



# QoS Amplification Research

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Network Systems Lab

# Overview

Goal Achieve QoS amplification over imperfect network service substrate

→ end-to-end control & per-hop control

- ◆ End-to-end QoS amplification
  - Multiple time scale traffic control
  - Adaptive redundancy control
  - Adaptive label control
- ◆ Per-hop QoS amplification
  - Aggregate-flow label switching
  - Optimal classifiers
  - WAN experiments and collaborations

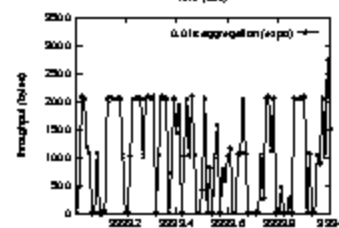
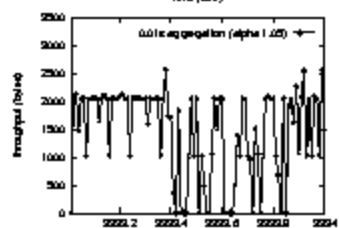
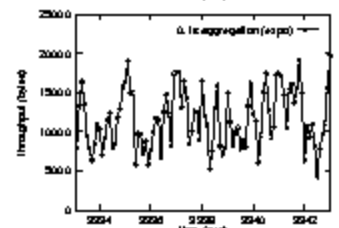
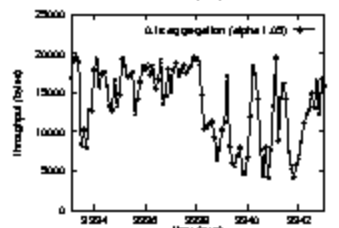
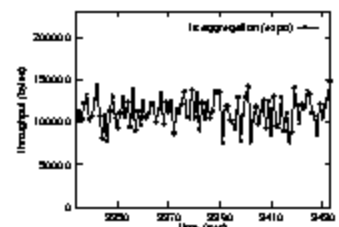
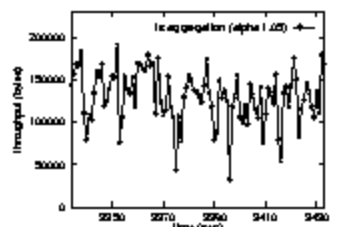
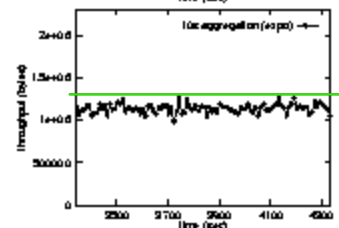
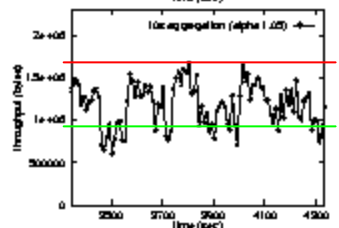
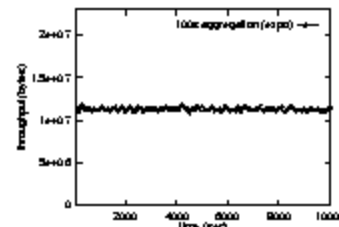
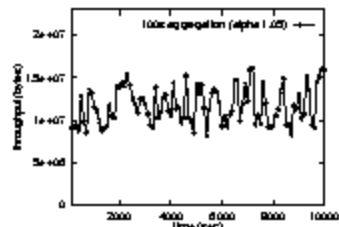
Outline

# Multiple Time Scale Traffic Control

## Self-similar Network Traffic

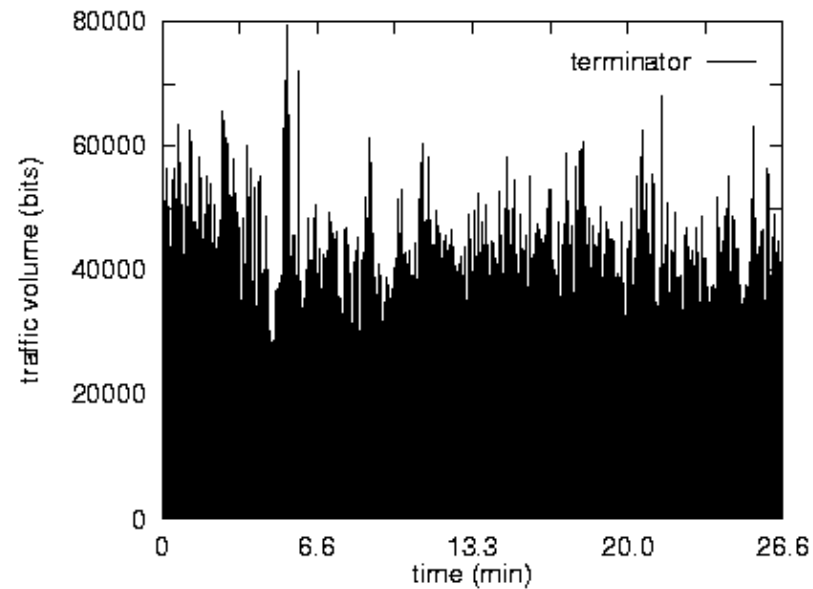
- ◆ Data traffic is fundamentally different from telephony traffic (Leland *et al.* '93)
  - self-similar or long-range dependent
- ◆ Causality
- ◆ Performance Impact
- ◆ Control

*Self-similar Network Traffic and Performance Evaluation*,  
Park and Willinger (eds.), Wiley-Interscience, 2000



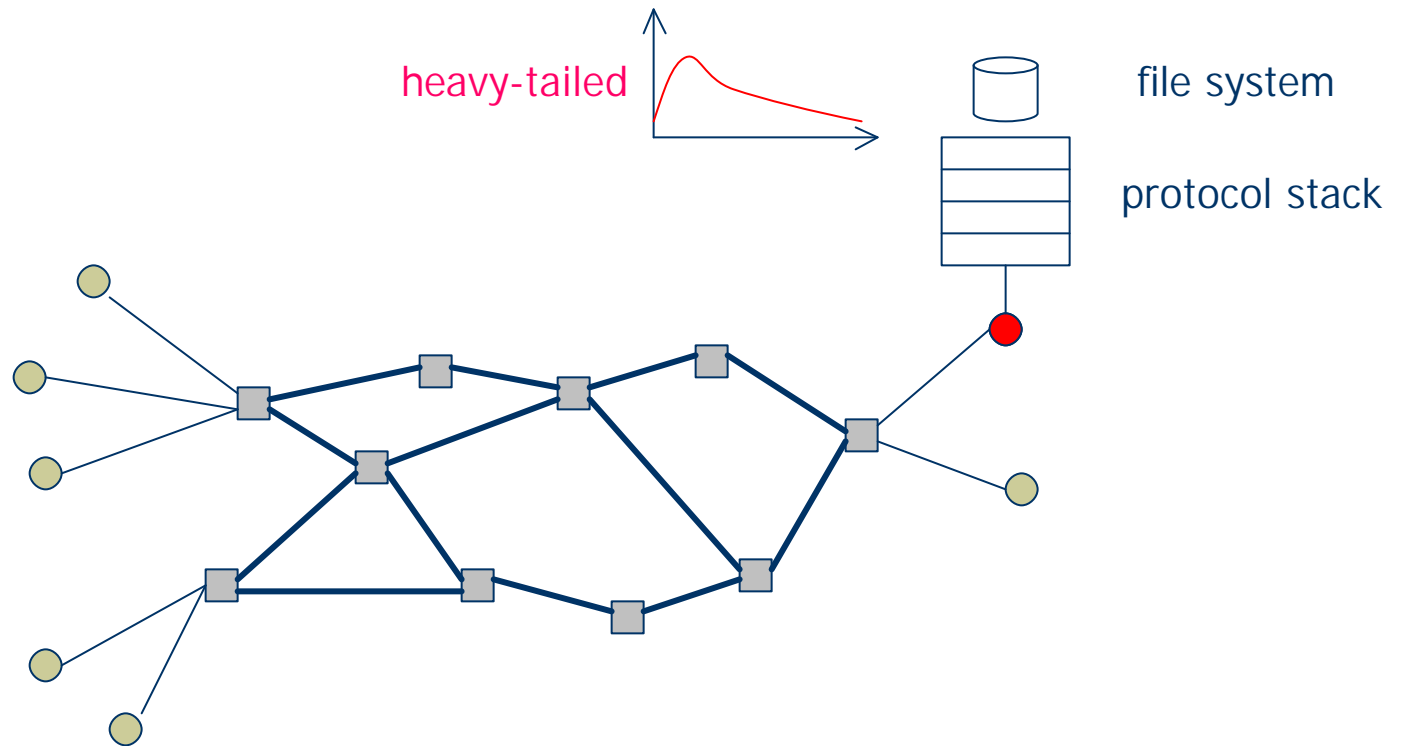
## Multiple Time Scale (cont.)

- ◆ Causality
  - Single-source causality (e.g., MPEG video)



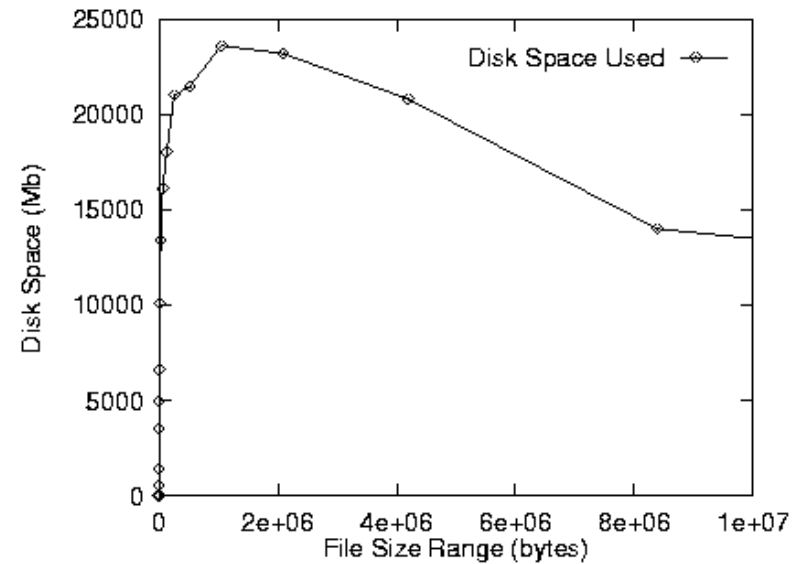
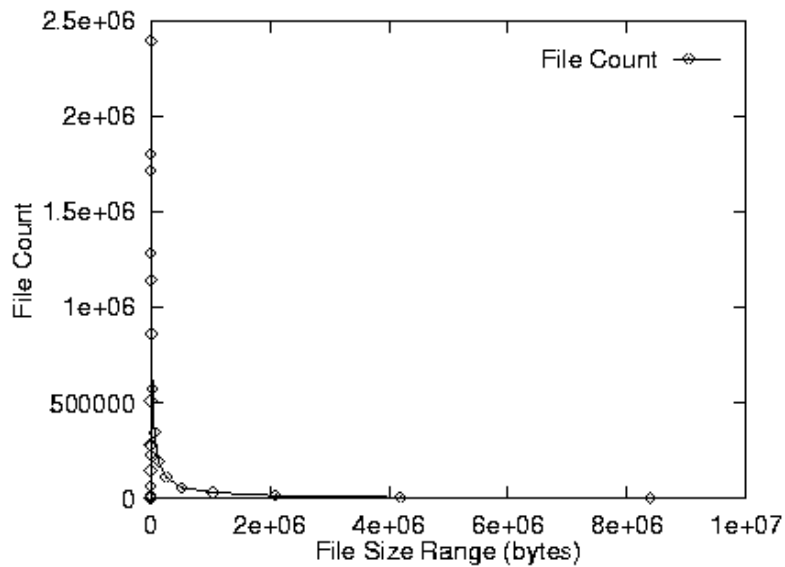
# Multiple Time Scale (cont.)

- Structural causality



# Multiple Time Scale (cont.)

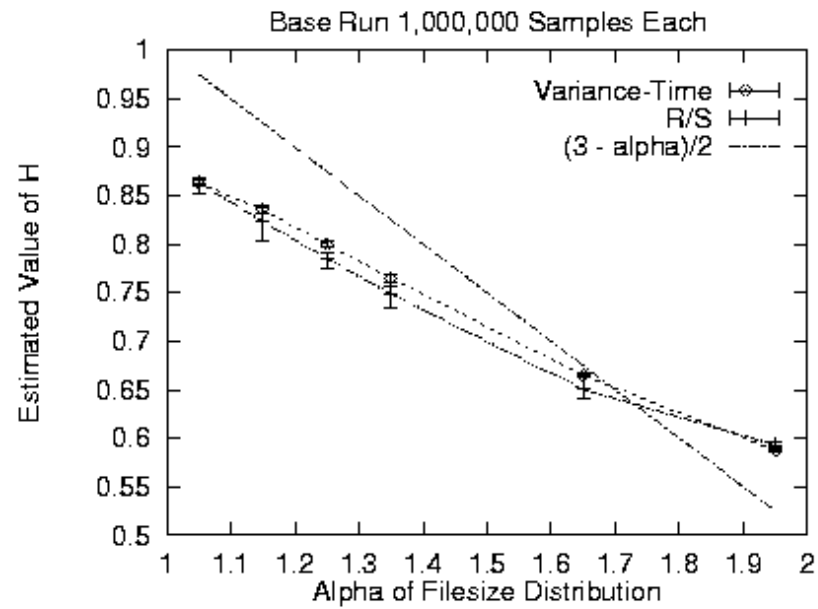
- Structural causality (cont.)



→ UNIX file system (G. Irlam)

# Multiple Time Scale (cont.)

- Structural causality (cont.)

