

# Real-time Adaptive Traffic Management

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## Goals

- Reliability:
  - Detection of fault conditions
  - Response to failure in the network
  - Network-wide reconvergence
- Performance and Efficiency:
  - Loss rate
  - Latency
  - Jitter
  - Link utilization

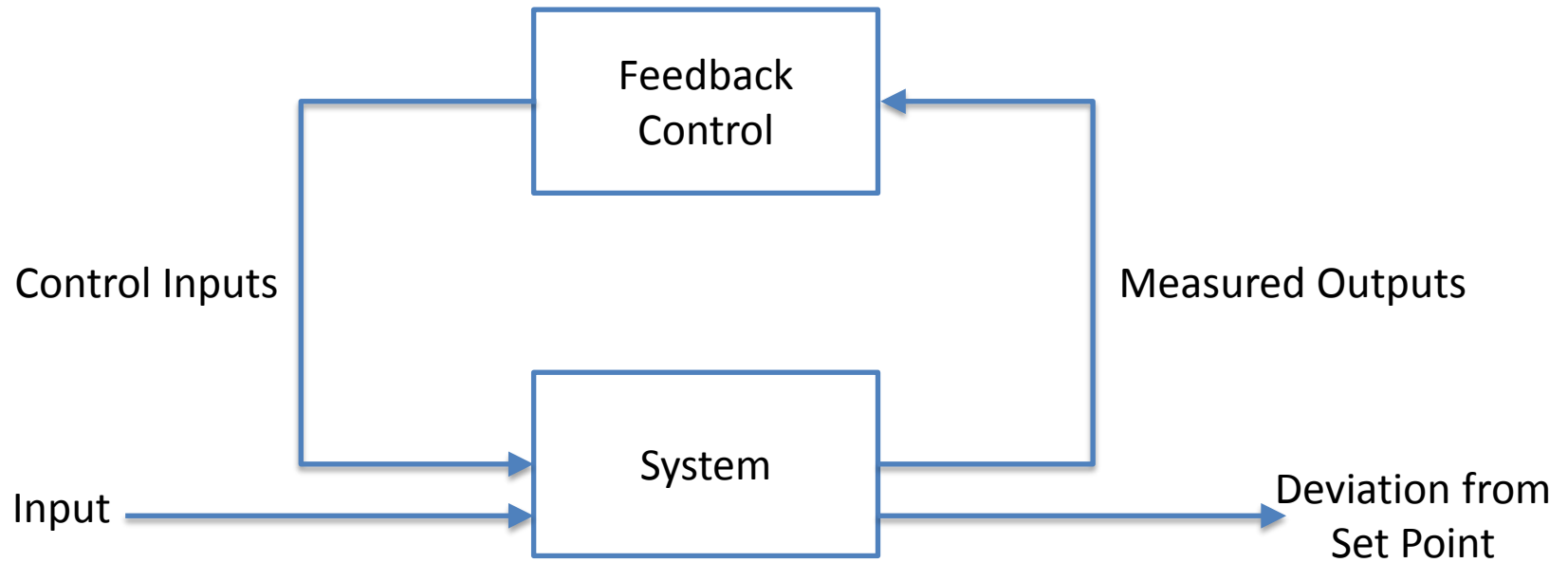
## Approaches

- Static: significantly over-provisioning, huge redundancy
  - Conservative
  - Low average resource utilization

