1 \\ 0 & 0 \end{bmatrix}$

- $B_i = \begin{bmatrix} 0 \\ 1 \end{bmatrix}, U_i(t) = u_i(t)$

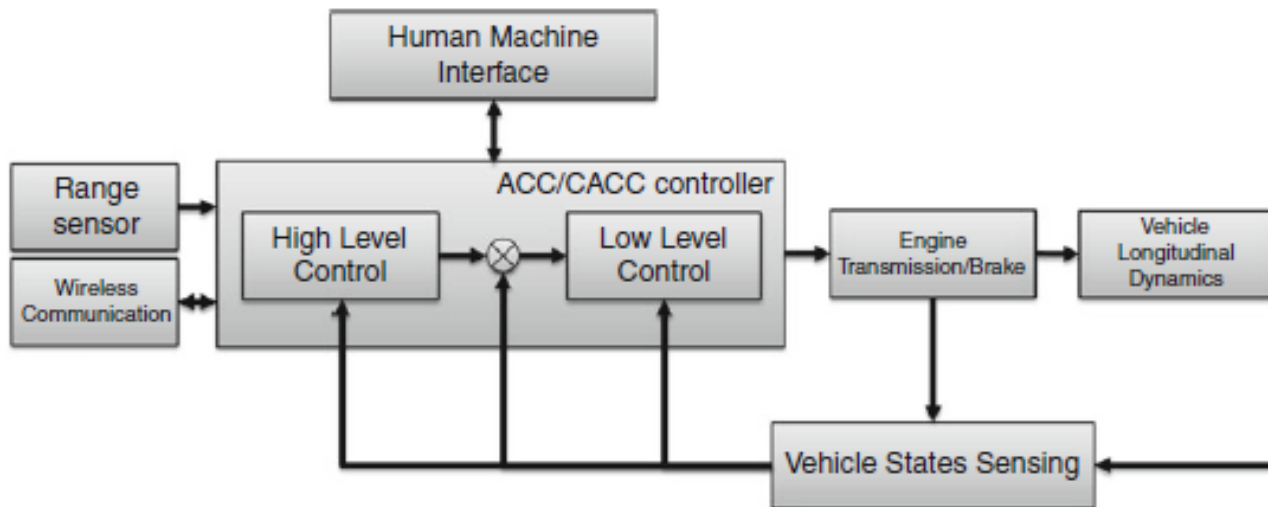
- But, in more recent works, more sophisticated models are used

Platooning vs Adaptive Cruise Control

- Platooning
 - Maintains constant distance
 - Requires communication among vehicles
 - Minimum traffic shockwave
- Adaptive cruise control (ACC)
 - Maintains minimum distance and time headway
 - Usually achievable with sensor inputs only
 - Already in commercial vehicles



- Usually consists of inner loop and outer loop controllers
- Outer loop controller (upper or high level) synthesizes a desired speed or acceleration
- Inner loop controller (lower level) will generate corresponding throttle or brake commands



- Upper level controller
 - Determines the desired acceleration for each vehicle so as to
 - Objective (1): Maintain constant small spacing between the vehicles
 - Objective (2) Ensure string stability of the platoon
 - Plant model of the upper level controller is

$$\ddot{x}_i = u_i$$

where the subscript i denotes the i -th vehicle in the platoon

- However, due to the finite bandwidth associated with the lower level controller, each vehicle is actually expected to track the desired acceleration imperfectly

- Performance specification of the upper level controller is therefore to meet objectives (1) and (2) in the presence of first-order lag in the lower level controller: time lag from the desired value ($\ddot{x}_{i_{des}}$)

$$\ddot{x}_i = \frac{1}{\tau_S + 1} \ddot{x}_{i_{des}} = \frac{1}{\tau_S + 1} u_i$$

- This assumption is made to simplify the design of the high-level control
- (What's first-order lag?)

$$\tau \frac{dy}{dx} + y = x$$

- The spacing error for the i -th vehicle is defined as $\epsilon_i = x_i - x_{i-1} + L$, where ϵ_i is the longitudinal spacing error of the i -th vehicle, L being the desired spacing

- Speed independent spacing policy(constant spacing)
 - $x_{rd} = d_0$
 - Usually achievable only with v2v communication
- Speed-dependent spacing policy
 - Semi-autonomous: can be implemented with sensor measurements only
 - $x_{rd} = d_0 + \dot{x}t_{hw}$
 - Time headway is used
 - Commonly used in commercial ACC systems
 - d_0 is the minimum safe distance
 - t_{hw} is the time gap
 - Similar to driver's daily experience

- Different speed-dependent spacing policies have been proposed in literature
 - Time headway policy performs poor against traffic flow fluctuation (Remember the video from the introduction?)
 - Nonlinear spacing policy for the stability of the traffic flow has been proposed
 - Junmin W., et al., “Should adaptive cruise-control systems be designed to maintain a constant time gap between vehicles?”, IEEE Trans. Veh. Technol. 2004

$$x_{rd} = \frac{1}{\rho_m \left(1 - \frac{\dot{x}_i}{v_f}\right)}$$

where ρ_m is the traffic density parameter

- The objectives (1) and (2) can be mathematically stated as

$$\epsilon_{i-1} \rightarrow 0 \Rightarrow \epsilon_i \rightarrow 0$$
$$||H(s)||_{inf} \leq 1$$

where $\hat{H}(s)$ is the transfer function relating the spacing errors of consecutive vehicles in the platoon: $\hat{H}(s) = \frac{\epsilon_i(s)}{\epsilon_{i-1}(s)}$