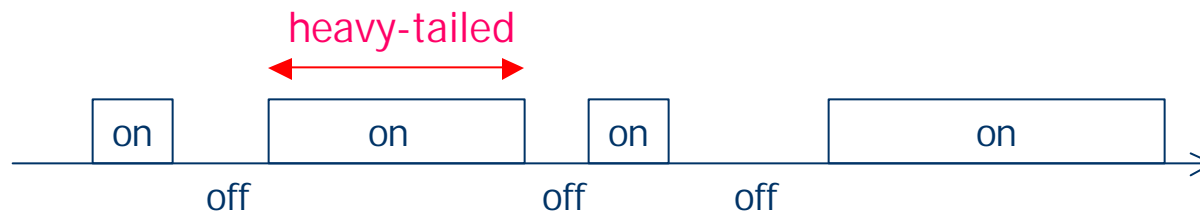


→ impervious to “details”



## Multiple Time Scale (cont.)

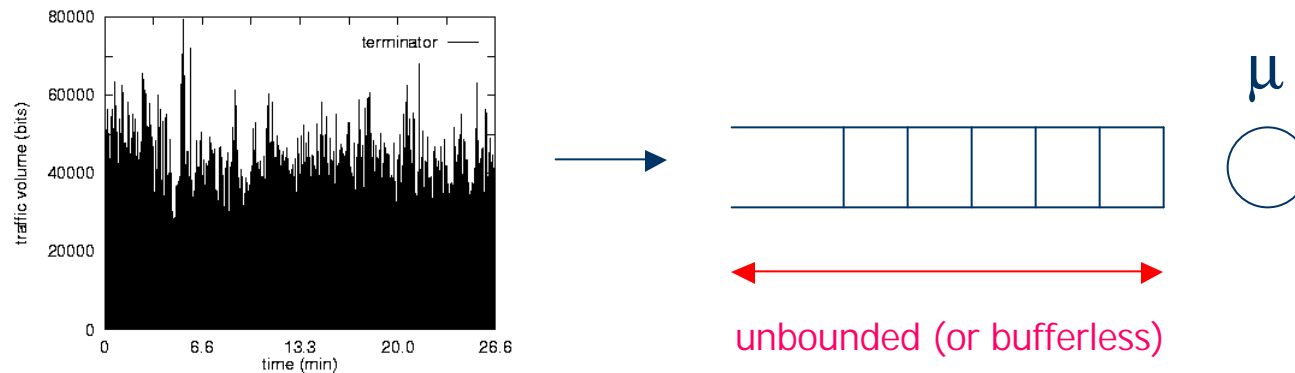
- Structural causality (cont.)



- on/off traffic (0/1 reward renewal process)
  - asymptotic second-order self-similarity
- Two principal traits
    - Invariant correlation structure across multiple time scales
    - Correlation at a distance (long-range dependence)

## Multiple Time Scale (cont.)

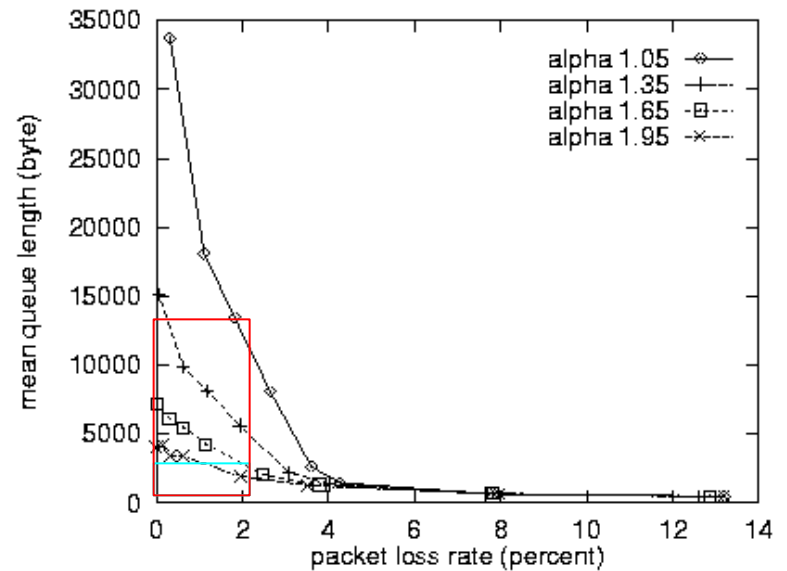
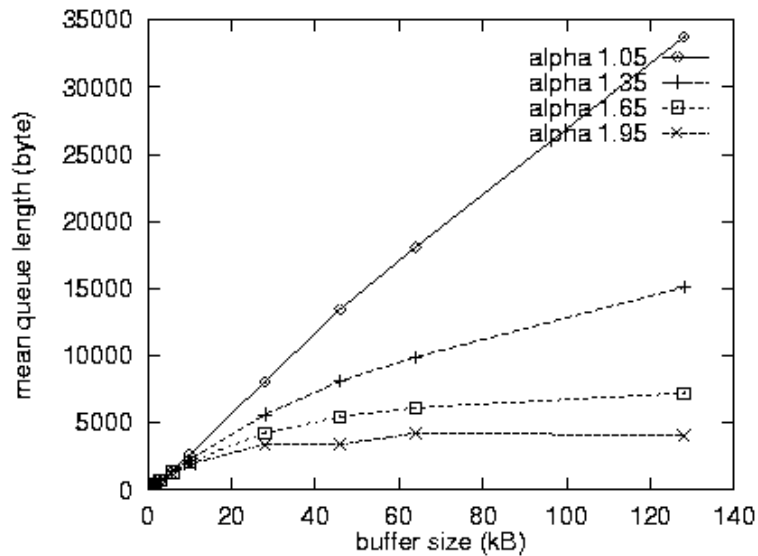
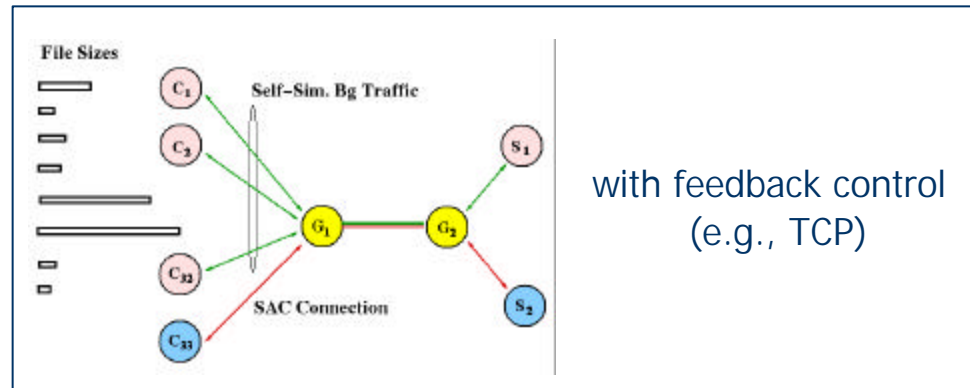
- ◆ Detrimental performance impact: queueing



- polynomial (vs. exponential) queue length distribution
- infinite memory/asymptotic analysis

# Multiple Time Scale (cont.)

## ◆ Empirical validation



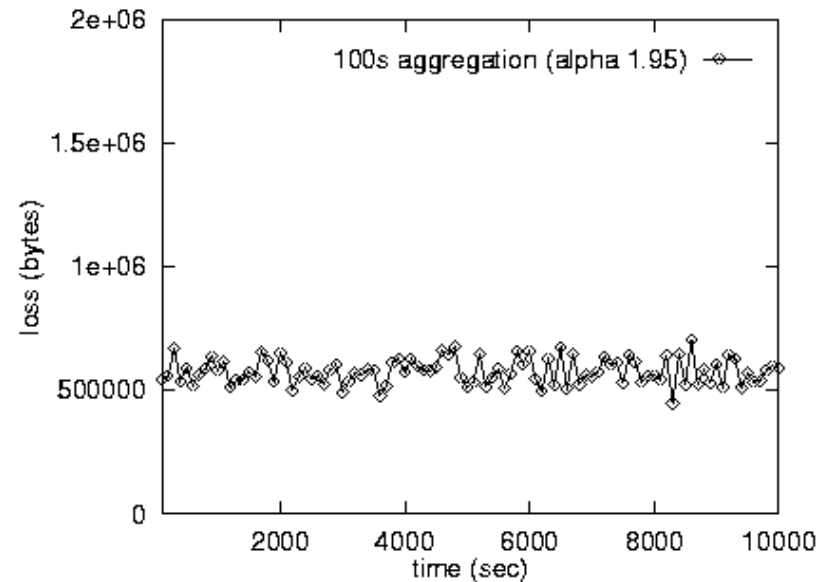
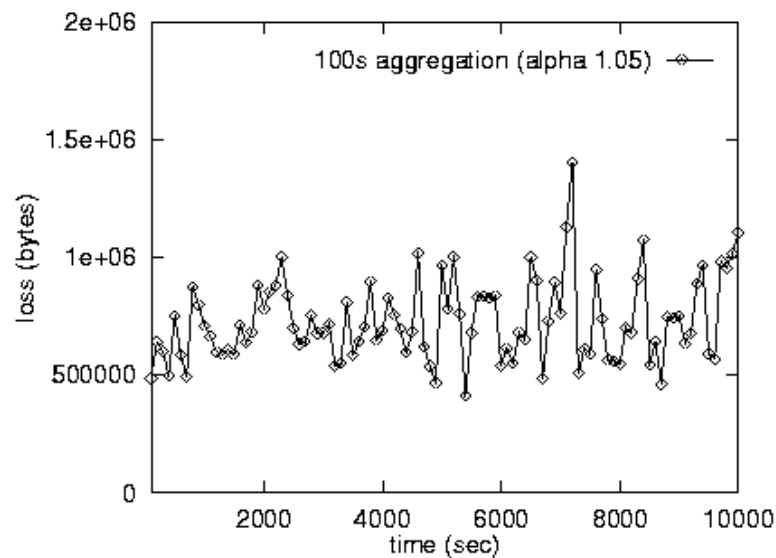


## Multiple Time Scale (cont.)

- ◆ Impact of long-range structure can be curtailed
  - extreme: **bufferless** queueing
  - time horizon implied by finite memory
  - short-range correlation can dominate
- ◆ Small buffer/large bandwidth resource provisioning policy
  - statistical multiplexing
  - central limit theorem

## Multiple Time Scale (cont.)

- ◆ Importance of second-order performance measures  
→ e.g., jitter

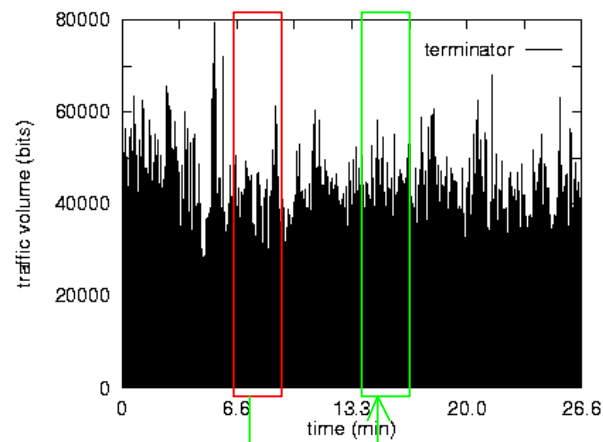


- concentrated periods of over- and under-utilization
- bufferless queueing does not help

# Multiple Time Scale Traffic Control (cont.)

## Traffic Control

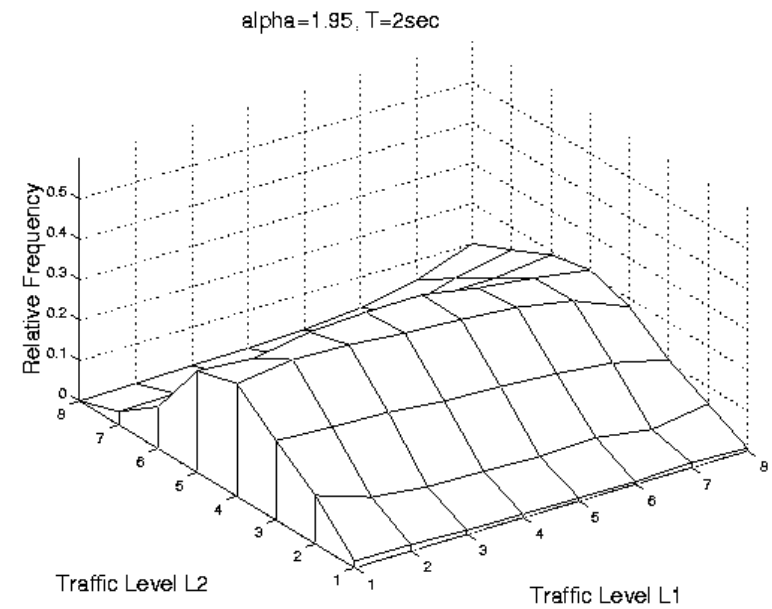
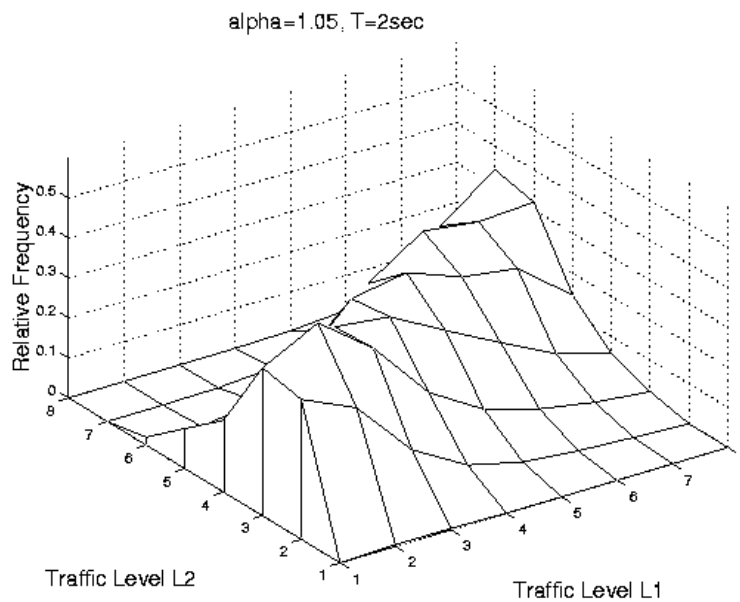
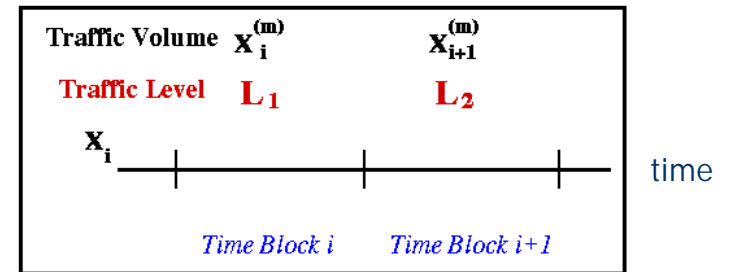
- ◆ Premise: exploit long-range correlation for traffic control
  - correlation/predictability structure at large time scales



