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# Real-time communication

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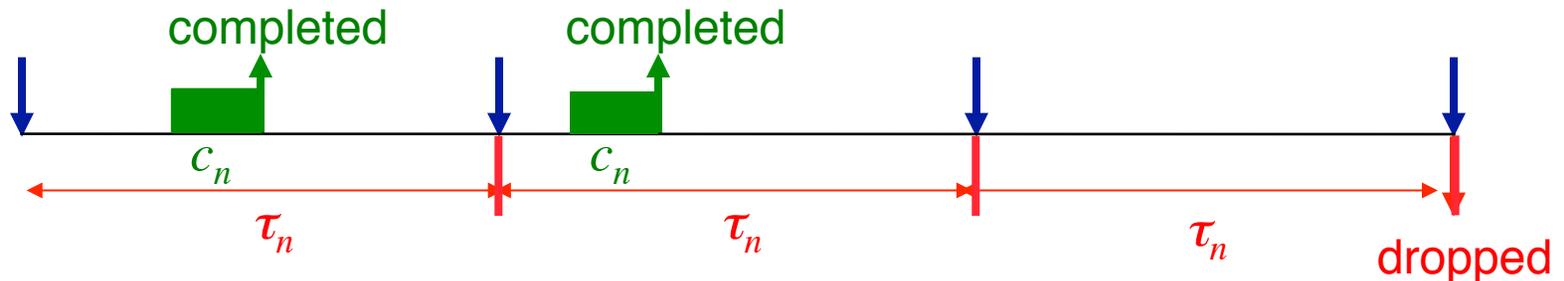
# Delay guarantees for wireless

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- ◆ Increasing use of wireless networks for serving traffic with delay constraints:
  - VoIP
  - Interactive Video
  - Networked Control
- ◆ Example
  - Average car has 70 microprocessors and kilometers of wiring
  - Replace with a Faraday cage and a base-station?
- ◆ Move from event-driven computing to event-cum-time-driven computing
  - Cyberphysical systems
    - » Vehicular networks, Medical plug-n-play
- ◆ How to support delay guarantees?



# Backbone of Real-Time Scheduling: Liu-Layland ('73)

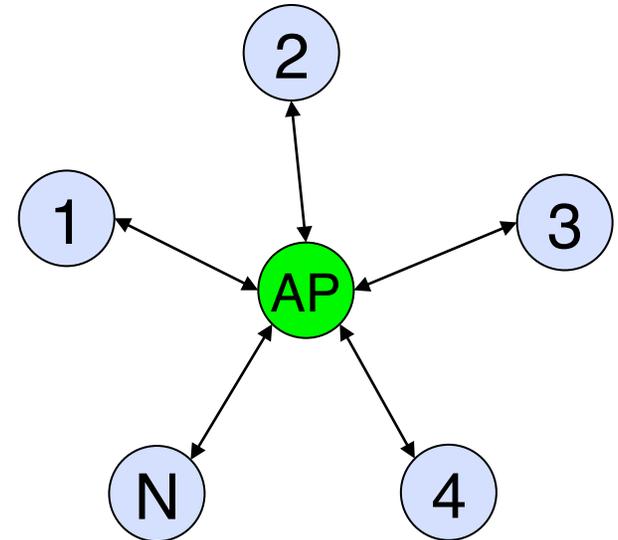
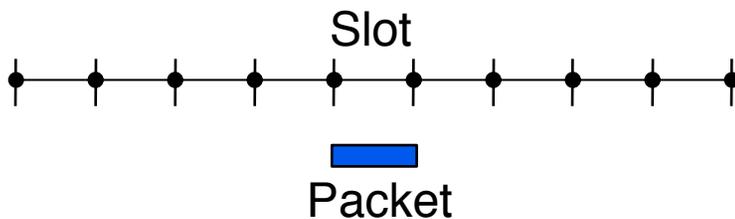