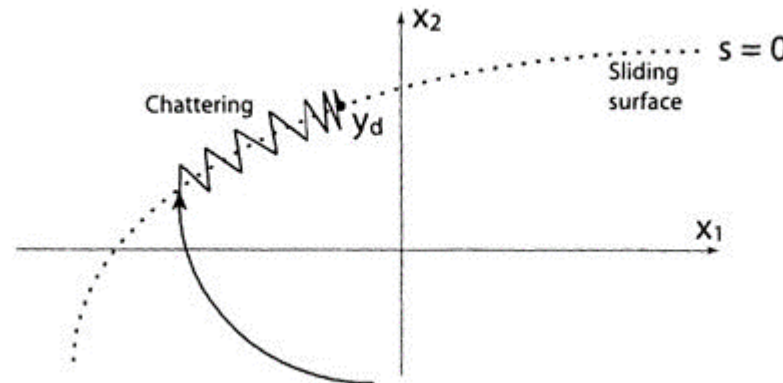
- Notation $||H(s)||_{inf}$ denotes the largest value $H(s)$ could have according to changing value of i (vehicles)

- The string stability of the platoon
 - Practically, it means the gap regulation error will not be amplified from the lead vehicle to the last vehicle in the platoon
 - $||H(s)||_{inf} \leq 1$, refers to a property in which spacing errors are guaranteed to diminish as they propagate toward the tail of the platoon
 - Example: Any errors between the second and third cars do not amplify into an extremely large spacing error between seventh and eight cars
 - (D. Swaroop, et al., „String Stability of Interconnected Systems,“ IEEE Transactions on Automatic Control, 1996)
 - Will be robust against internal vehicle dynamics as well as the imperfections in the lower-loop
- Traffic network point of view on string stability
 - Less shockwaves
- Driver's point of view
 - Smooth ride and safety benefit

- Linear Controller Design
 - Desired acceleration

$$a_{d,i} = -\frac{1}{h(\dot{x}_{r,i} + \lambda e_i)}$$

- Example: Sliding mode control
 - Nonlinear control method that alters the dynamics of a nonlinear system by application of a discontinuous control signal that forces the system to „slide“ along a cross-section of the system's normal behavior
 - Step 1: select a sliding surface (which is stable)
 - Step 2: design a control law which will attract the system status to the sliding surface and remain there



Source: <https://www.globalspec.com/reference/21394/160210/chapter-5-4-2-sliding-mode-control>

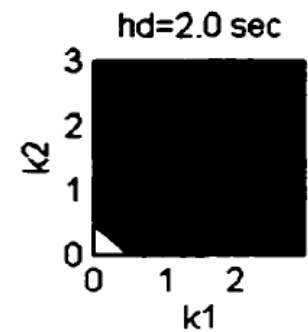
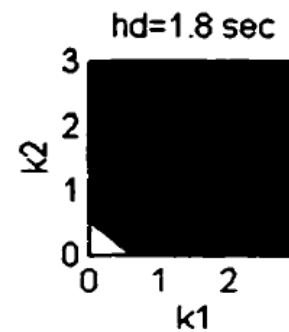
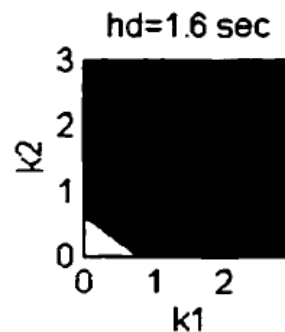
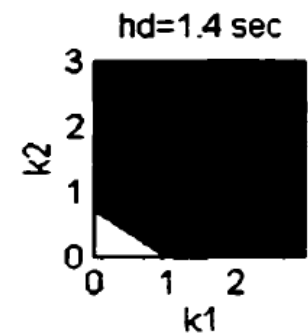
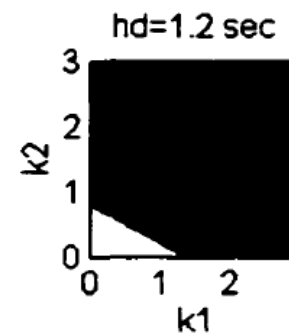
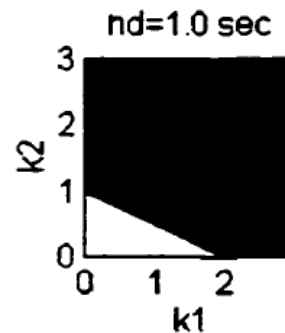
- Simple sliding mode control for ACC
- Define the sliding surface
 - $S_1 = e_i = R_i - T_h v_i$, where e_i is the range error, R_i is the the range of i-th vehicle, T_h is the time headway
- Design a control law
 - $\dot{S}_1 = \dot{e}_i = \lambda S_1$, where λ is the convergence rate to the sliding surface
- Actual input is acceleration, so if we re-arrange by substituting S
 - $a_i = \frac{\lambda}{T_h} e_i + \frac{1}{T_h} \dot{R}_i$
- What does it mean?
 - Smaller time gap means aggressive control (larger acceleration)
 - And higher risk of losing string stability $T_h \geq 2\tau$

- Consider a group of vehicles that form a string in dense traffic
- $d_i = \frac{1}{s} v_i$
- $v_i = G_i(s) \cdot v_{i-1}$
- $G_i(s)$ is the speed transfer function of i-th vehicle
- $\epsilon_i = d_{i-1} - d_i - L$ (range error)
- $\epsilon_{vi} = v_{i-1} - v_i$ (range rate error)
- Let $L_i = T_h \cdot v_i$
- Propagation transfer function becomes,
- $\bar{G}_{i,k} = \frac{\epsilon_{i+k}}{\epsilon_i} = G_i \cdot G_{i+1} \cdot G_{i+2} \cdots G_{i+k-1} \cdot \frac{1 - G_{i+k} - s \cdot T_h \cdot G_{i+k}}{1 - G_i - s \cdot T_h \cdot G_i}$