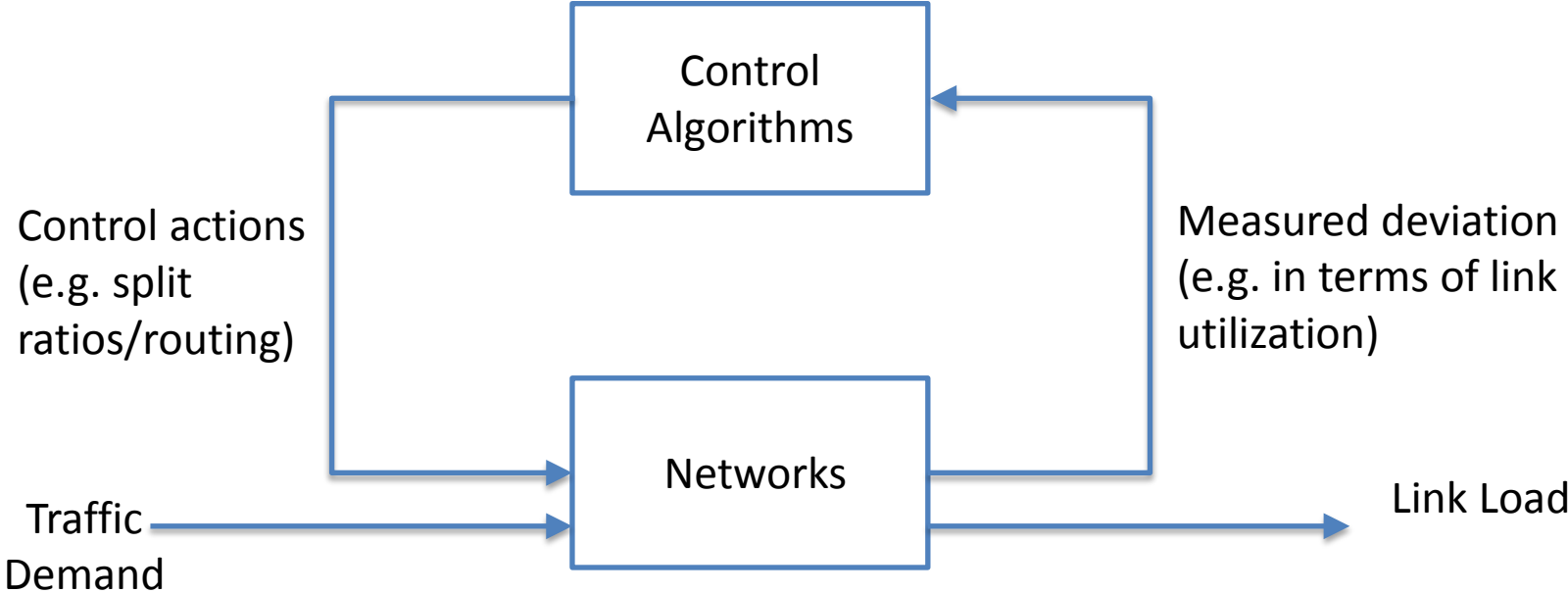
“WAN bandwidth remains a constrained resource that is economically infeasible to substantially overprovision” ---- BwE paper from Google, Sigcomm 2015

- Responsive: real-time adaptive traffic management
  - Update network configurations at a fast timescale
  - Best handle current demand given resource supply available
  - Adaptively balance the load among multiple paths
  - Adaptively use rate control to coordinate among different buffers