- ◆  $N$  tasks
  - Jobs of Task  $n$  arrive with period  $\tau_n$
  - Deadline is end of period
  - Worst case execution time  $c_n$
- ◆ Rate monotone scheduling: Priority to smallest period task
- ◆ All deadlines met if 
$$\sum_{n=1}^N \frac{c_n}{\tau_n} \leq N(2^{1/N} - 1) \quad (\rightarrow \ln 2 = 0.69 \text{ as } N \rightarrow \infty)$$
- ◆ If any priority policy can meet all deadlines, then this policy can



# Real-time communication: Client-Server model

- ◆ A wireless system with an Access Point serving  $N$  clients
- ◆ Time is slotted
- ◆ One slot = One packet



- ◆ AP indicates which client should transmit in each time slot

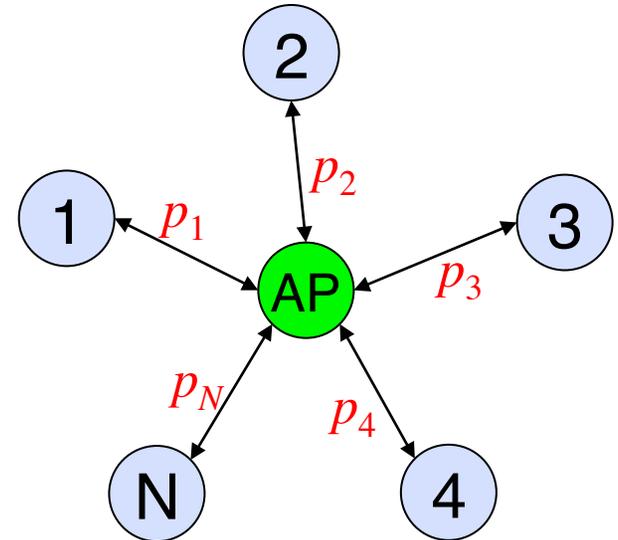


# Model of unreliable channels

- ◆ Unreliable channels

- ◆ Packet transmission in each slot

- Successful with probability  $p_n$
- Fails with probability  $1-p_n$
- So packet delivery time is a geometrically distributed random variable  $\gamma_n$  with mean  $1/p_n$

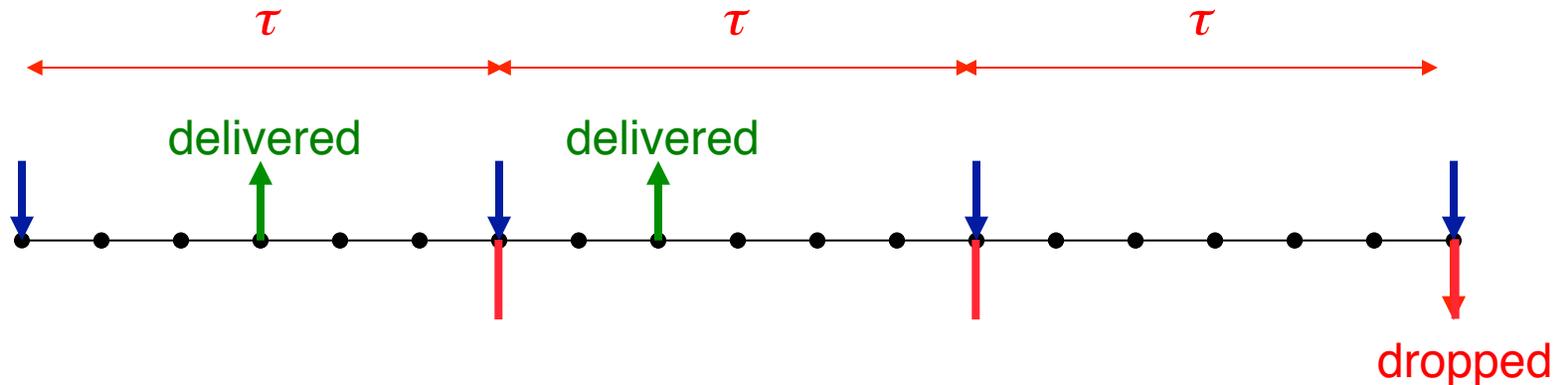


- ◆ Non-homogeneous link qualities

- $p_1, p_2, \dots, p_N$  can be different



# QoS model



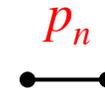
- ◆ Clients generate packets with fixed period  $\tau$
- ◆ Packets expire and are dropped if not delivered in the period
- ◆ Delay of successfully delivered packet is therefore at most  $\tau$
- ◆ Delivery ratio of Client  $n$  should be at least  $q_n$

$$\liminf_{T \rightarrow \infty} \frac{1}{T} \sum_{t=1}^T 1(\text{Packet delivered to Client } n \text{ in } t\text{-th period}) \geq q_n \quad a.s.$$