- relevant in broadband WANs with high delay-bandwidth product

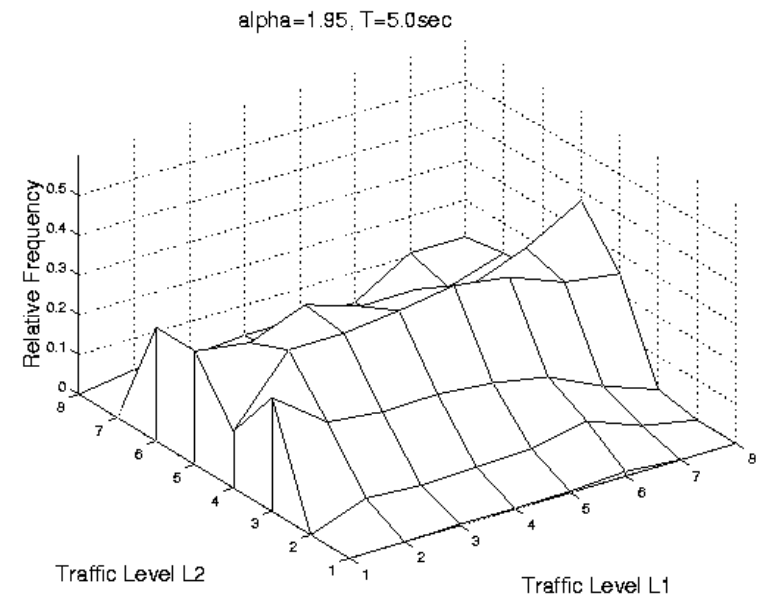
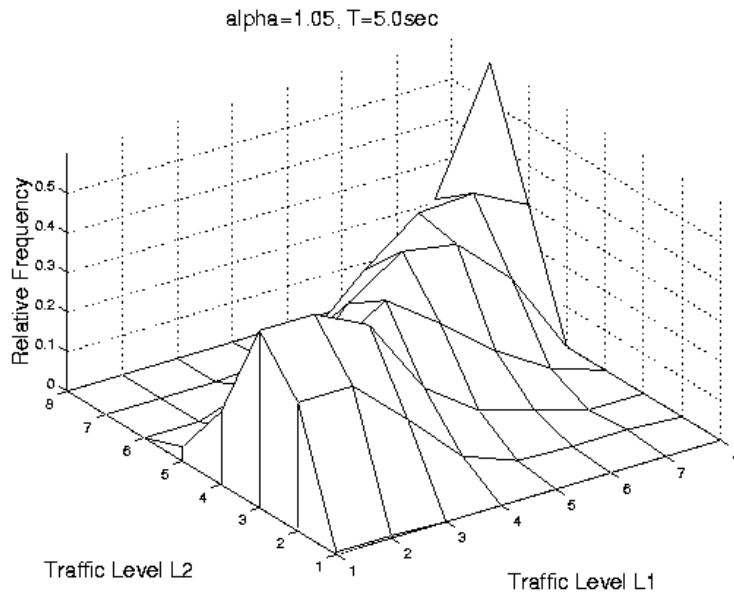
# Multiple Time Scale Traffic Control (cont.)

Large time scale predictability:



# Multiple Time Scale Traffic Control (cont.)

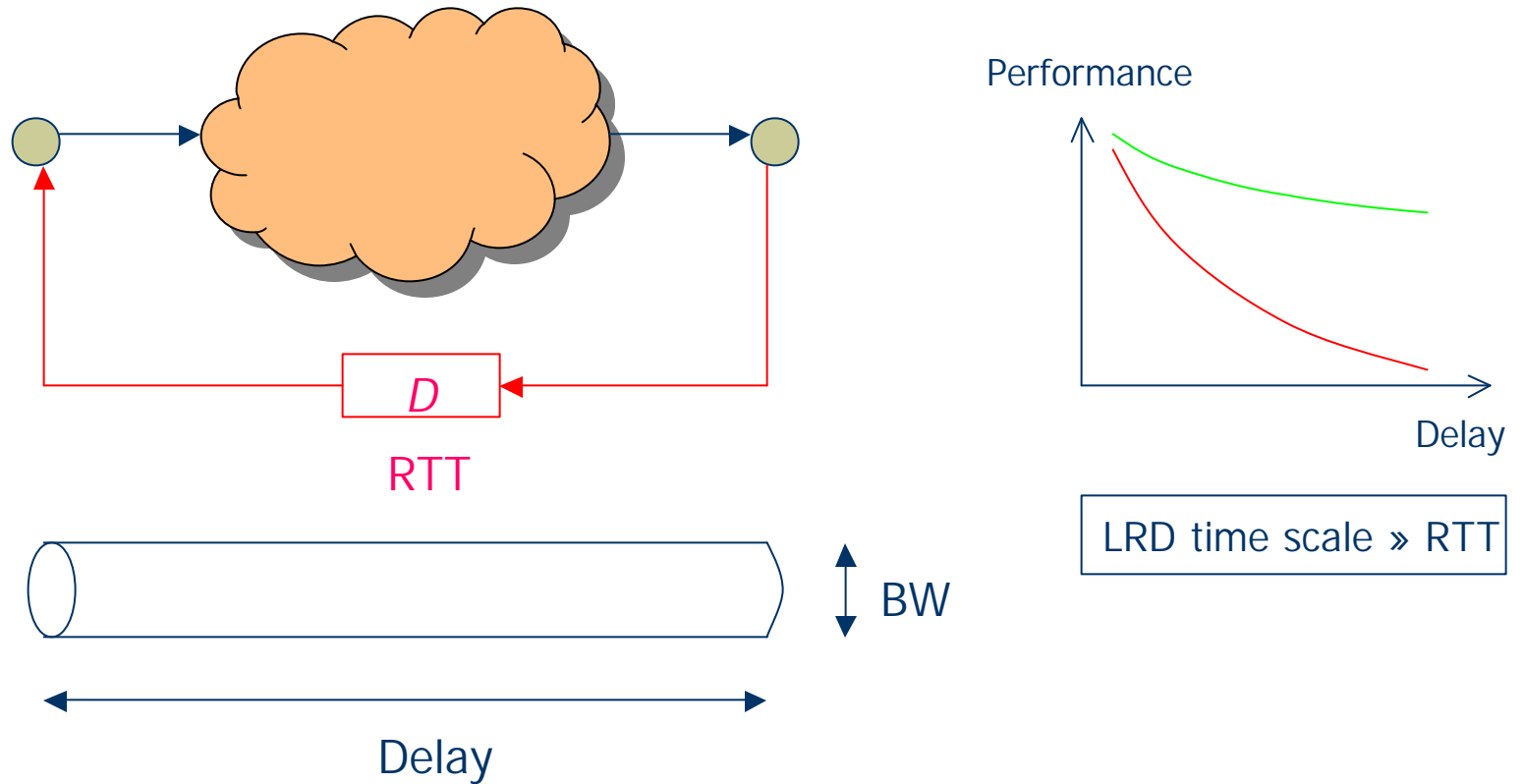
Large time scale predictability (5 sec):





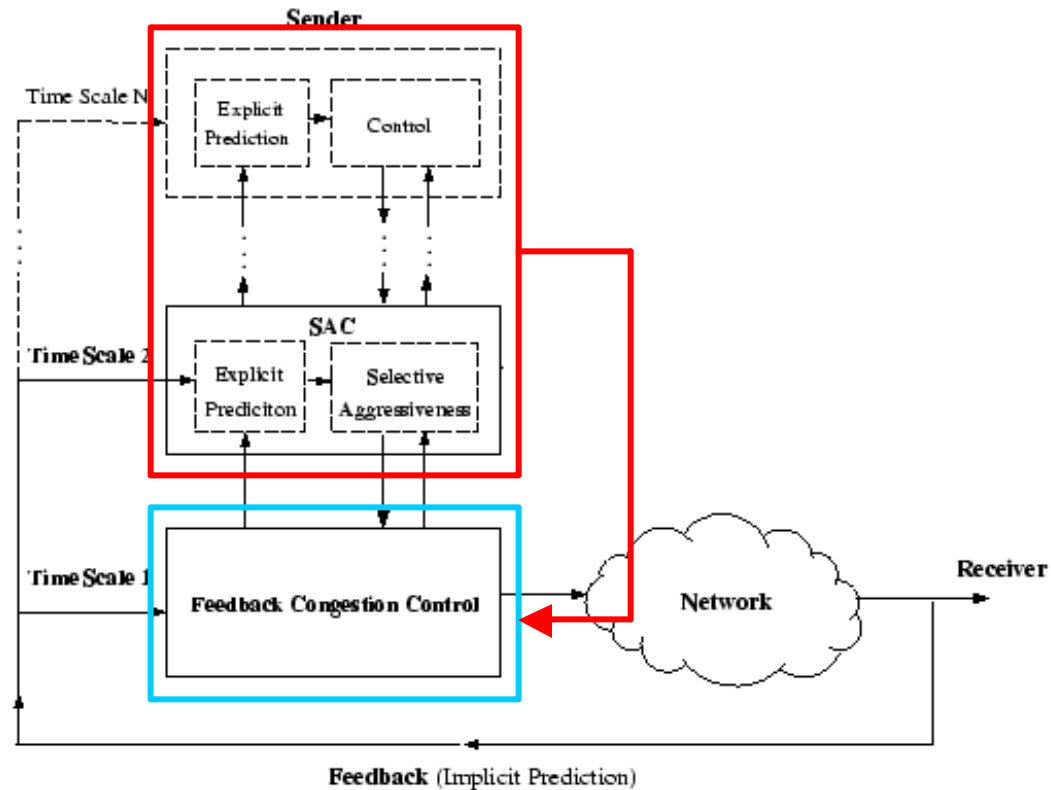
# Multiple Time Scale Traffic Control (cont.)

- ◆ Implications: mitigate reactive cost of feedback control



# Multiple Time Scale Traffic Control (cont.)

Multiple time scale traffic control:





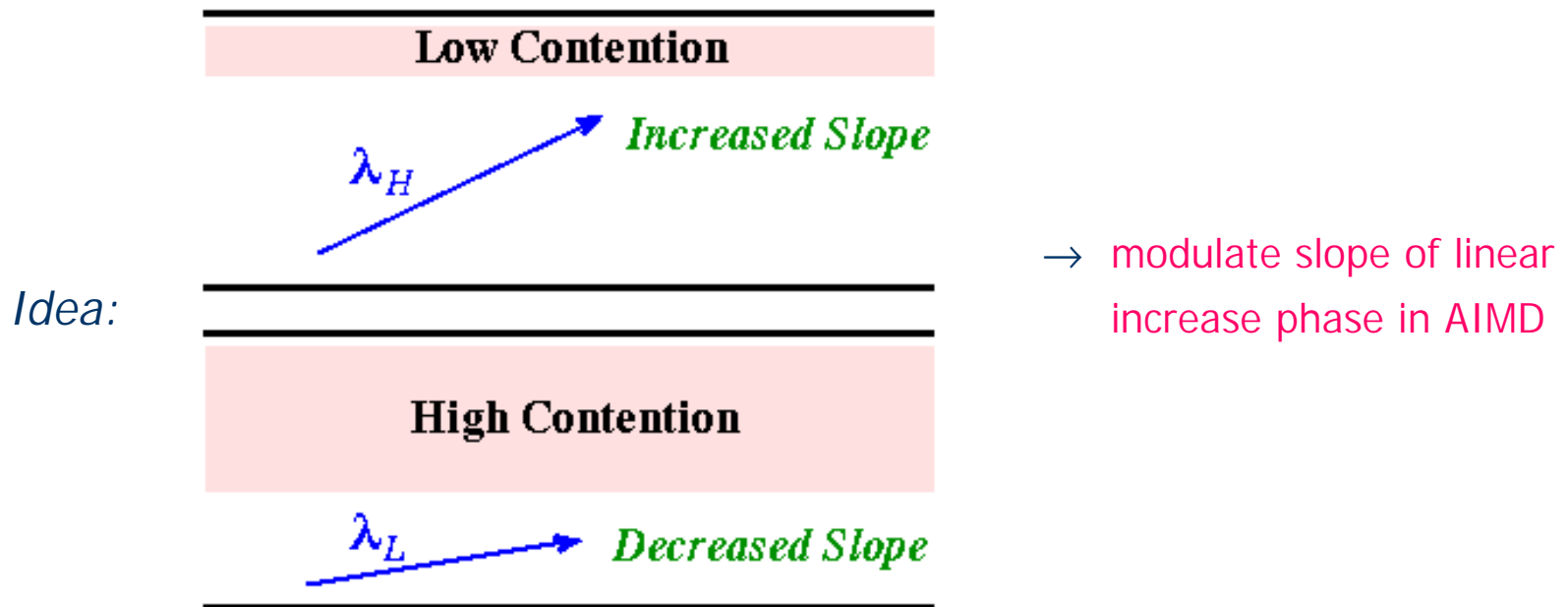
# Multiple Time Scale Traffic Control (cont.)