- $\frac{\epsilon_i}{\epsilon_{i-1}} = \frac{\epsilon_{vi}}{\epsilon_{vi-1}} = \frac{R_i}{R_{i-1}} = \frac{v_i}{v_{i-1}} = G$
- Substituting all the equations from the previous page
- $\frac{\epsilon_i}{\epsilon_{i-1}} = \frac{1/s(1-G_i-s \cdot T_h \cdot G_i)v_{i-1}}{1/s(1-G_{i-1}-s \cdot T_h \cdot G_{i-1})v_{i-2}} = \frac{1/s(1-G-s \cdot T_h \cdot G)Gv_{i-2}}{1/s(1-G-s \cdot T_h \cdot G)v_{i-2}} = G$
- By similar derivation process
- $\frac{\epsilon_{vi}}{\epsilon_{vi-1}} = G$ and $\frac{R_i}{R_{i-1}} = G$

- If the ideal vehicle model is assumed
- $\dot{x}_i = A_i x_i + B_i u_i$
- $x_i = \begin{bmatrix} d_i \\ v_i \end{bmatrix}, A_i = \begin{bmatrix} 0 & 1 \\ 0 & 0 \end{bmatrix}, B_i = \begin{bmatrix} 0 \\ 1 \end{bmatrix}$
- Let's study P-control and constant time-headway controller
- $u_i = k_1 \cdot (d_{i-1} - d_i - T_h v_i) + k_2 (v_{i-1} - v_i)$
- Substituting the control law into state space equation and $R_i = d_{i-1} - d_i$ gives
- $\ddot{R}_i + (k_2 + k_1 T_h) \cdot \dot{R}_i + k_1 R_i = k_2 \dot{R}_{i-1} + k_1 \cdot R_{i-1}$
- Range propagation function is defined as
- $\left| \frac{R_i(s)}{R_{i-1}(s)} \right| = \left| \frac{k_2 s + k_1}{s^2 + (k_2 + k_1 T_h) s + k_1} \right|$
- The above function is 1 if $\omega = 0$

- *Range propagation function*
- $\left| \frac{R_i(s)}{R_{i-1}(s)} \right| = \left| \frac{k_2 s + k_1}{s^2 + (k_2 + k_1 T_h) s + k_1} \right|$
- The above function is 1 if $\omega = 0$
- < 1 for $\forall \omega > 0, k_2 = \frac{2 - k_1 T_h^2}{2 T_h}$
- The controller is string stable only in the gray area



- Sliding surface method of controller design

$$S_i = \dot{\epsilon}_i + \frac{\omega_n}{\xi + \sqrt{\xi^2 - 1}} \frac{1}{1 - C_1} \epsilon_i + \frac{C_1}{1 - C_1} (v_i - v_l)$$

where

$$\dot{S}_i = -\lambda S_i, \text{ with } \lambda = \omega_n(\xi + \sqrt{\xi^2 - 1})$$

- The desired acceleration of the vehicle is then given by

$$\ddot{x}_{i,des} = (1 - C_1)\ddot{x}_{i,des} + C_1\ddot{x}_l - 2 \left(2\xi - C_1 \left(\xi + \sqrt{\xi^2 - 1} \right) \right) \omega_n \dot{\epsilon}_i - \left(\xi + \sqrt{\xi^2 - 1} \right) \omega_n C_1 (v_i - v_l) - \omega_n^2 \epsilon_i$$

- The control gains to be tuned are C_1, ξ, ω_n
 - C_1 : $0 \leq C_1 \leq 1$, can be viewed as weighting on the lead vehicle's speed and acceleration
 - ξ : can be viewed as the damping ratio, critical damping if 1
 - ω_n : bandwidth of the controller

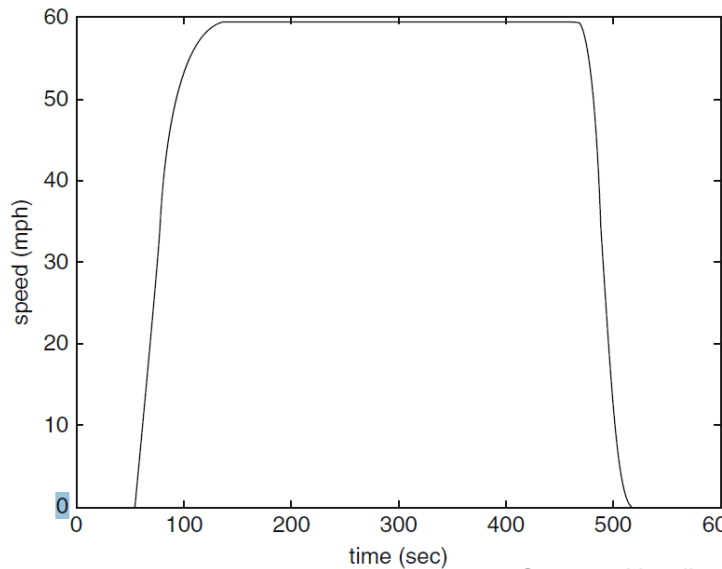
- $\dot{S}_i = -\lambda S_i$, with $\lambda = \omega_n(\xi + \sqrt{\xi^2 - 1})$, ensures the system converges to the sliding surface
- Prior research shows that the system is „string stable“
 - D. Swaroop, et al., „String Stability of Interconnected Systems,“ IEEE Transactions on Automatic Control, 1996
- Robustness of the controller
 - To lags induced by the lower-level controller can also be guaranteed
- Setting $C_1 = 0$, we have the following classical second-order system
$$\ddot{x}_{i,des} = \ddot{x}_{i-1} - 2\xi\omega_n\dot{\epsilon}_i - \omega^2\epsilon_i$$