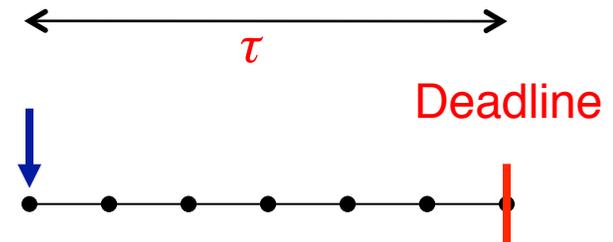


# Multiple-time scale QoS requirements

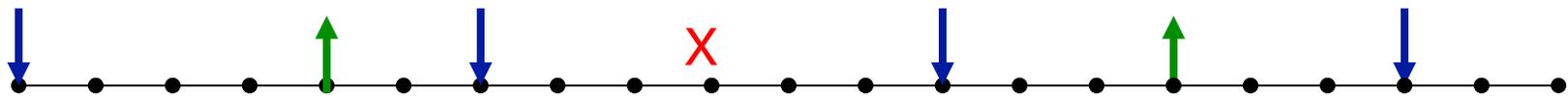
- ◆ Unreliable channels
  - Short time scale: Slots



- ◆ Arrivals and Deadlines
  - Medium time scale:
  - Period  $\tau$  arrivals
  - Relative Deadline  $\tau$



- ◆ Delivery ratio requirements
  - Long time scale:



$$\liminf_{T \rightarrow \infty} \frac{1}{T} \sum_{t=1}^T 1(\text{Packet of client } n \text{ delivered in } t\text{-th period}) \geq q_n \text{ a.s.}$$



# Feasibility of a set of clients



# Implied load

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- ◆ Load due to Client  $n$

$$w_n = \frac{q_n \cdot \frac{1}{p_n}}{\tau}$$

$$= \frac{E(\# \text{ deliveries per period}) \cdot E(\# \text{ slots per delivery})}{\# \text{ of slots of per period}}$$