# Feedback Control System



# Feedback Control System



# Modeling of Dynamics

- Level I: Static with out delay

$$y(t) = \alpha (t)x(t)$$

- Level II: Delay is included

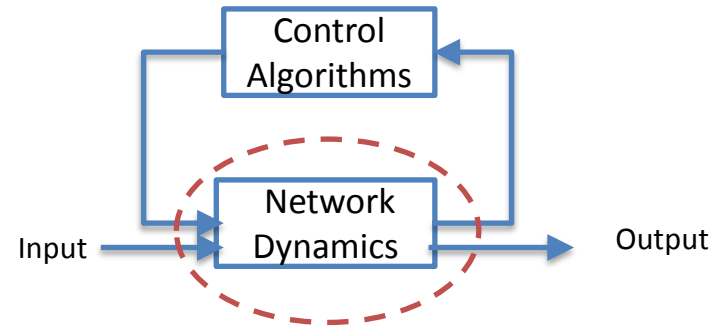
$$y(t) = \alpha(t)x(t - \tau)$$

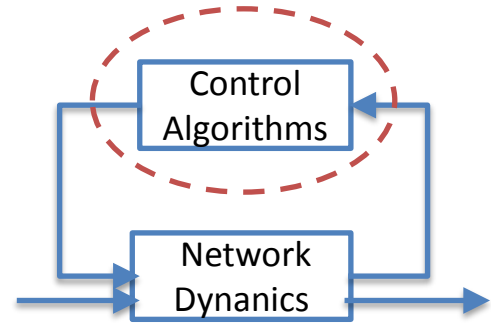
- Level III: A very detailed dynamic model at fast timescale

$$\dot{B}_l(t) = \left( \frac{f_l(t) - c_l}{c_l} \right)_{B_l(t)}^+ = \begin{cases} \frac{f_l(t) - c_l}{c_l}, & B_l(t) > 0 \\ \max\left(0, \frac{f_l(t) - c_l}{c_l}\right), & B_l(t) = 0 \end{cases}$$

$$g_l(t) = f_l(t) - (f_l(t) - c_l)_{B_l(t)}^+ = \begin{cases} c_l, & B_l(t) > 0 \\ \max(f_l(t), c_l), & B_l(t) = 0 \end{cases}$$

$$\sum_p g_{lp}(t) = g_l(t), \quad g_{kp}(t - t_k - t_v) = f_{lp}(t), \quad \sum_p f_{lp}(t) = f_l(t)$$





# Control Algorithms

- MPLS: Path-based –
  - MATE: based on an estimate of LSP lengths by averaging over the past values (A. Elwalid et al 2001)

$$\begin{aligned}
 x_s(t+1) &= [x_s(t) - \gamma \lambda_s(t)]^+ \\
 \hat{x}^l(t) &= \sum_{t'=t-t_0}^t \sum_s \sum_{l \in p, p \in P_s} a_{lsp}(t', t) x_{sp}(t'), \quad \sum_{t'=t-t_0}^t a_{lsp}(t', t) = 1 \\
 \lambda_{sp}(t) &= \sum_{t'=t-t_0}^t \sum_{l \in p} b_{lsp}(t', t) C_l'(\hat{x}^l(t')), \quad \sum_{t'=t-t_0}^t b_{lsp}(t', t) = 1
 \end{aligned}$$

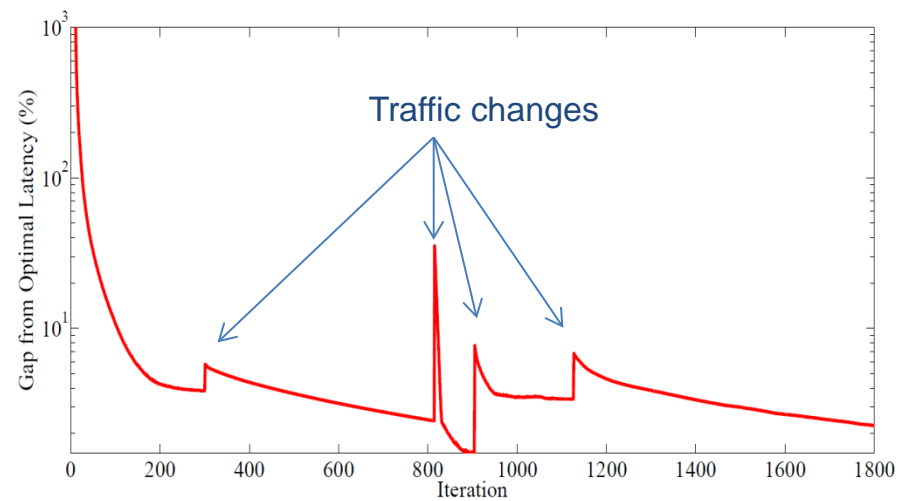
- TeXCP: calculate new split ratios based on normalized average utilization (S. Kandula et al 2005)

$$\Delta x_{sp} = \begin{cases} \frac{r_{sp}}{\sum_{p'} r_{sp'}} (\bar{u}_s - u_{sp}), & u_{sp} > u_{min} \\ \frac{r_{sp}}{\sum_{p'} r_{sp'}} (\bar{u}_s - u_{sp}) + \epsilon, & u_{sp} = u_{min} \end{cases}$$