- Control with information of “r” preceding vehicles
- Mini-platoon control strategy
 - Information from the lead vehicle increases the robustness
 - Why don't we divide a platoon into multiple mini-platoons and have more lead vehicle information?
- Model predictive control
 - Various objectives possible
 - Minimizing gap regulating error
 - Preserving string stability
 - Driver comfort
 - Minimizing fuel consumption

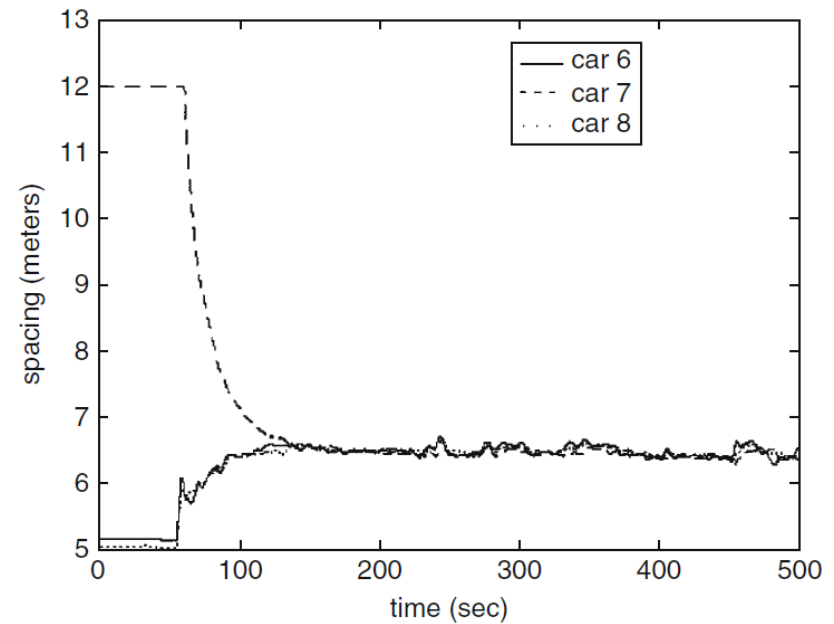
- Lower level controller
 - Throttle and brake actuator puts are determined so as to track the desired acceleration
 - Again, standard sliding surface control technique
 - If the torque is chosen as $T_{net,i} = \frac{J_e}{Rh} \ddot{x}_{i_{des}} + [c_a R^3 h^3 \omega_e^2 + R(hF_f + T_{br})]_j$, then the acceleration of the vehicle equals the desired acceleration defined by the upper level controller $\ddot{x}_i = \ddot{x}_{i_{des}}$
 - The map $T_{net}(\omega_e, m_a)$ is inverted to obtain the desired air mass flow in engine $m_{a_{des}}$
 - A single surface controller is then used to calculate the throttle angle α to make m_a track $m_{a_{des}}$

- Define the surface as $s_2 = m_a - m_{a_{des}}$
- Setting $\dot{s}_2 = -\eta_2 s_2$,
$$MAX \cdot TC(\alpha)PRI(m_a) = \dot{m}_{ao} - \dot{m}_{a_{des}} - \eta_2 s_2$$
- Since $TC(\alpha)$ is invertible, the desired throttle angle can be calculated
- If the desired torque is negative, brake actuators are used to provide the desired torque

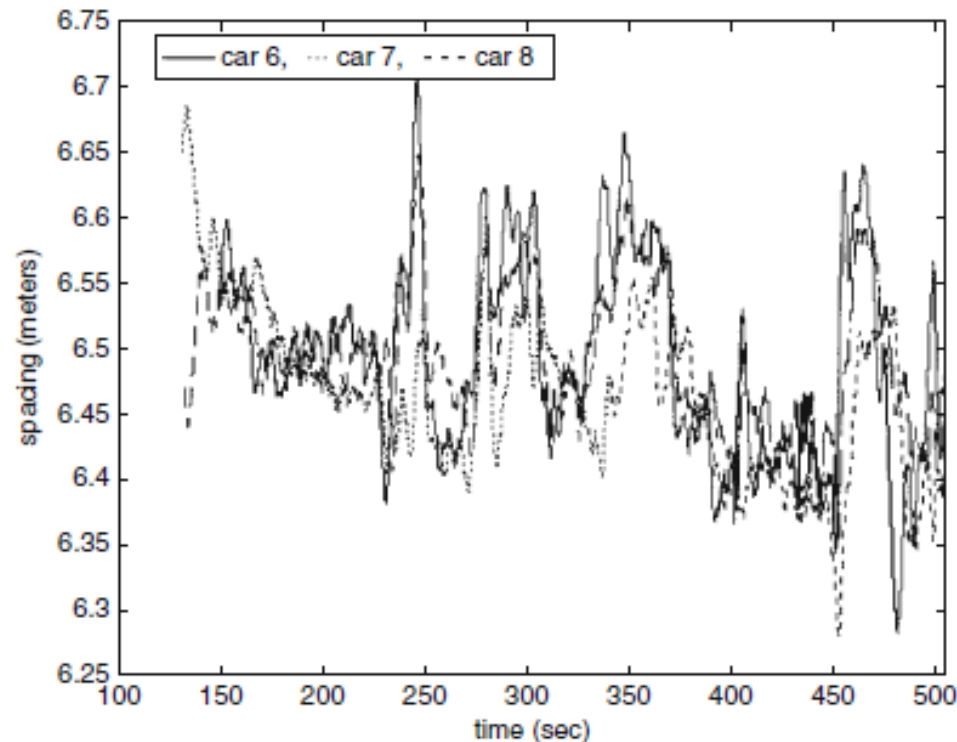
- Lead vehicle velocity profile
- Convergence of inter-vehicle distance