## Application Domains:

- Bulk data transport – congestion control
  - throughput maximization (TCP-MT)
- Real-time data transport – adaptive redundancy control
  - end-to-end QoS (AFEC-MT)

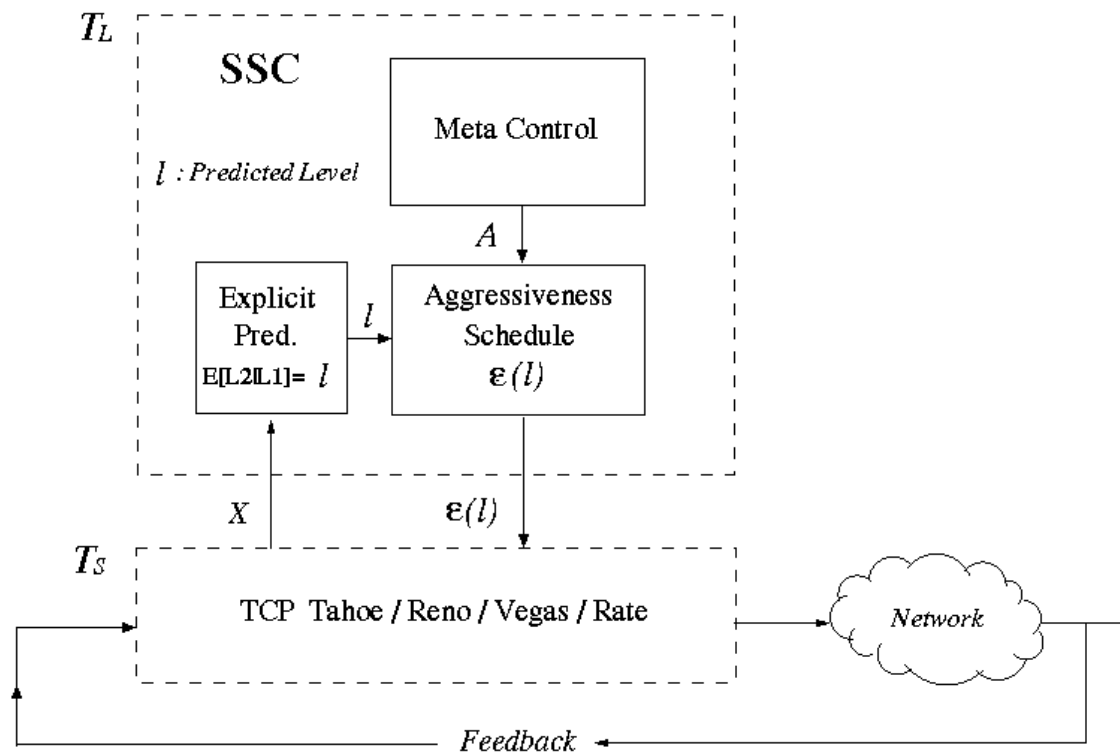
# Multiple Time Scale Traffic Control (cont.)

Congestion control: TCP and rate-based



# Multiple Time Scale Traffic Control (cont.)

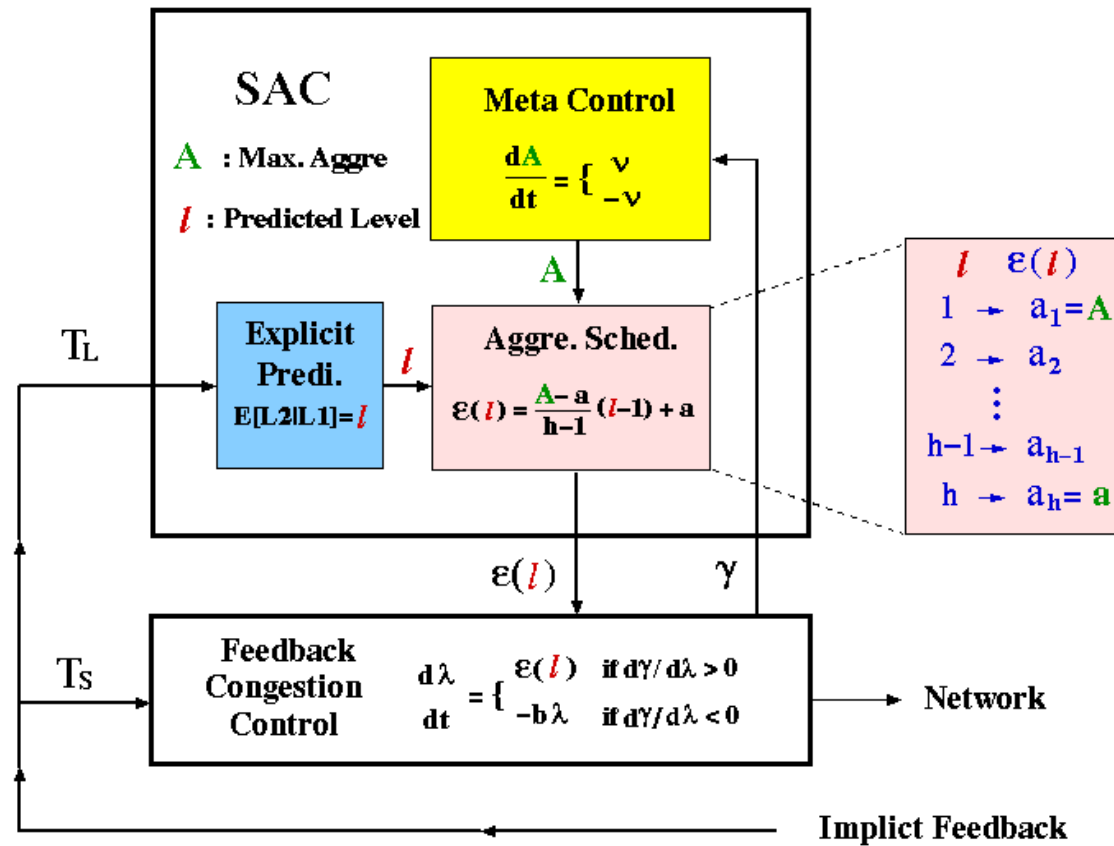
- ◆ Multiple time scale TCP (TCP-MT):



# Multiple Time Scale Traffic Control (cont.)

- Multiple time scale rate-based congestion control:

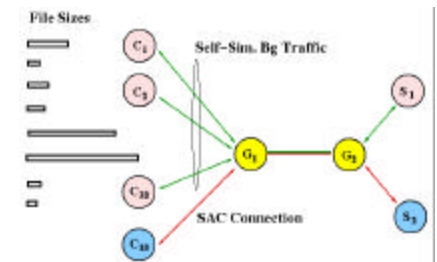
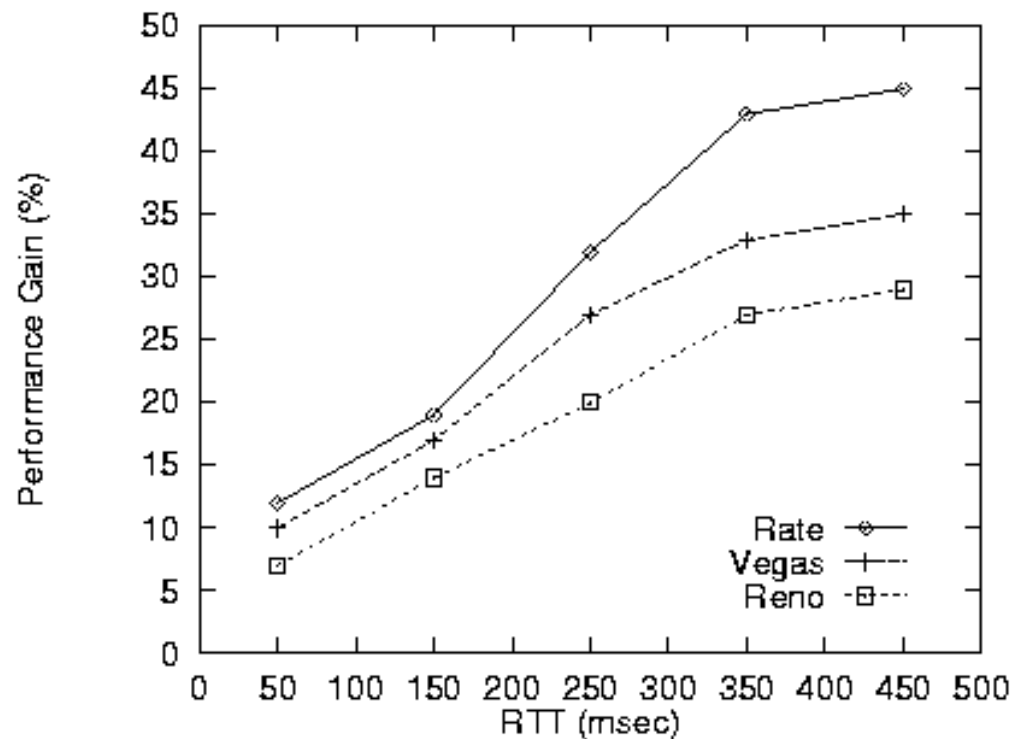
ATM:



# Multiple Time Scale Traffic Control (cont.)

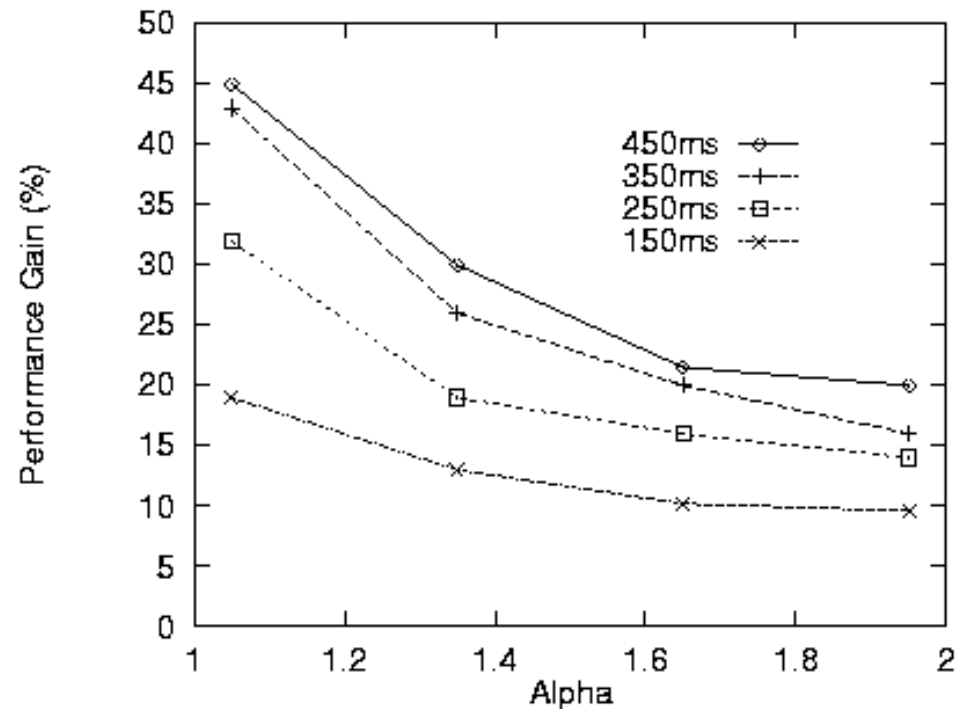
- ◆ TCP-MT: performance gain as function of RTT

TCP-MT  
TCP



## Multiple Time Scale Traffic Control (cont.)

- ◆ TCP-MT: performance gain as function of self-similarity





## Multiple Time Scale Traffic Control (cont.)

- ◆ Principal performance effect:
  - impart proactivity above and beyond AFEC
  - **proactivity** of reactive control in broadband WANs
  - mitigate reactive cost

predictability at time scales exceeding RTT imparts timeliness

⇒ applications: broadband WAN, TCP-over-Satellite



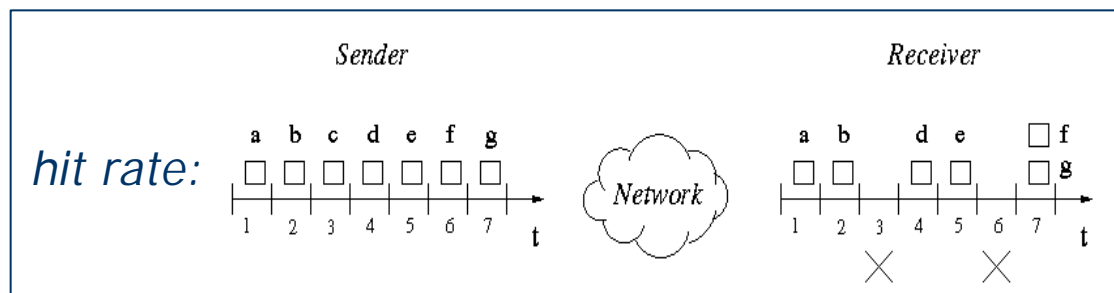
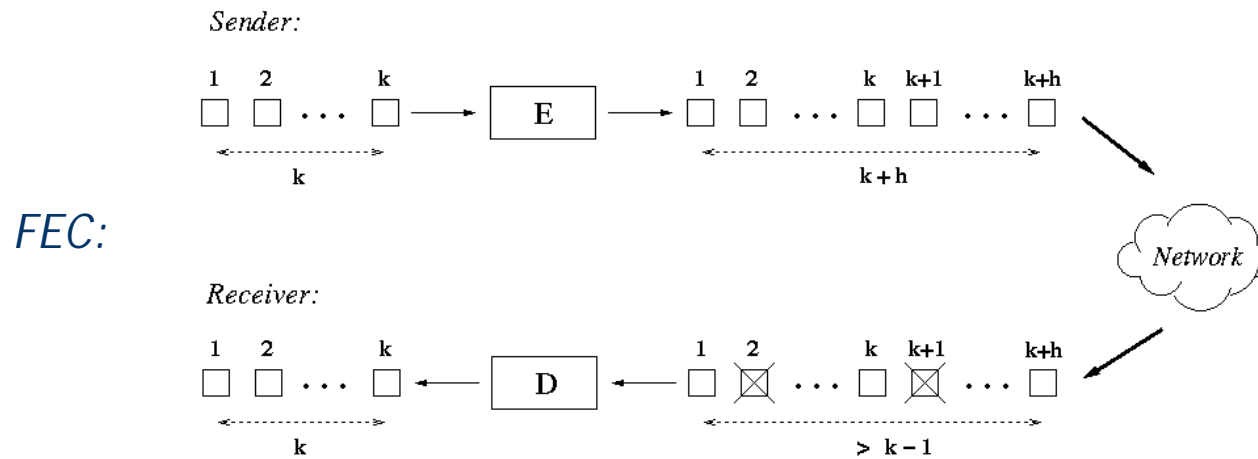
# Adaptive Redundancy Control

## Real-time Traffic Transport

- Achieve invariant end-to-end QoS
- User-specified QoS
- ARQ infeasible (RTT & timeliness)
- Packet-level FEC
  - proactive QoS protection
- Purely end-to-end (black box network)
- MPEG video/audio implementation (UDP)