- ◆ The proportion of time slots needed by Client  $n$  is

$$w_n = \frac{q_n}{p_n \tau}$$

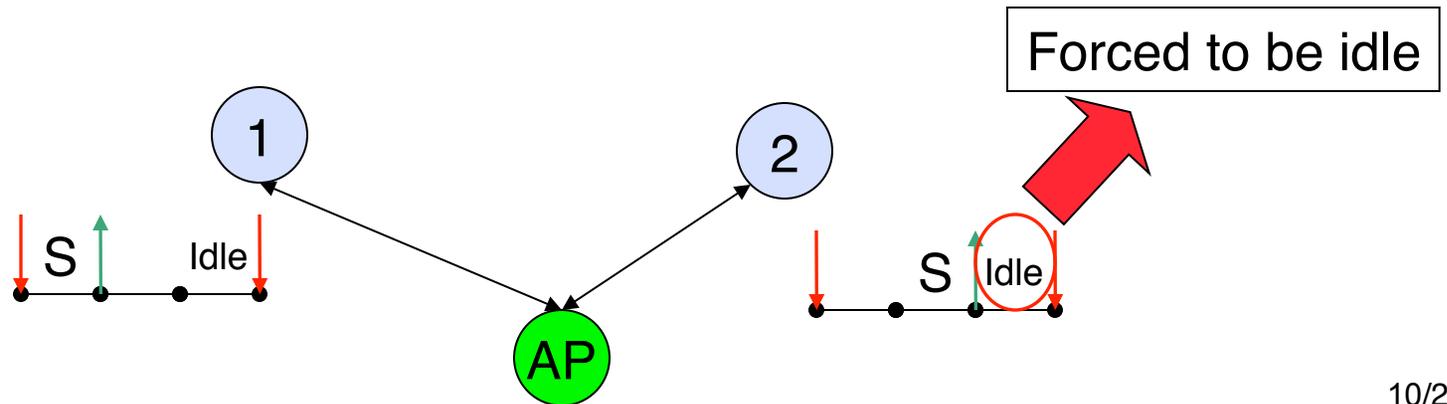


# Necessary condition for feasibility of QoS requirements

- ◆ Necessary condition from classical queueing theory

$$\sum_{n=1}^N w_n \leq 1$$

- ◆ **But not sufficient**
- ◆ Reason: Unavoidable idle time
  - No queueing: At most one packet





# Stronger necessary condition

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- ◆ Let  $I(1, 2, \dots, N) :=$  Unavoidable idle time after serving  $\{1, 2, \dots, N\}$

$$I(1, 2, \dots, N) = \frac{1}{\tau} E \left[ \left( \tau - \sum_{n=1}^N \gamma_n \right)^+ \right] \text{ where } \gamma_n \sim \text{Geom}(p_n)$$