Source: Handbook of Intelligent Vehicles

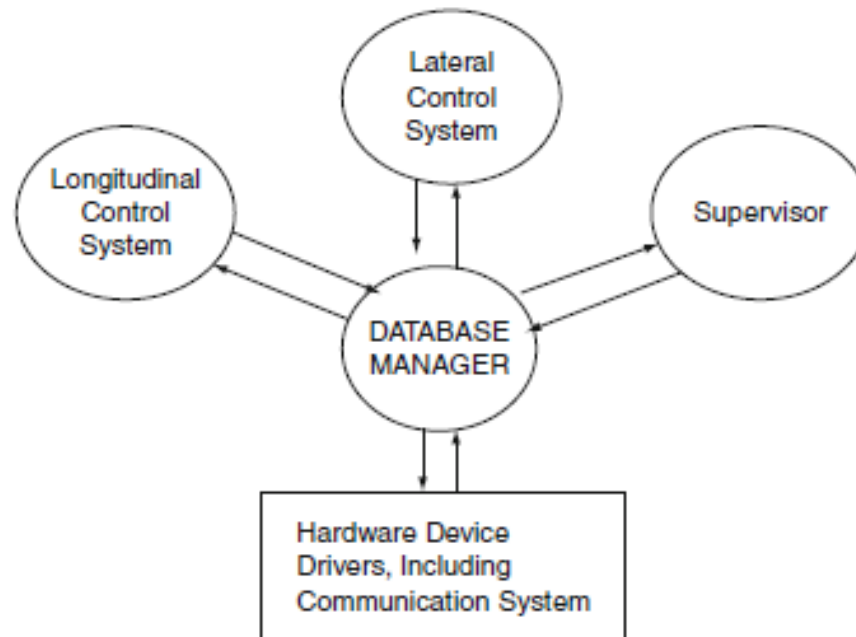


- Response to disturbance
 - Uphill, downhill

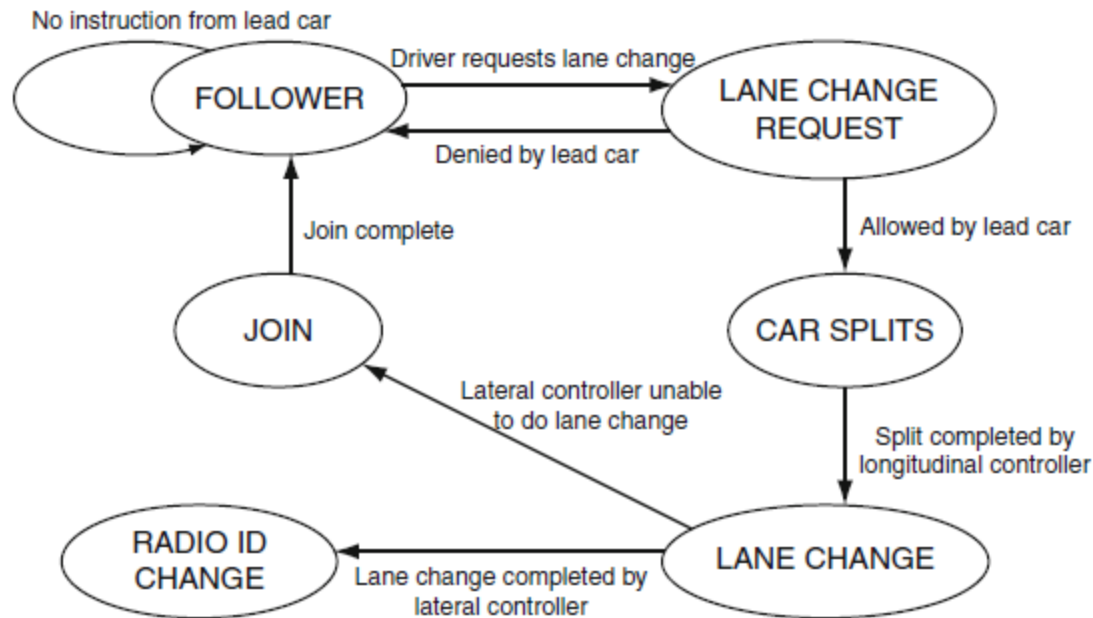


Source: Handbook of Intelligent Vehicles

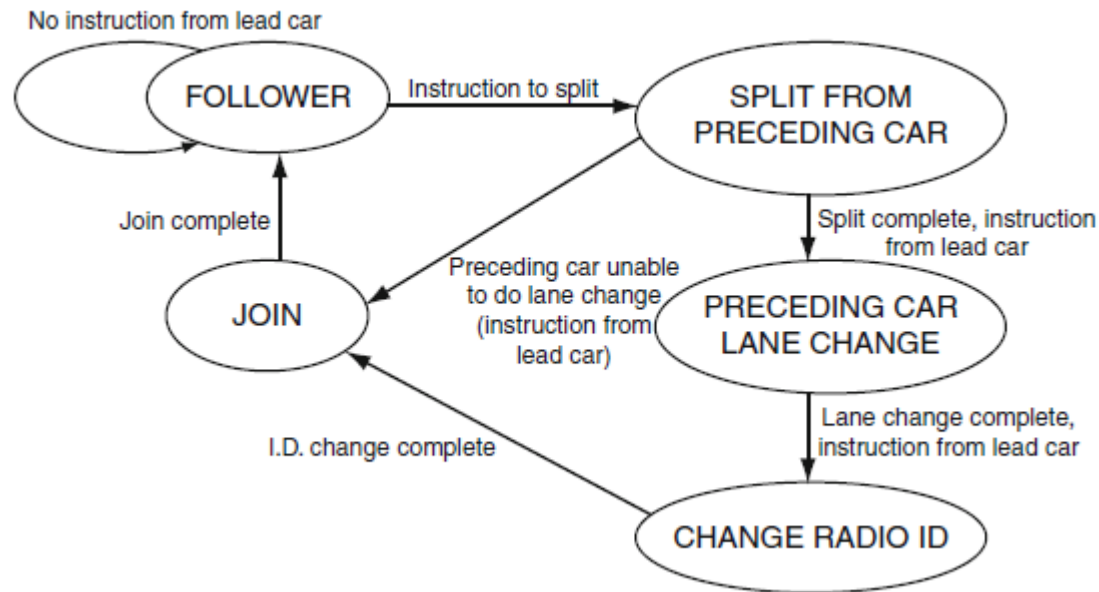
- Lane control and longitudinal control can be performed mostly independently of each other
- Coordination needed when joining or exiting a platoon
- Supervisor coordinates longitudinal and lateral control