# Adaptive Redundancy Control (cont.)

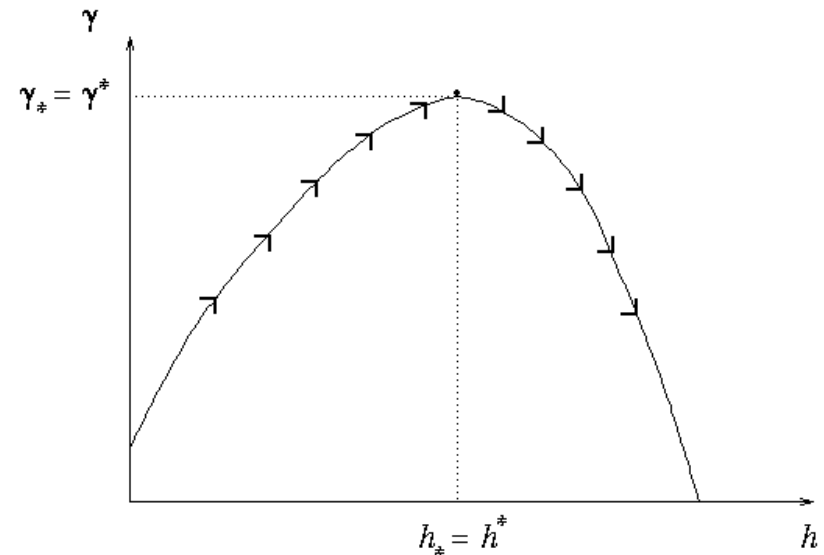
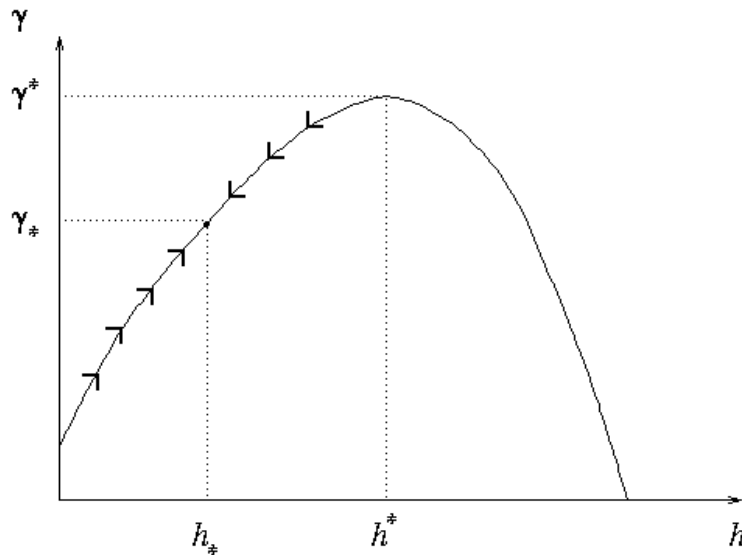
## Adaptive redundancy control (AFEC):



$$0 \leq \gamma \leq 1$$

# Adaptive Redundancy Control (cont.)

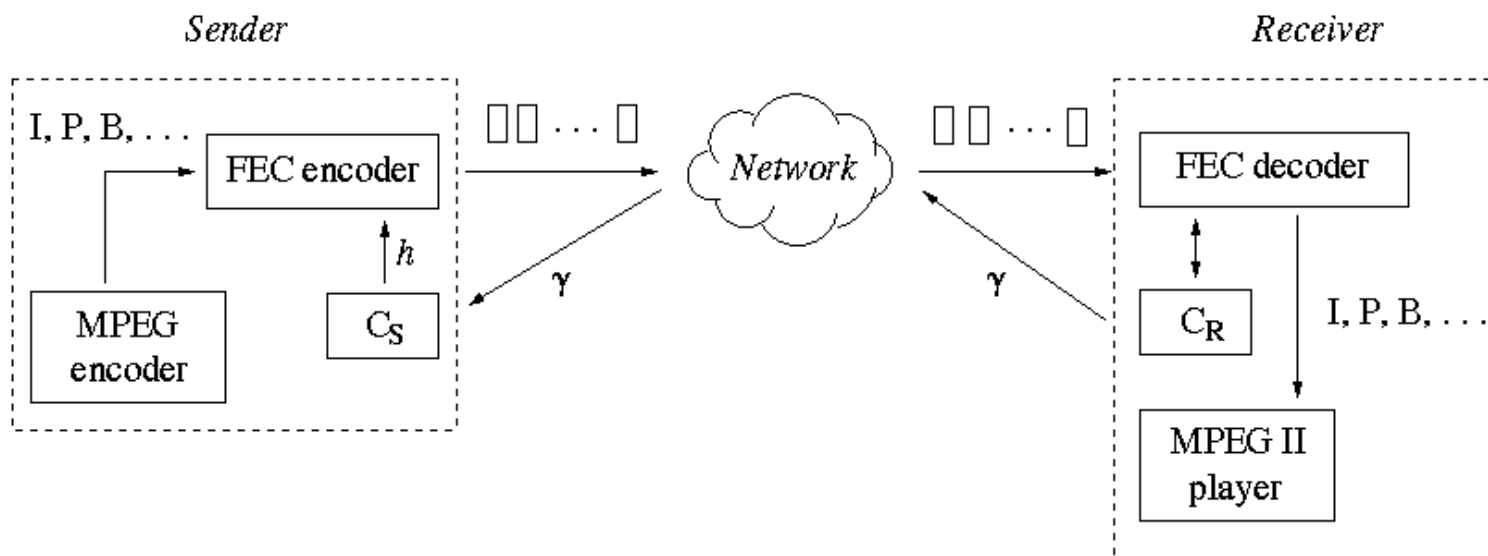
- ◆ Redundancy-recovery relation:



→ stability & optimality

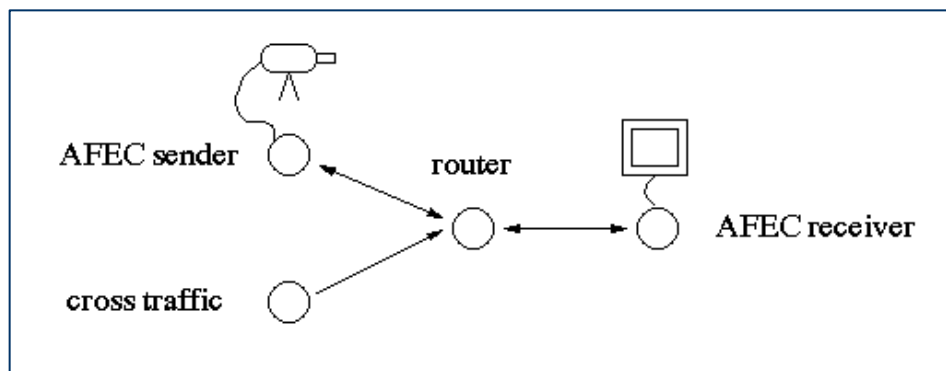
# Adaptive Redundancy Control (cont.)

- ◆ AFEC structure:



# Adaptive Redundancy Control (cont.)

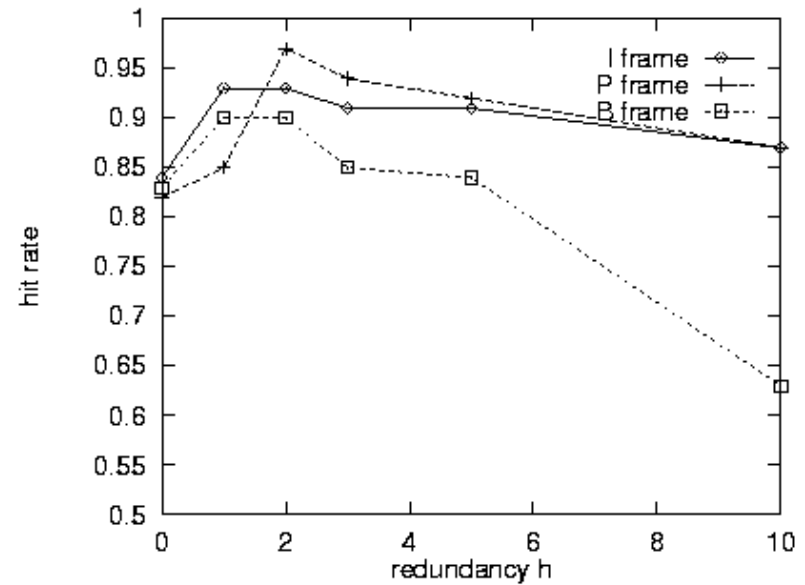
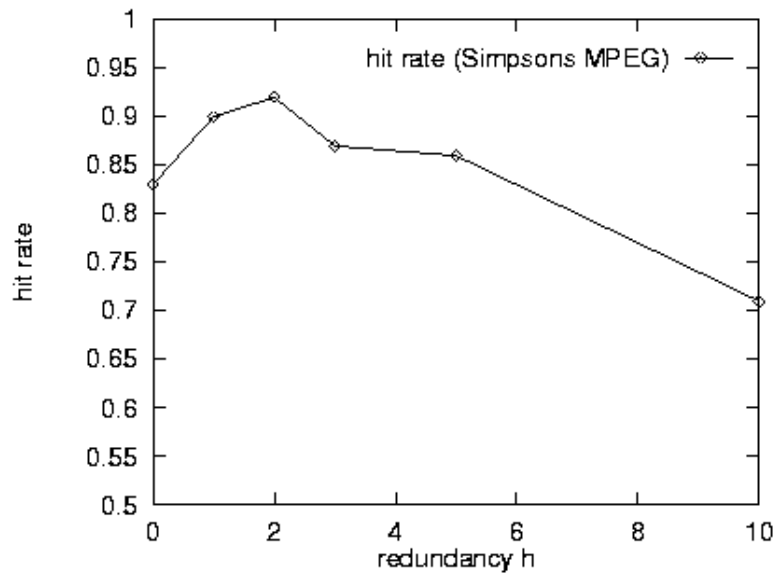
## ◆ Experimental set-up:



- UltraSparc 1 & 2, SGI, x86
- Solaris UNIX, Windows NT
- Optibase, Futuretel MPEG I & II compression boards
- Sony DCR-VX 1000, Panasonic F250

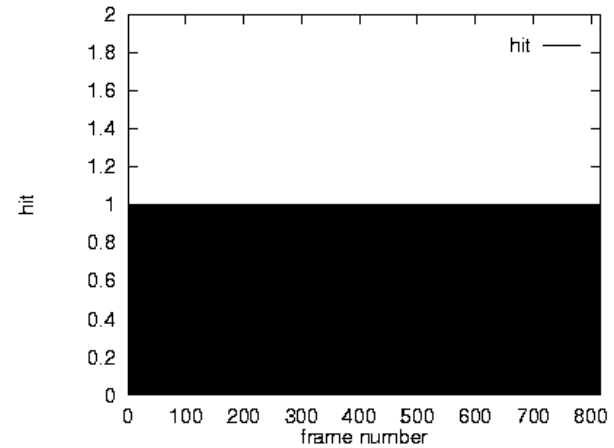
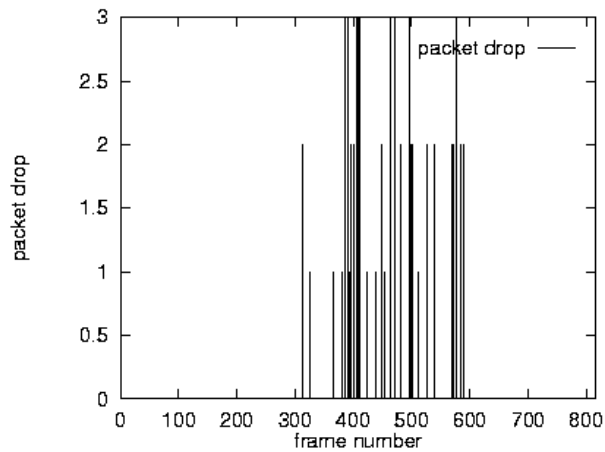
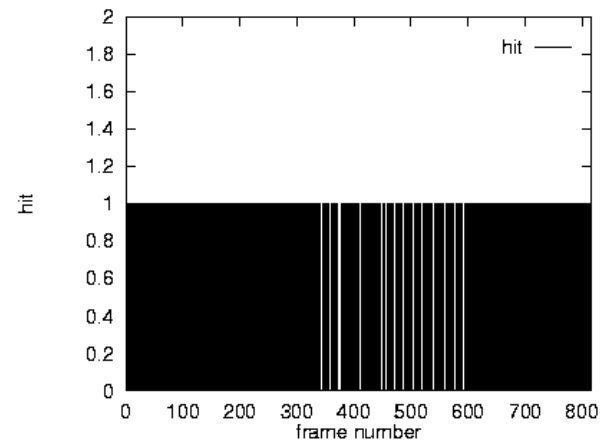
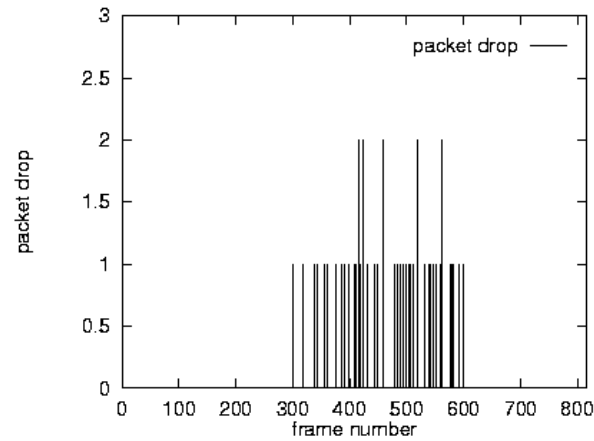
# Adaptive Redundancy Control (cont.)