- IP: Hop-by-hop -- HALO: calculate split ratios based on current link rates (N. Michael et al 2015)

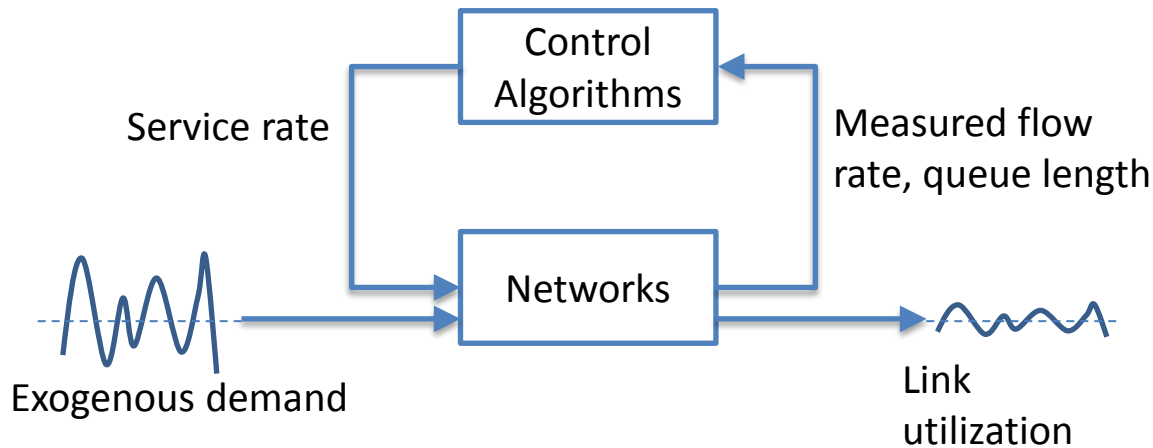
$$\hat{\alpha}_{u,v}^t = \begin{cases} -\frac{\alpha_{u,v}^t \delta}{\eta_u^t r_u^t}, & (u, v) \text{ not on shortest path} \\ -\sum_{v' \neq v} \hat{\alpha}_{u,v'}^t, & \text{otherwise} \end{cases}$$