- Supervisor of the vehicle requesting to exit from a platoon



- Supervisor of the follower vehicle, which splits from the preceding car



- „Tutorial on Control Theory“, Stefan Simrock, ITER, 2011
- J. Zhou, et al., „Range policy of adaptive cruise control vehicles for improved flow stability and string stability,“ IEEE Transactions on Intelligent Transportation Systems, 2005
- L. Xiao, et al., “Practical String Stability of Platoon of Adaptive Cruise Control Vehicles”, IEEE Transactions on Intelligent Transportation Systems, 2011
- C.Y. Liang, “Traffic-Friendly Adaptive Cruise Control Design”, Dissertation, U. Mich. 2000



Lecture 6: Practical Issues in Digital Control

Basic Platooning Implementation

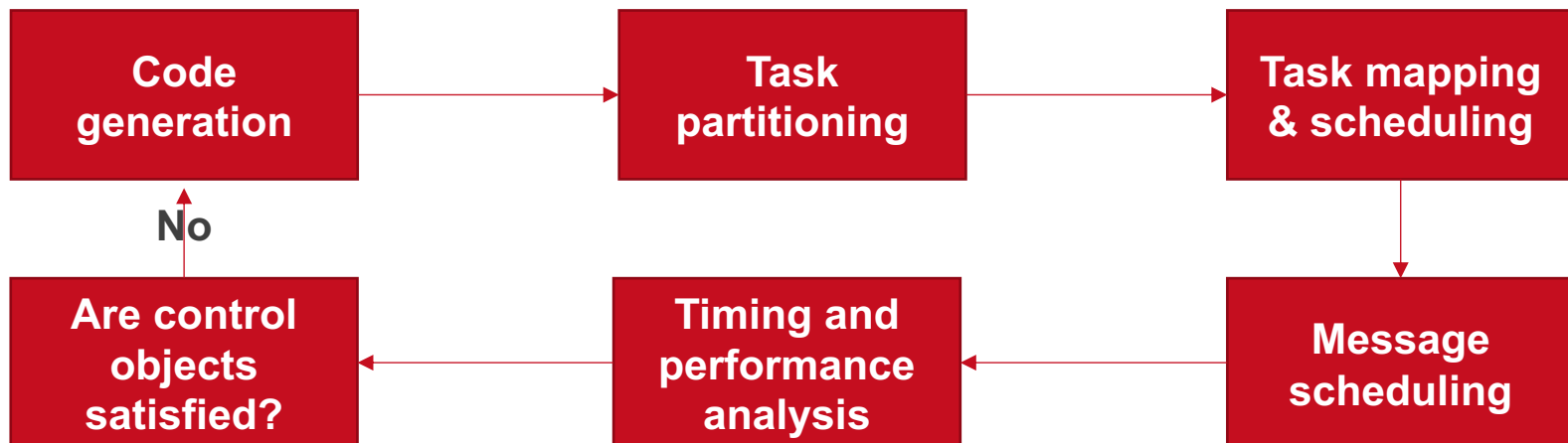
Prof. Sangyoung Park

Module "Vehicle-2-X: Communication and Control"

- Controller design
 - Using equations

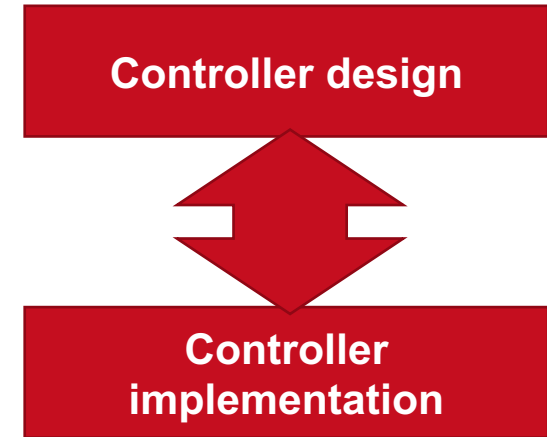


- Controller implementation

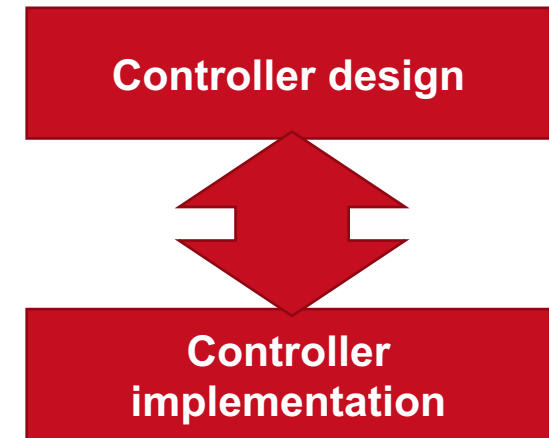


- Assumptions in controller design (control theorist)
 - Infinite numerical accuracy
 - Computing control law takes negligible time
 - No delay from sensor to controller
 - No delay from controller to actuator
 - No jitter
- Controller implementation (Embedded systems engineer)
 - Fix-precision arithmetic
 - Tasks have non-negligible execution times
 - Often large message delays
 - Time- and event-triggered communication