- ◆ Impact of redundancy: Static FEC



# Adaptive Redundancy Control (cont.)

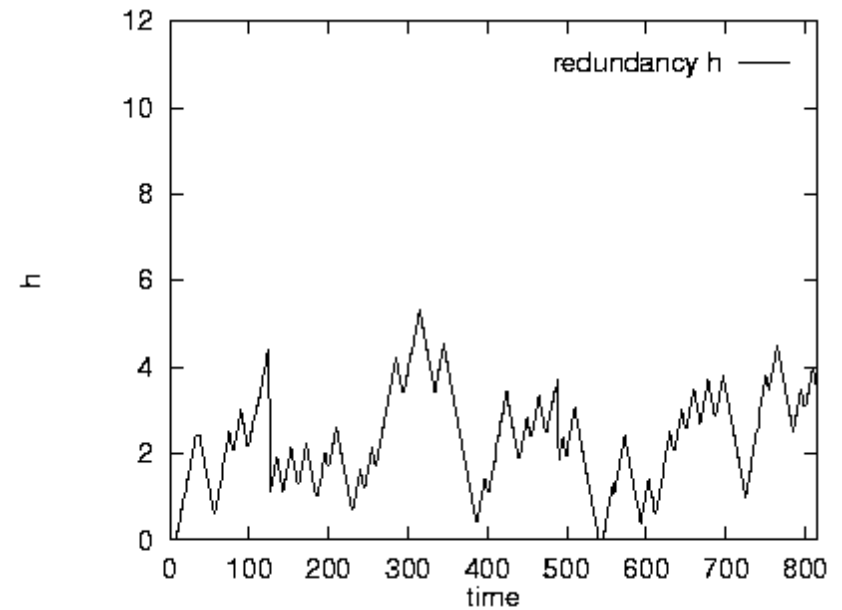
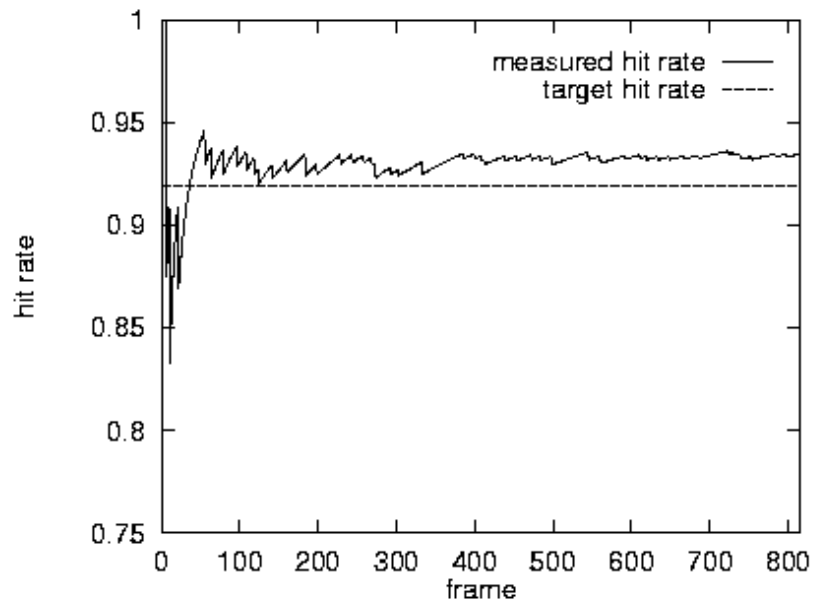
- ◆ Adaptive FEC vs. static FEC





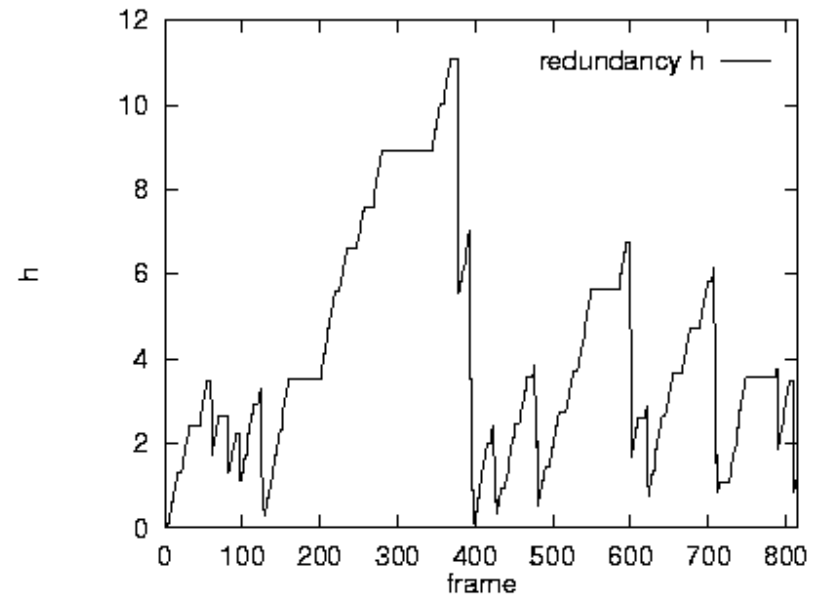
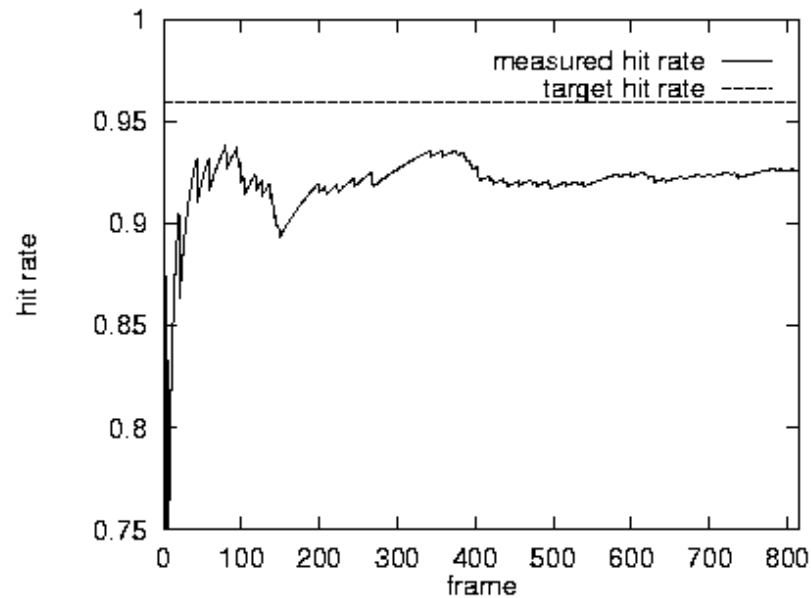
# Adaptive Redundancy Control (cont.)

- ◆ Stable target QoS: symmetric control



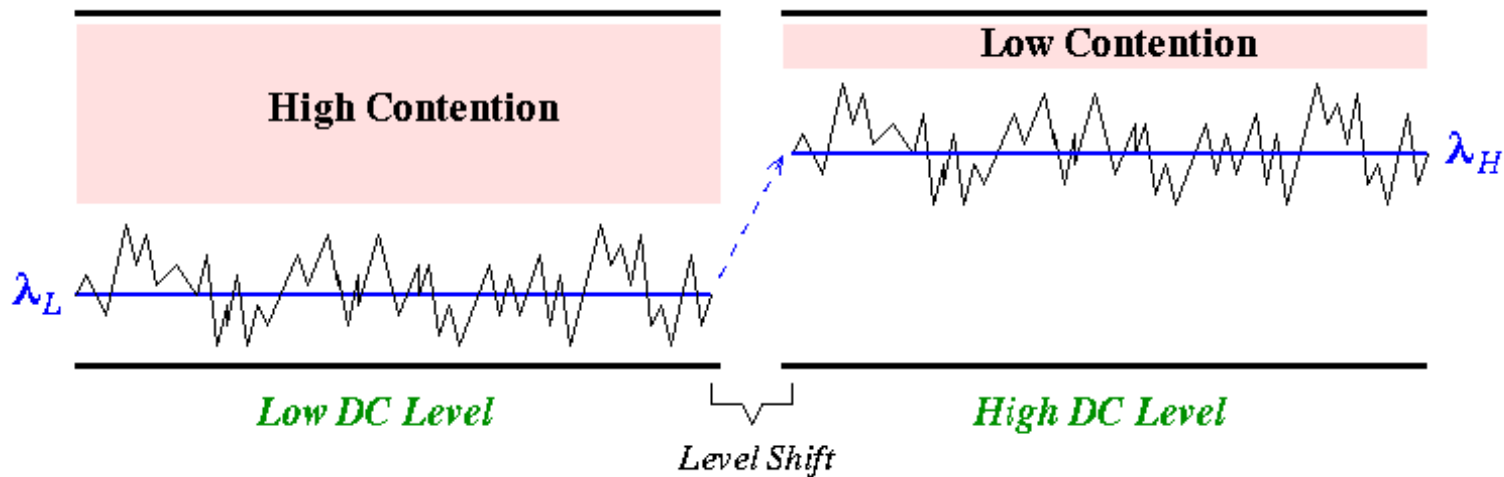
# Adaptive Redundancy Control (cont.)

- ◆ Unstable target QoS: asymmetric control



# Adaptive Redundancy Control (cont.)

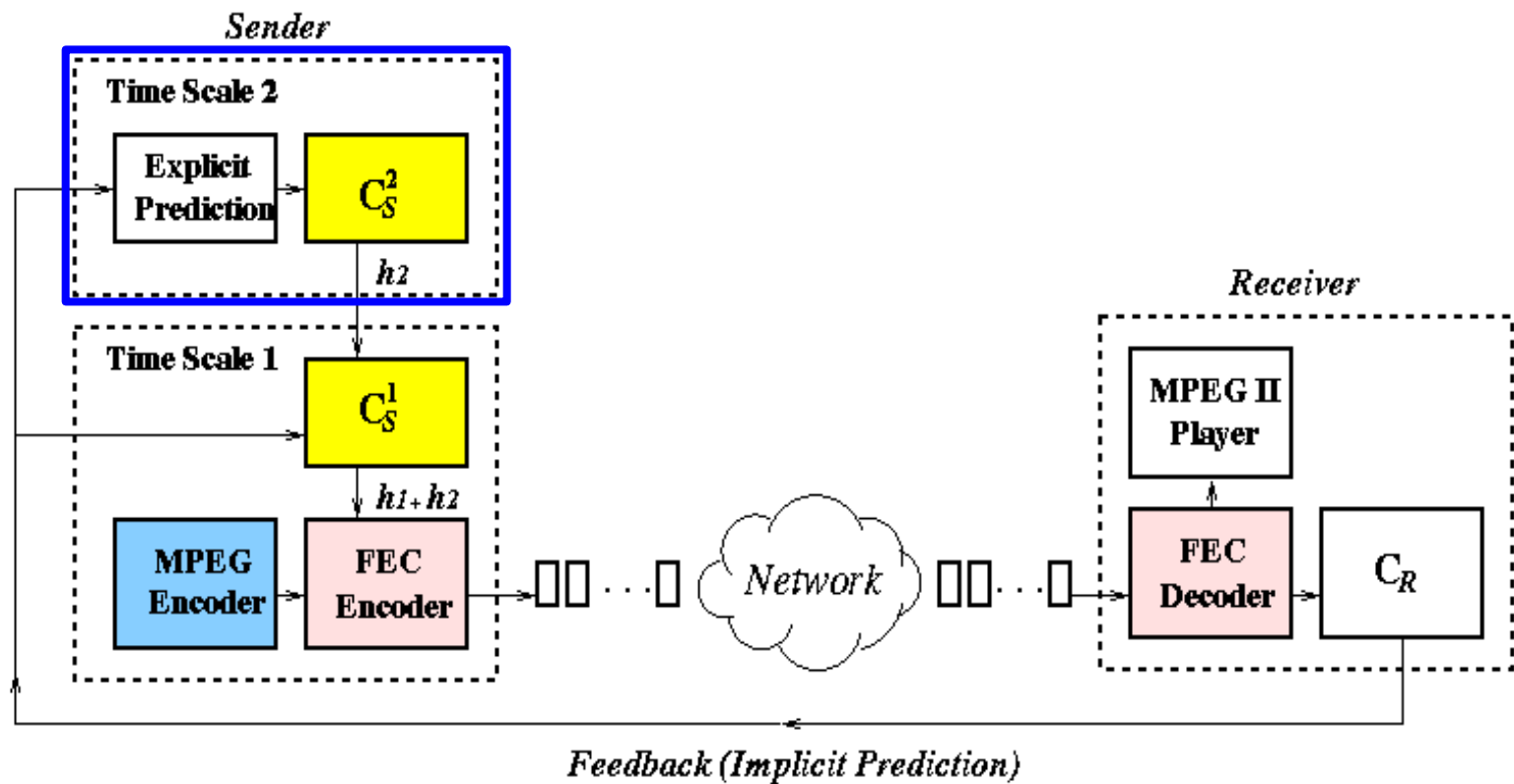
- ◆ Multiple time scale redundancy control



→ level control

# Adaptive Redundancy Control (cont.)

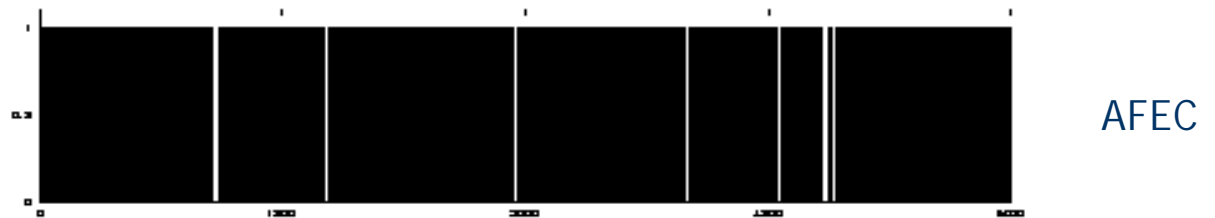
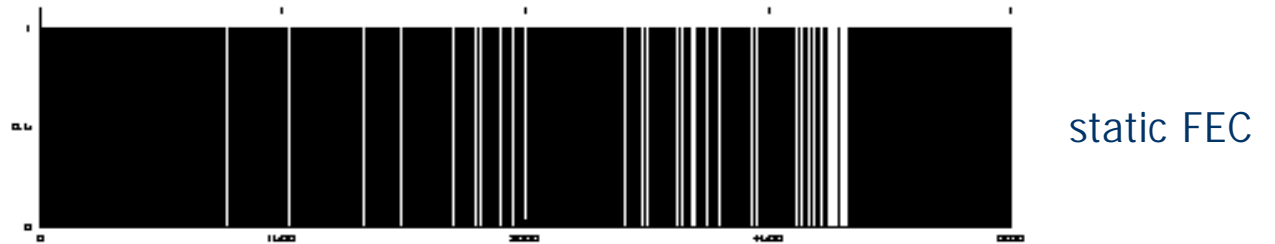
- ◆ AFEC-MT structure:



# Adaptive Redundancy Control (cont.)

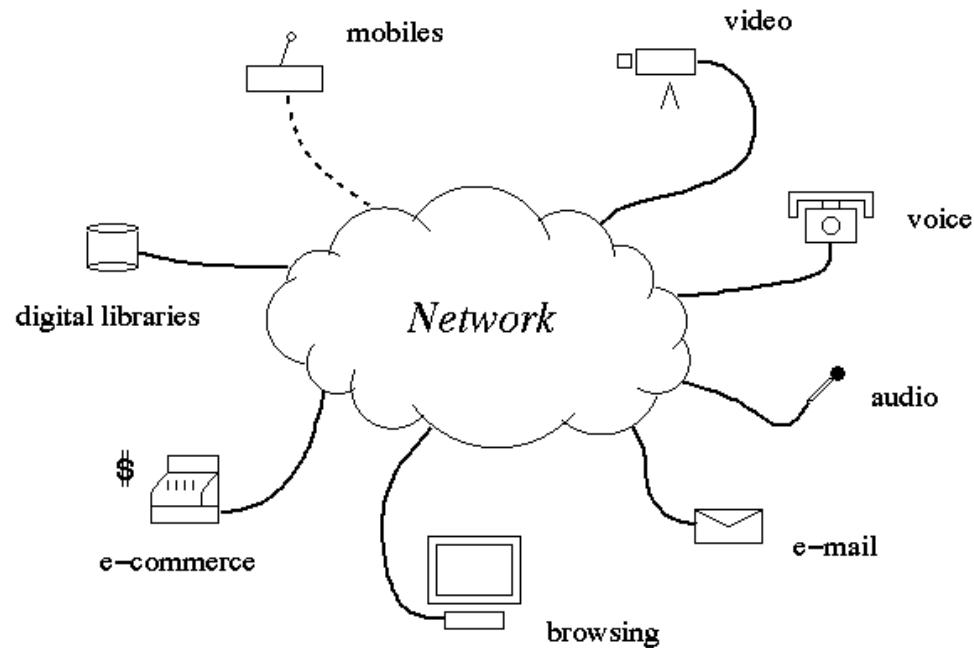
- ◆ AFEC-MT:

*hit trace:*



# Adaptive Label Control

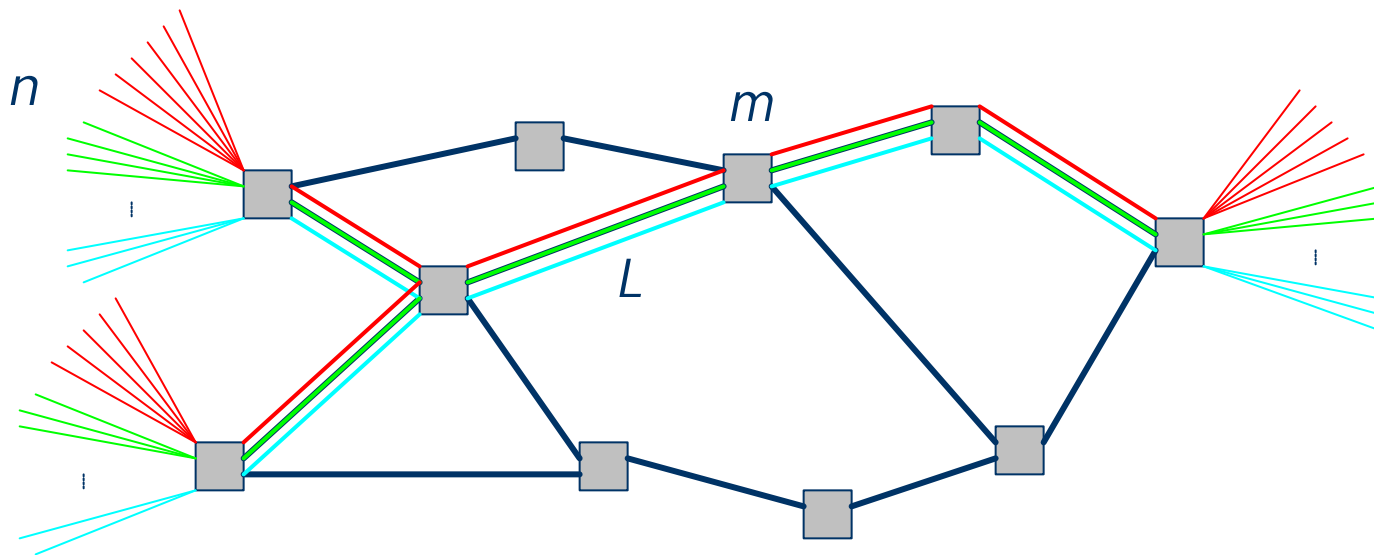
Motivation:



- diverse QoS requirements
- shared network environment

# Adaptive Label Control (cont.)

Differentiated services network:



$n$  users  $\gg L$  labels (colors)  $\geq m$  classes

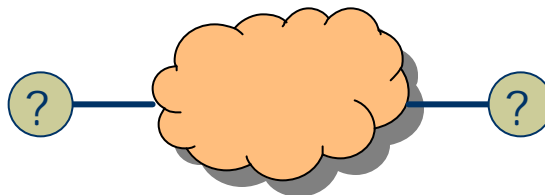
# Adaptive Label Control (cont.)

## Questions:

- What is a “good” (optimal) per-hop control?  
→ optimal aggregate-flow per-hop behavior



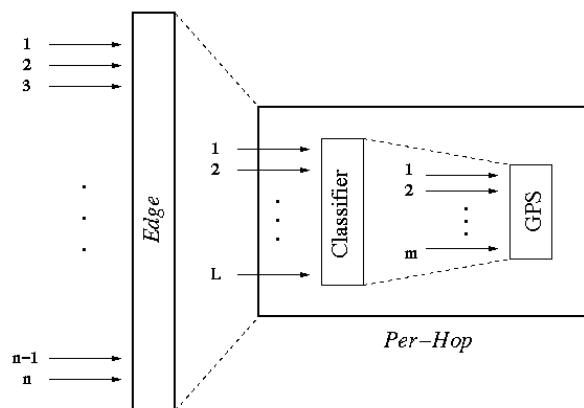
- What is a “good” (optimal) edge control?





## Adaptive Label Control (cont.)

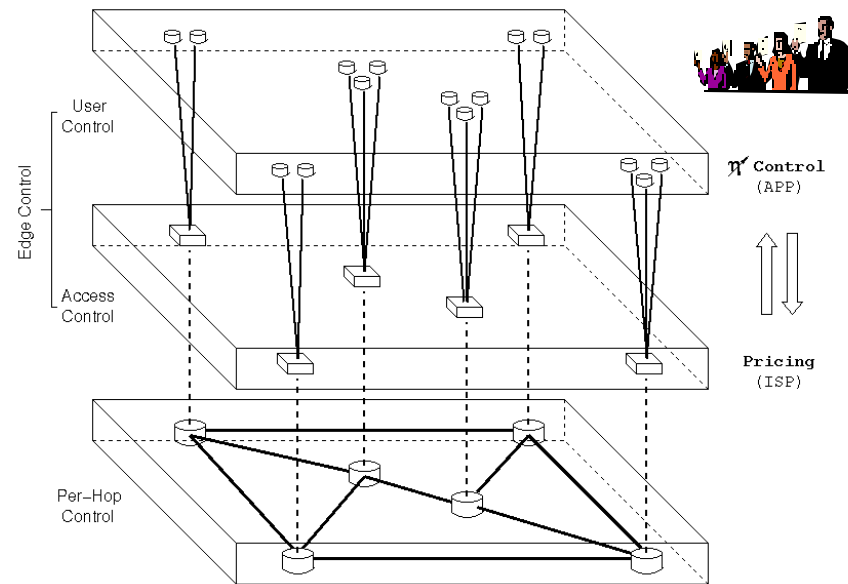
- What is the loss of power due to aggregation?
  - $n \gg L \geq m$
  - loss of resolution vis-à-vis per-flow switching



- What is the impact of finite, discrete label set  $\{1, 2, \dots, L\}$ ?
  - $\eta \in \mathbf{Z}_+, \mathbf{R}_+, [0,1], \text{ or } \mathbf{R}_+^S$

# Adaptive Label Control (cont.)

- What is the system dynamics when driven by selfish users?
  - end-to-end label control
  - stability (Nash equilibria) and efficiency (system optimality)



- What is the impact of selfish service provider (ISP)?



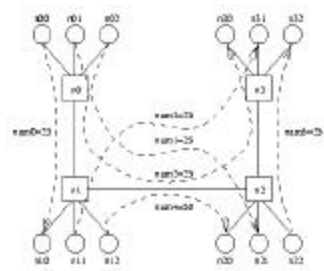
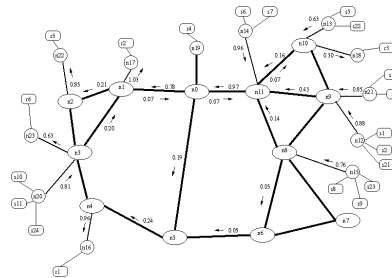
# Adaptive Label Control (cont.)

## Theory

- optimal PHB
  - differentiation/shaping
  - efficiency
- adaptive label control
- selfish users
- selfish service provider
- performance analysis

## Simulation

### QSim: WAN QoS Simulator



## Implementation

### Purdue Infobahn

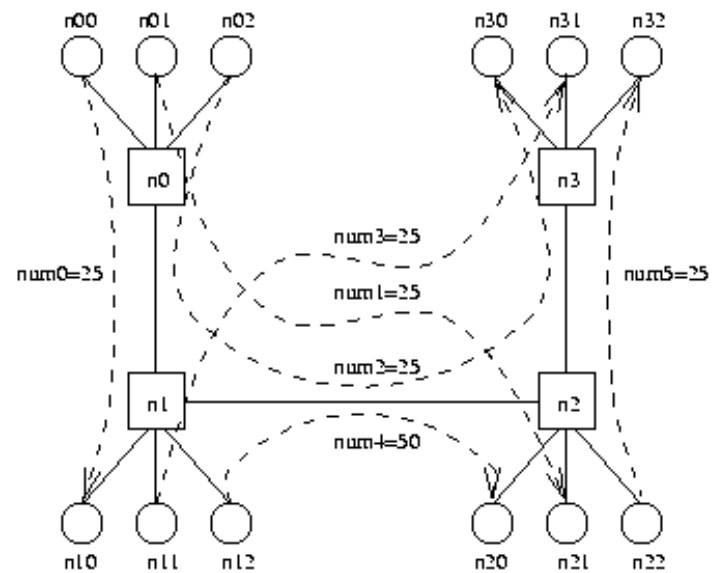
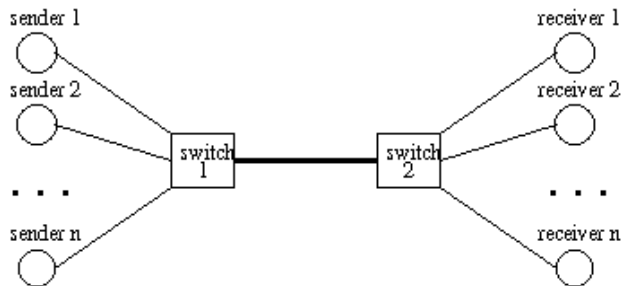


Cisco 7206 VXR IP-over-SONET  
QoS Testbed

# Adaptive Label Control (cont.)

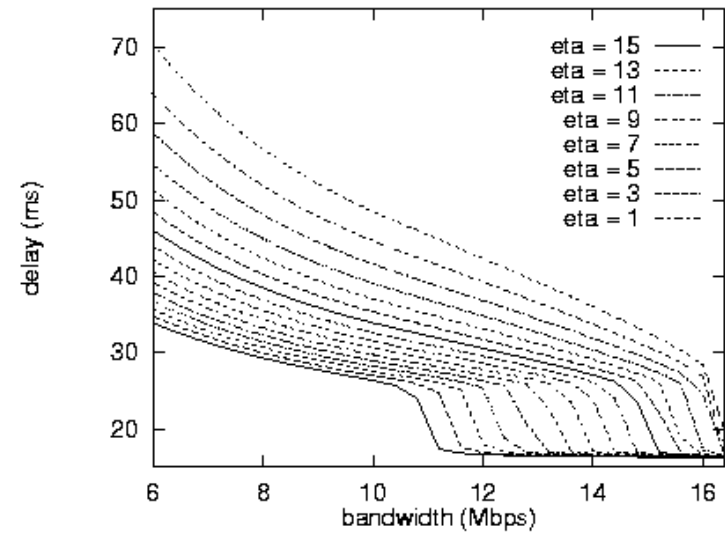
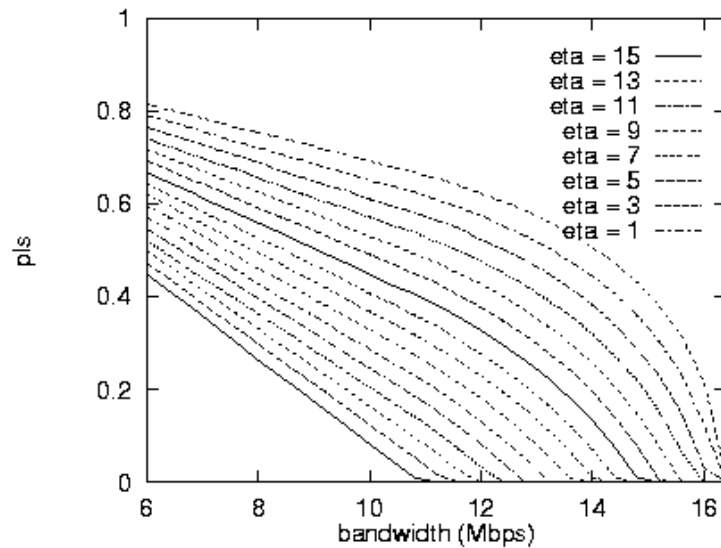
## Performance Results