# Case Study 1: HALO - Hop-by-hop Adaptive Link-state Optimal



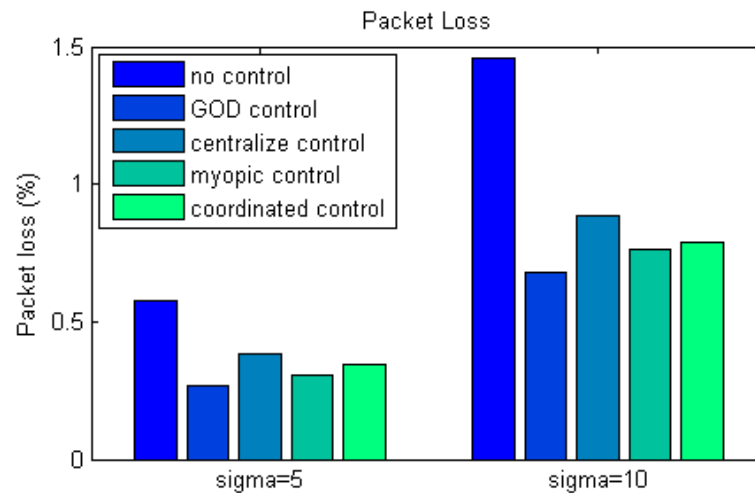
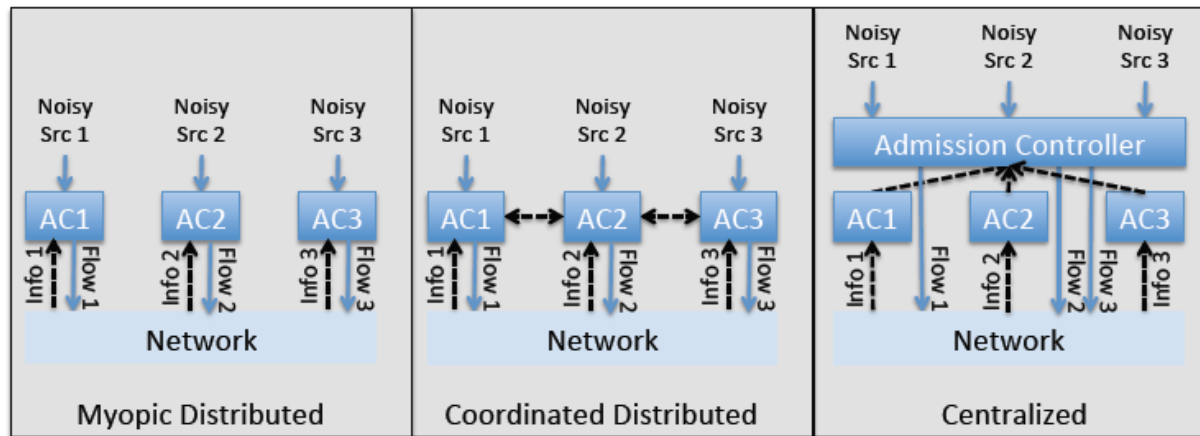


## Case Study 2: HFTrac - High Frequency Traffic Control



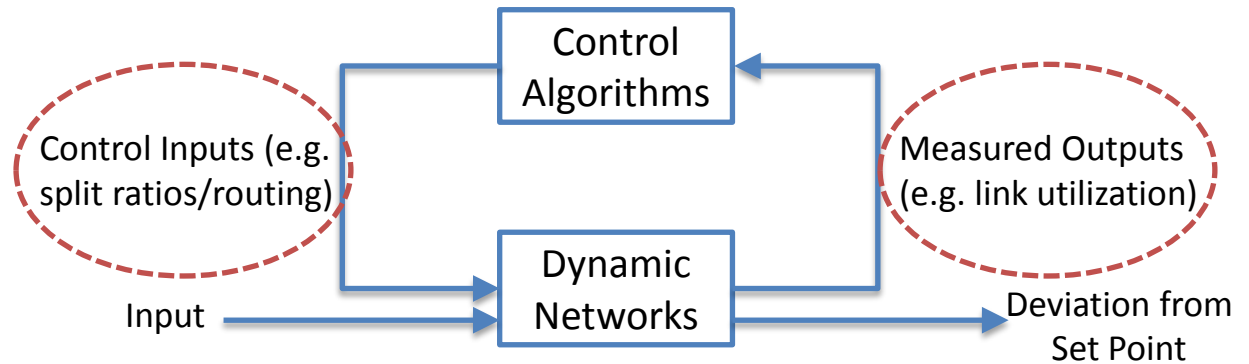
	Traffic Engineering	HFTrac
Input	Average of Demand	Fluctuation of Demand
Output	Flow Routes	Service Rate
Resource	Link Bandwidth	Node Buffer
Timescale	Minutes to Hours	RTT (Milliseconds)

# A good chance to have some rigorous discussion on architectures



## Some Future Questions

- How to measure?
  - Time interval
  - Accuracy
  - Overhead
- How to control?
  - Granularity
  - Over commodity switches
- Good Control law with delay: develop proper (approximate) dynamics model, fast tracking with stability margin (both can be quantified)



It is time to bring real-time automatic control to network traffic management!