- There is a gap between model and implementation
- Control theorist:
 - “These are implementation details. Not my problem!”
- Embedded systems engineer:
 - “Model-level assumptions are not satisfied by implementation”
- Research questions
 - How do we quantify this gap?
 - How should we close this gap?
- Solution: Controller/architecture co-design



- Performance metrics have been different for computer science domain and control algorithms
- Control algorithms are evaluated by
 - Stability
 - Settling time
 - Peak overshoot
 - ...
- Computer programs are evaluated by
 - Computation time
 - Communication bandwidth
 - Memory footprint
 - Energy consumption
 - ...

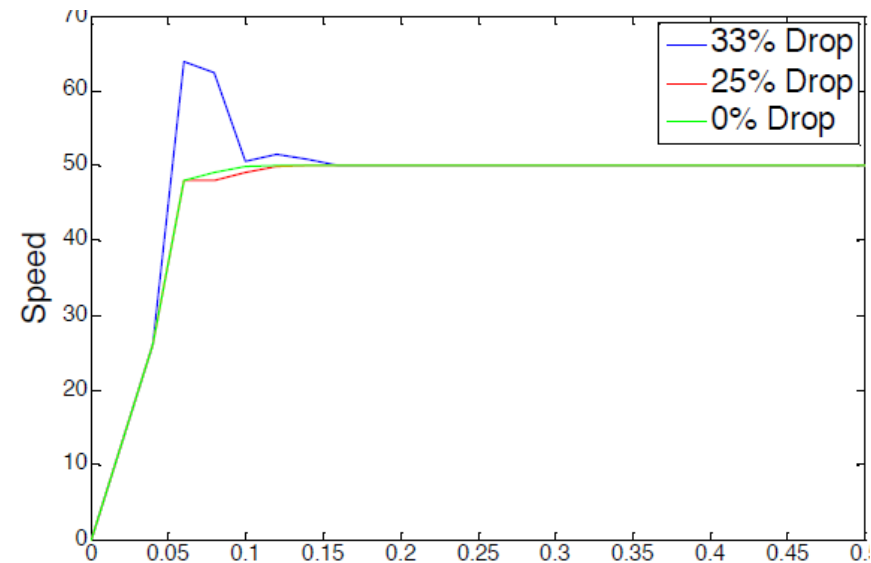
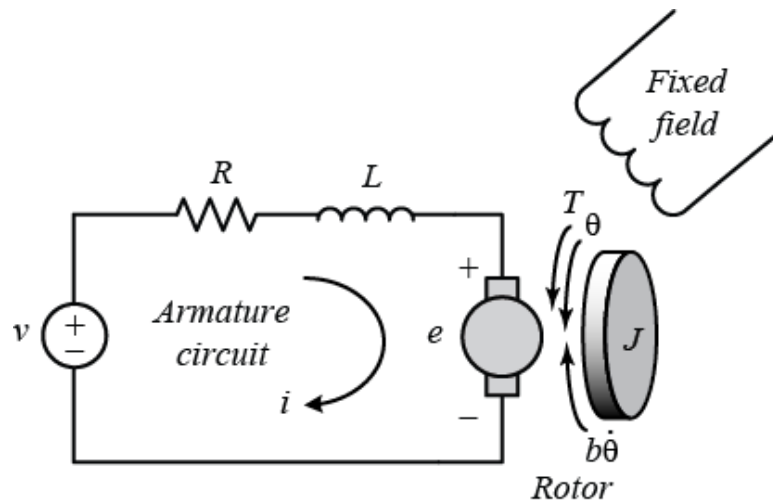


- The deadlines are ***not hard*** for control-related messages
- What does it mean deadline are ***hard*** or ***soft***?
 - Hard deadline: something catastrophic happens when a control task is not finished withint the given deadline
 - Aircraft crashes, battery explodes, etc
 - Soft deadline: there is degradation in performance, but a deadline miss to a certain degree is tolerable
 - Video streaming frame rate drop, etc