- ◆ Stronger necessary condition

$$\sum_{n=1}^N w_n + I(1, 2, \dots, N) \leq 1$$

- ◆ Sufficient?
- ◆ **Still not sufficient!**



# Counterexample

- ◆ Two clients: Period  $\tau = 3$

- ◆ Client 1

- $p_1 = 0.5$
- $q_1 = 0.876$

- $w_1 + I_1 = 3.002/3 > 1$  ✗

$$w_1 = \frac{q_1}{p_1 \tau} = \frac{1.752}{3}$$

$$I_1 = \frac{(2p_1 + (1 - p_1)p_1)}{3} = \frac{1.25}{3}$$

- ◆ Client 2

- $p_2 = 0.5$
- $q_2 = 0.45$

- $w_2 + I_2 = 2.15/3 < 1$  ✓

$$w_2 = \frac{q_2}{p_2 \tau} = \frac{0.9}{3}$$

$$I_2 = \frac{1.25}{3}$$

- ◆ Clients {1,2}

- $w_1 + w_2 + I_{\{1,2\}} = 2.902/3 < 1$  ✓

$$w_{\{1,2\}} = w_1 + w_2 = \frac{2.652}{3}$$

$$I_{\{1,2\}} = \frac{p_1 p_2}{3} = \frac{0.25}{3}$$



# Even stronger necessary condition

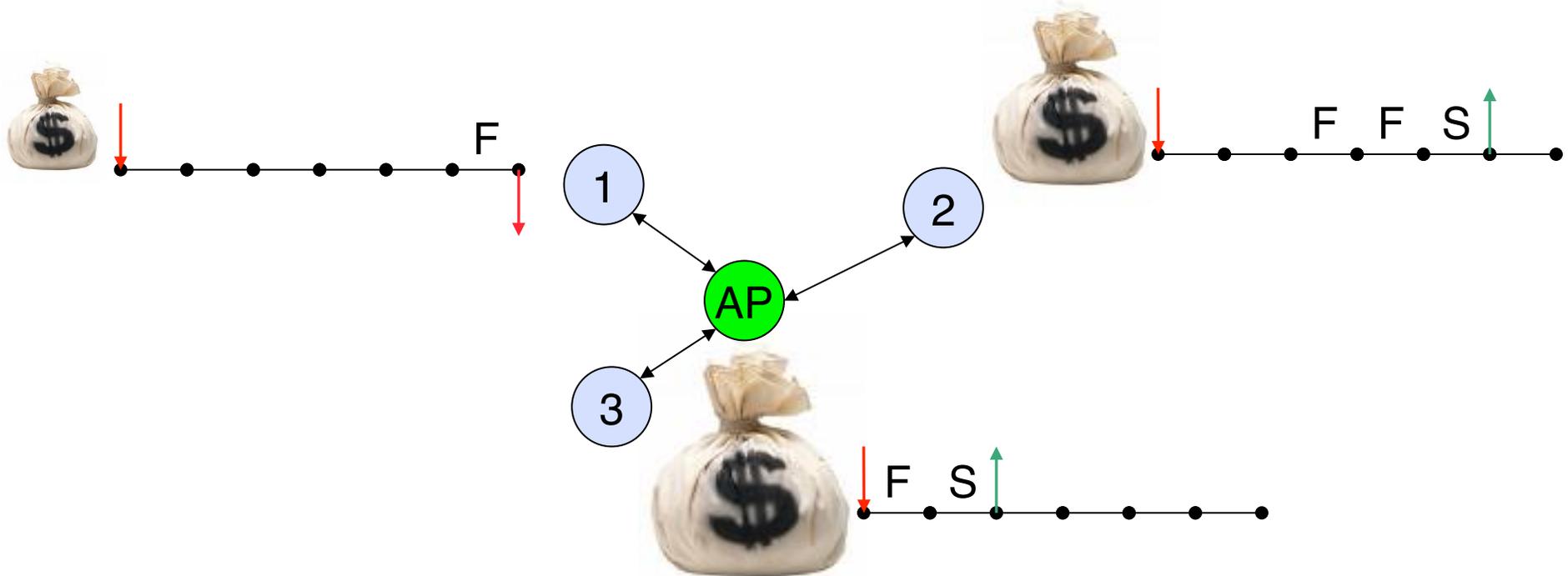
- ◆ Every *subset* of clients  $S \subseteq \{1, 2, \dots, N\}$  should also be feasible
- ◆ Let  $I(S) := \frac{1}{\tau} E \left[ \left( \tau - \sum_{n \in S} \gamma_n \right)^+ \right]$  = Idle time if only serving  $S$
- ◆ Stronger necessary condition:  $\sum_{n \in S} w_n + I(S) \leq 1, \forall S \subseteq \{1, 2, \dots, N\}$
- ◆ Not enough to just evaluate for the whole set  $\{1, 2, \dots, N\}$
- ◆ **Theorem (Hou, Borkar & K '09)**  
Condition is necessary and sufficient for a set of clients to be feasible



# Scheduling policy



# Debt-based scheduling policies



- ◆ Compute “debt” owed to each client at beginning of period
- ◆ A client with higher debt gets a higher priority on that period



# Two definitions of debt

- ◆ The **time debt** of Client  $n$



$$= (w_n - \text{Actual proportion of transmission slots given to Client } n)$$

- ◆ The **weighted delivery debt** of Client  $n$



$$= \frac{q_n - \text{Actual delivery ratio of Client } n}{P_n}$$

- ◆ **Theorem (Hou, Borkar & K '09)**

Both largest debt first policies fulfill every set of clients that can be fulfilled



# Utility maximization framework and solution



# Utility maximization

- ◆ Client  $n$  has a utility function  $U_n(q_n)$ 
  - $U_n$  positive, str incr, str concave,  $U_n(0) =$  right limit ...
- ◆ Maximize the total utility

## ◆ SYSTEM

$$\text{Max } \sum_n U_n(q_n)$$

$$\text{s.t. } \sum_{n \in S} \frac{q_n}{\tau p_n} \leq 1 - I_S, \forall S$$

$$\text{over } q_n \geq 0$$

Solving SYSTEM directly is difficult

Clients may have different utility functions  $U_n$

$2^N$  feasibility constraints

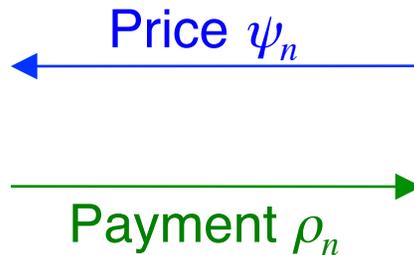


# Two sub-problems

*Considers own utility function*

*Considers feasibility*

**Client  $n$**

$$\text{Max}_{0 \leq \rho_n \leq \psi_n} U_n \left( \frac{\rho_n}{\psi_n} \right) - \rho_n$$


**Access Point**

$$\text{Max}_{\{q_n\} \text{ feasible}} \sum_{n=1}^N \rho_n \log q_n$$

**Achieved by**  
**Weighted Transmission Time Policy**  
 Give priority to lowest  $u_n(t)/\rho_n$   
 $u_n(t)$  = Number of slots in  $[0, t]$  given to Client  $n$

Is weighted max-min fair  
 And weighted proportionally fair

- ◆ Nobody needs to know the channel reliability  $p_n$

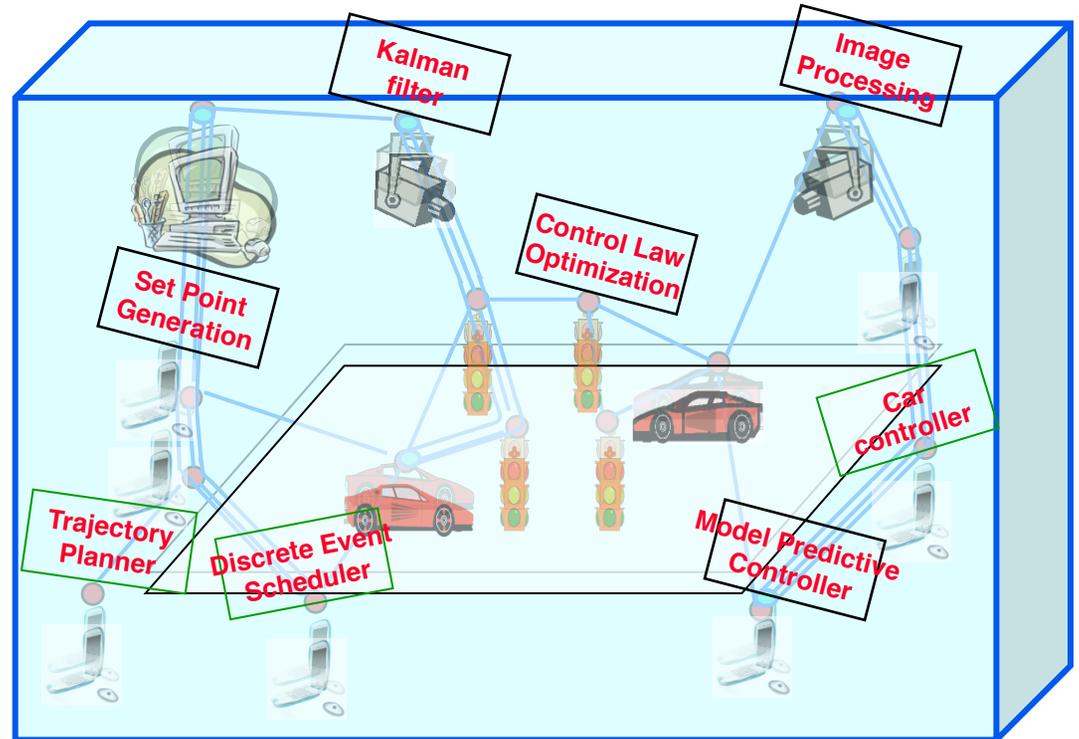
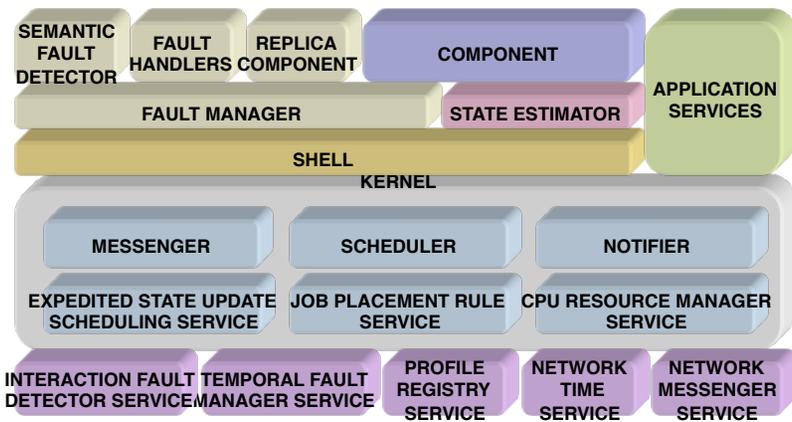
(Hou & K '09)