- The deadlines are **not hard** for control-related messages

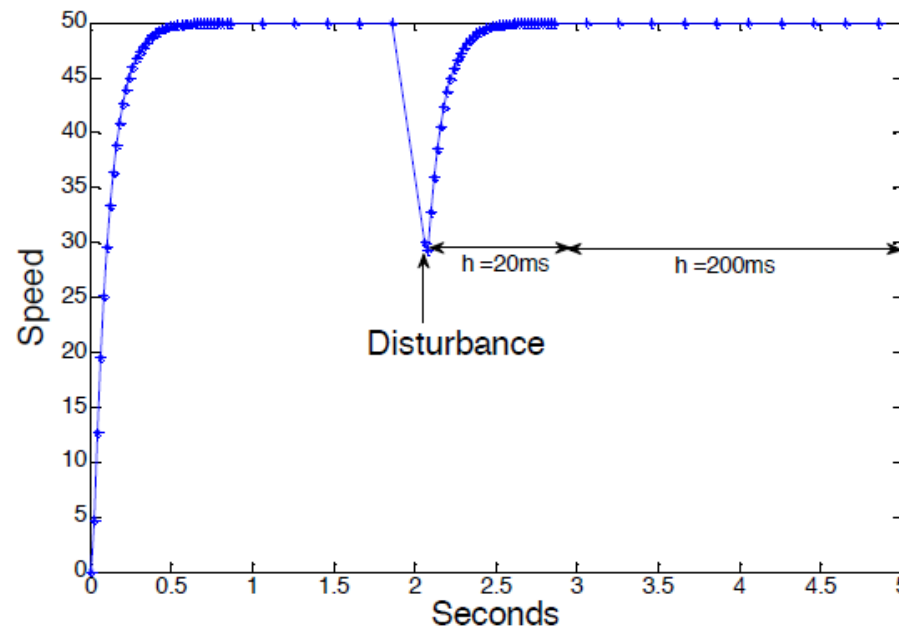
- DC motor $\frac{d}{dt} \begin{bmatrix} \dot{\theta} \\ i \end{bmatrix} = \begin{bmatrix} -\frac{b}{J} & -\frac{K}{J} \\ -\frac{K}{L} & -\frac{R}{L} \end{bmatrix} \begin{bmatrix} \dot{\theta} \\ i \end{bmatrix} + \begin{bmatrix} 0 \\ \frac{1}{L} \end{bmatrix} V \rightarrow \dot{x}(t) = Ax(t) + Bu(t)$

- Objective: $\dot{\theta} = 50$
- As samples drop (ar



<http://ctms.engin.umich.edu/CTMS/index.php?example=MotorSpeed§ion=SystemModeling>

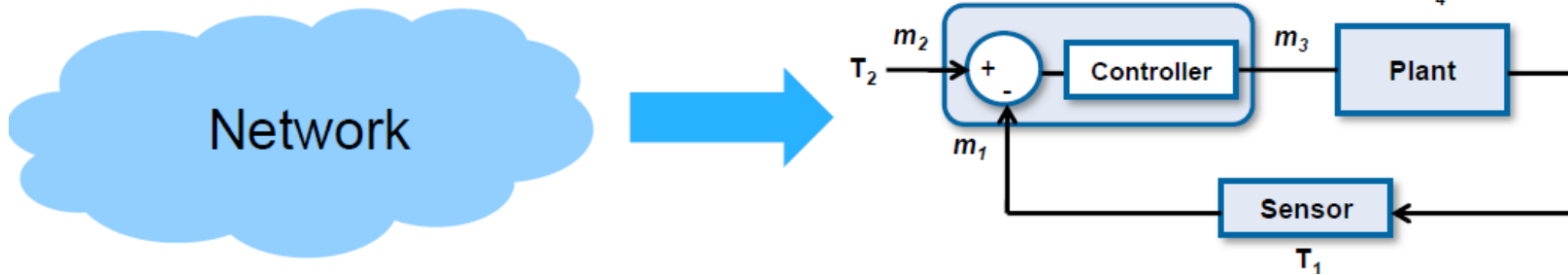
- Sensitivity of control performance depends on the **state** of the controlled plant
- The computation requirement at the steady-state is less, i.e., sampling frequency can be reduced (e.g., event-triggered sampling)
- The communication requirements are less at steady-state, (e.g., lower priority can be assigned to the feedback signals)



- Traditional Embedded control system design
 - Meeting deadlines is of paramount importance
- Co-design
 - Deadline takes the back seat
 - Design space become bigger
 - Resulting design is robust, cost-effective, ..
- Design objectives shift from low level metrics like deadlines to metric governing system dynamics (like stability)

What about NCS?

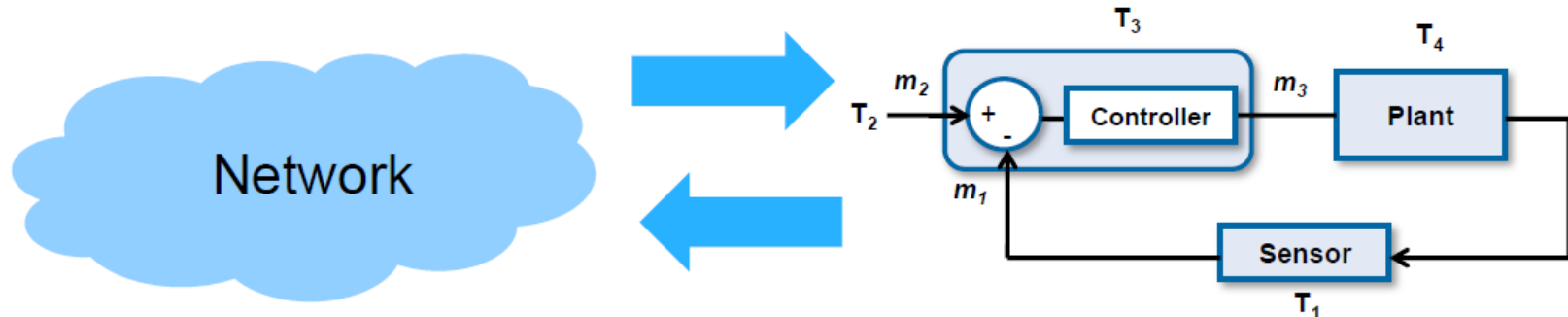
- Networked Computer Systems



- Take network characteristics into account when designing the control laws
 - Packet drops, delays, jitter, ...

What about NCS?

- Arbitrated networked control systems



- ANCS – we can design the network
 - By taking into account control performance constraints
- Problem: How to design the network?
- Given a network, how to design the controller?
 - NCS problem
- Co-design problem: How to design the network and the controller together?

- Samarjit Chakraborty, „Embedded Control Systems“, TU Munich