# Networked control



# Real-time middleware for control

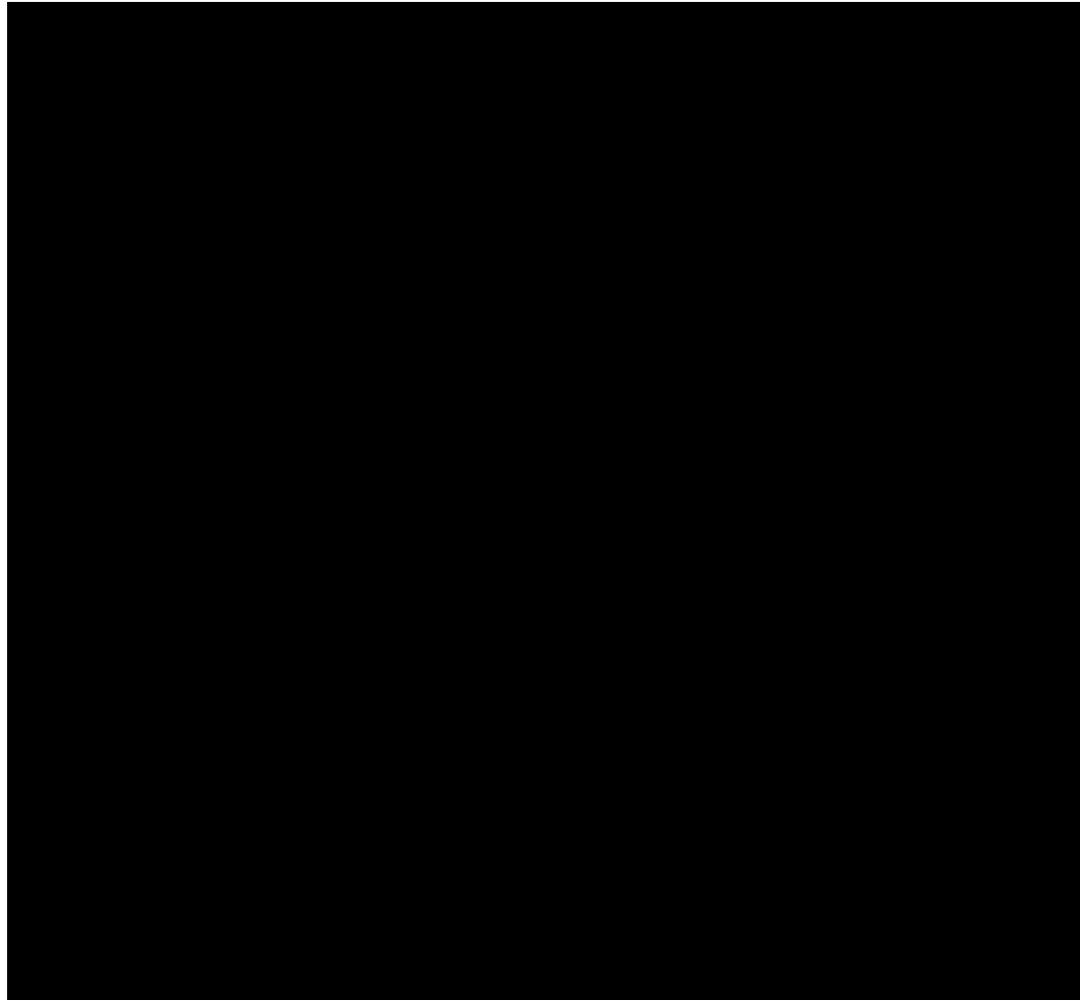


(Baliga, Graham, & K '05  
And  
Kim & K '08)



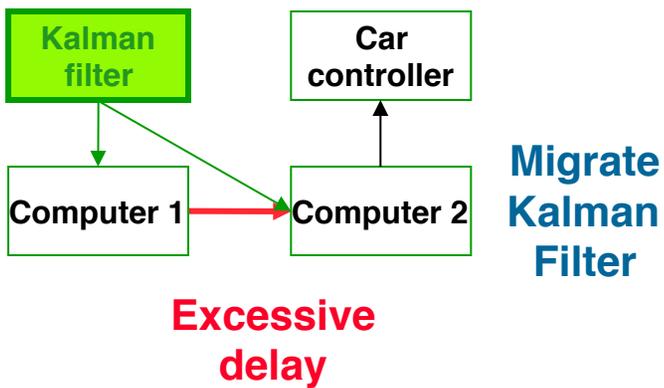
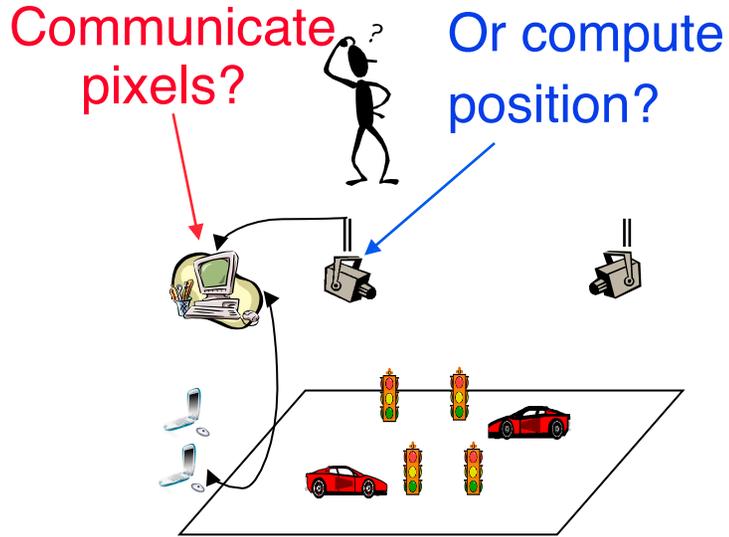
# Collision avoidance (Schuetz, Robinson & K '05)

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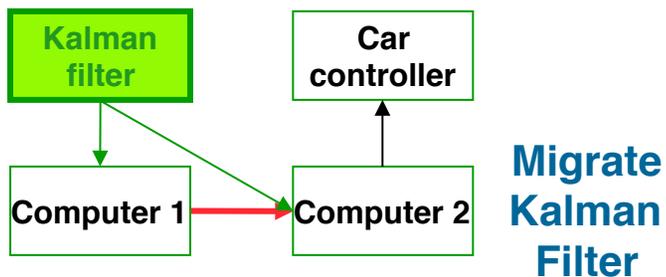
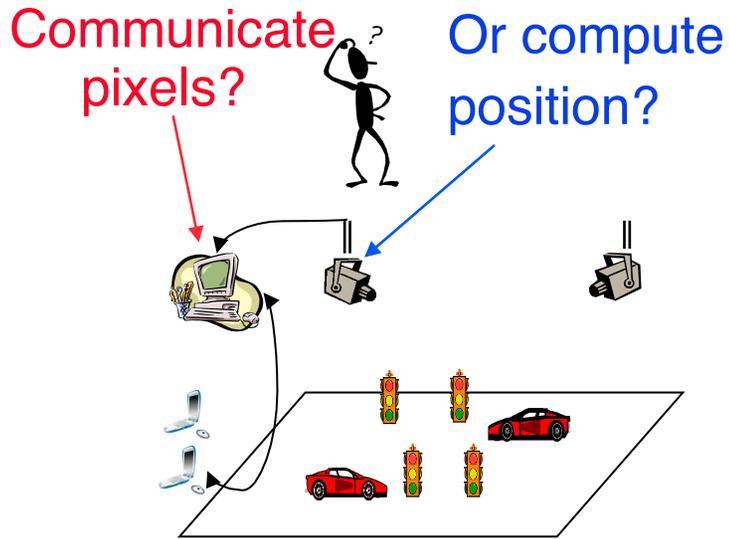


# Example of capabilities: Component migration





# Example of capabilities: Component migration



Excessive delay



Real-time middleware



Thank you



# References

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Thank you