→ QSim: *ns* based WAN QoS simulation environment



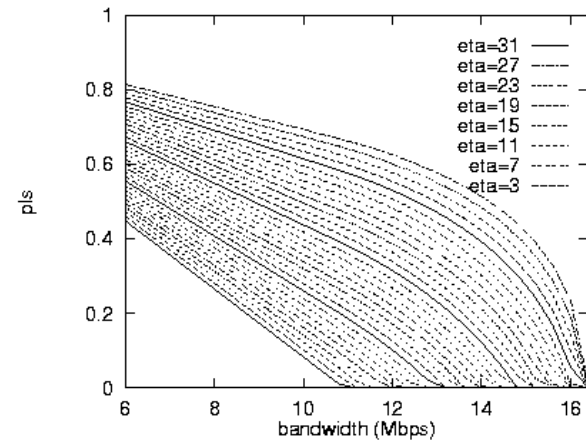
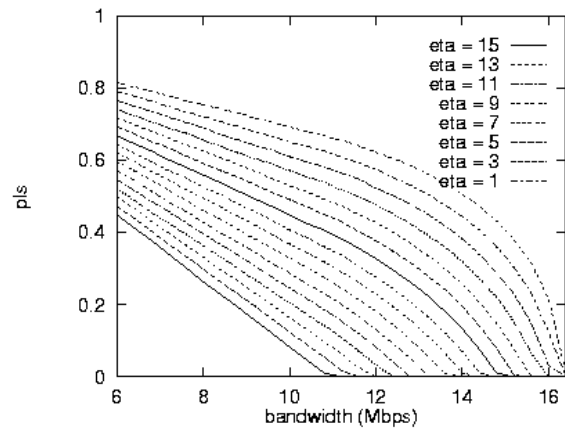
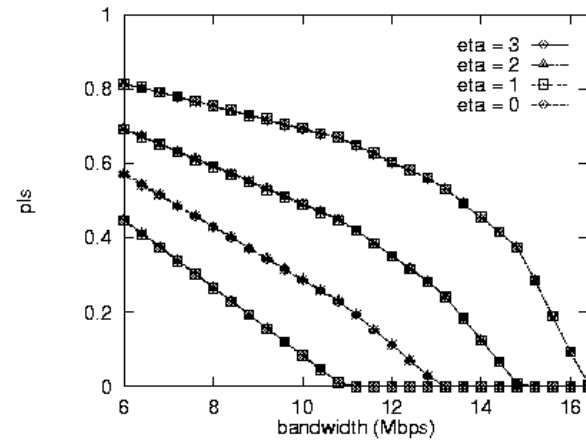
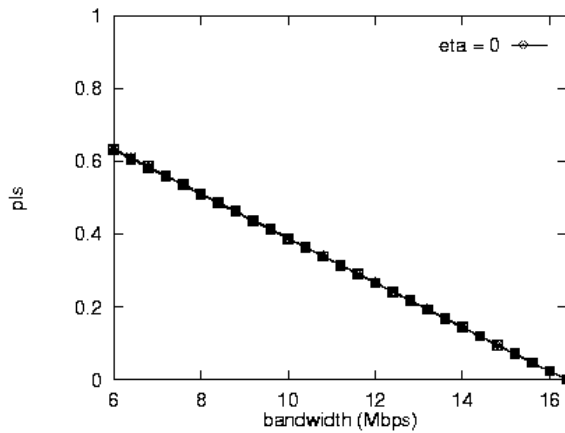
# Adaptive Label Control (cont.)

- ◆ Structural: bottleneck BW,  $L = 16$  ( $m = 16$ )



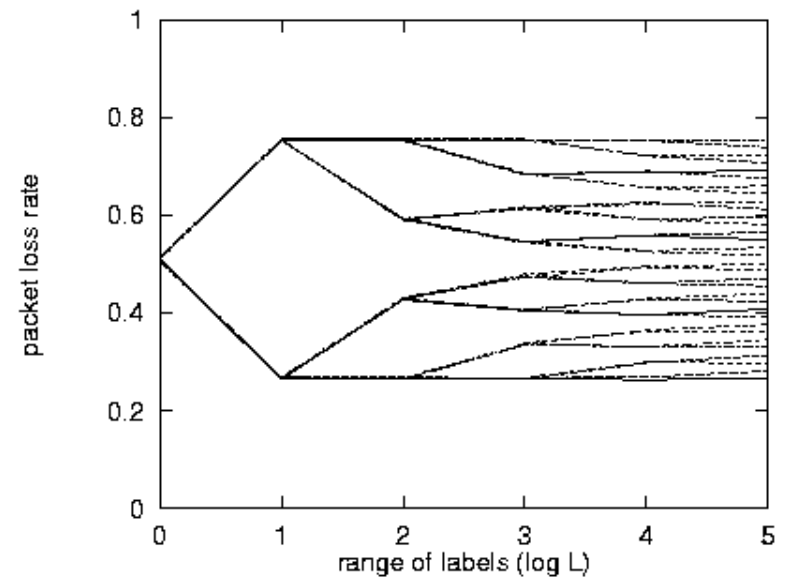
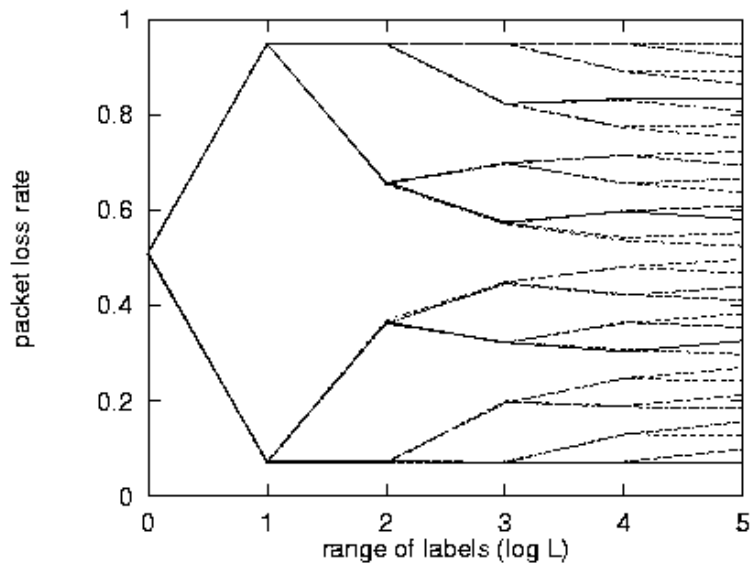
# Adaptive Label Control (cont.)

- ◆ Structural:  $L = 1, 4, 16, 32$



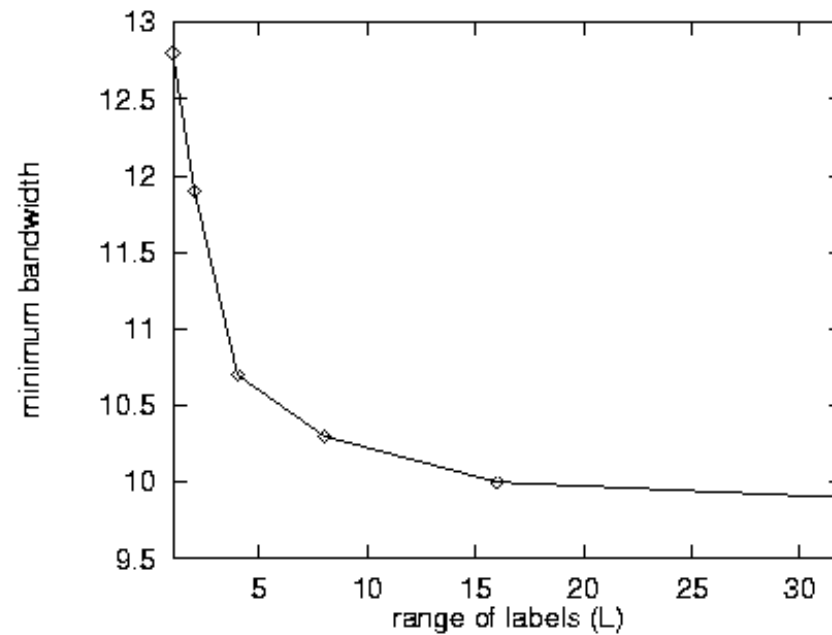
# Adaptive Label Control (cont.)

- ◆ Structural:  $\log L = 0, 1, 2, 3, 4, 5$  (bits)



## Adaptive Label Control (cont.)

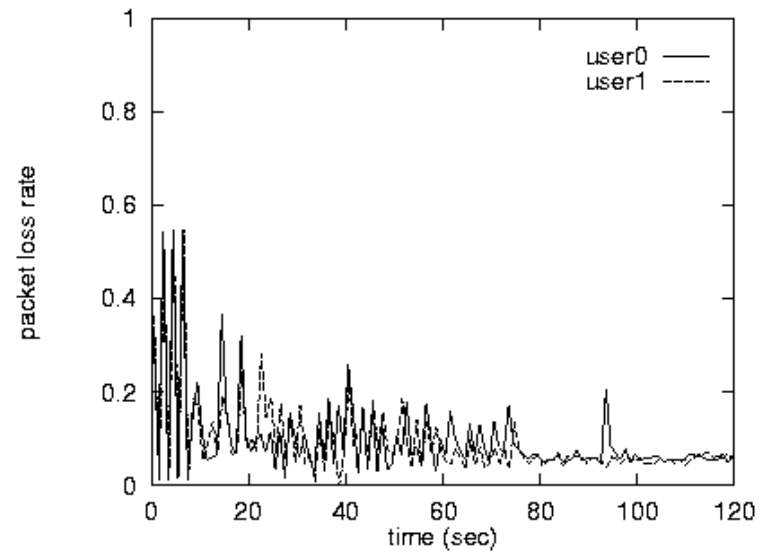
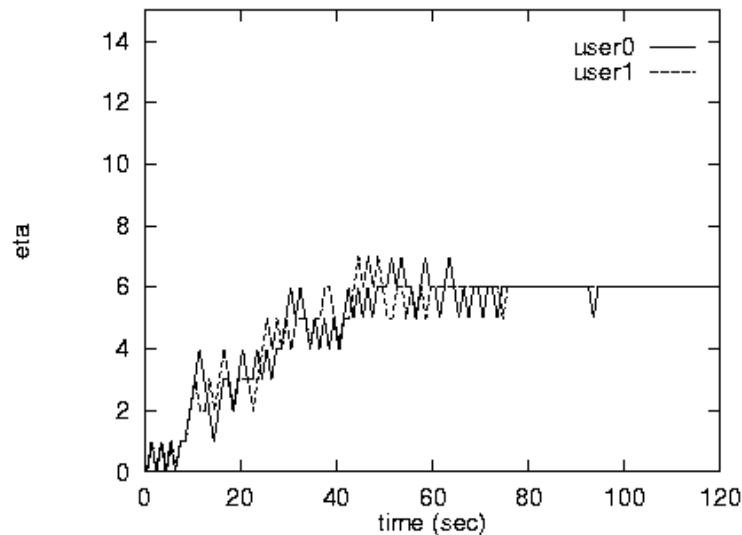
- ◆ Structural: system optimal BW requirement





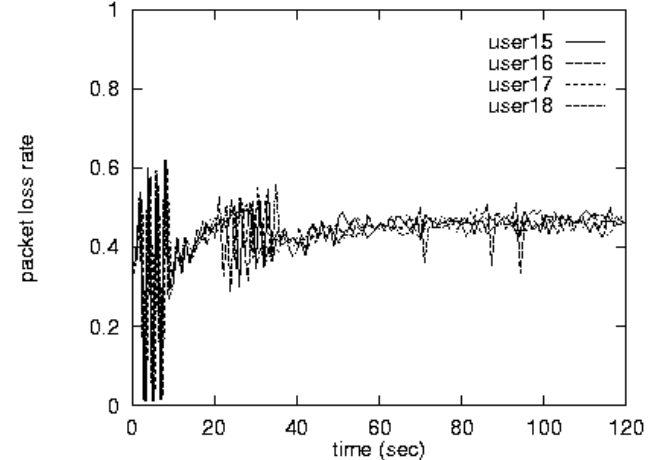
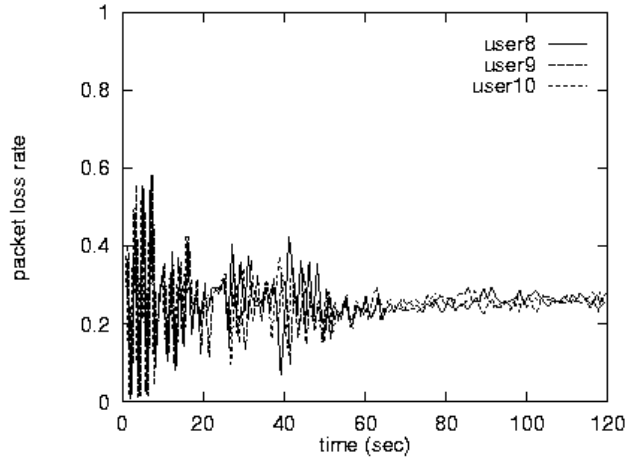
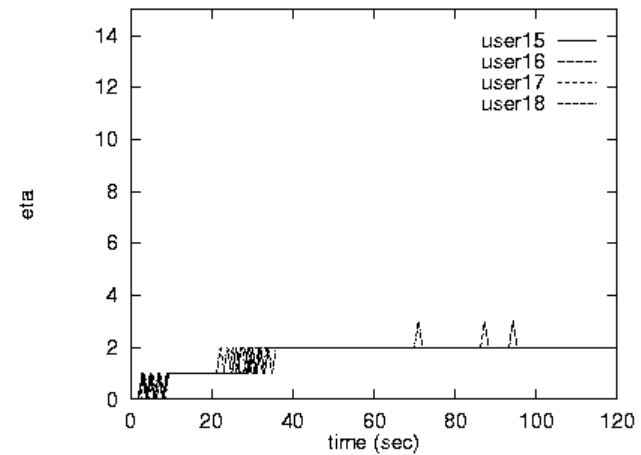
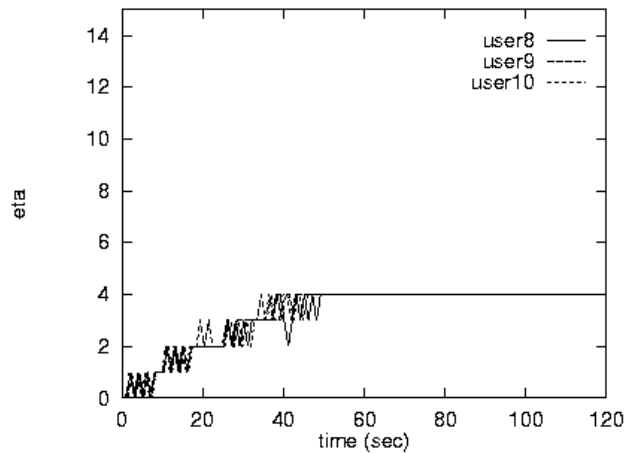
# Adaptive Label Control (cont.)

- ◆ Dynamical: adaptive label control (*end-to-end*)  
→ reachability



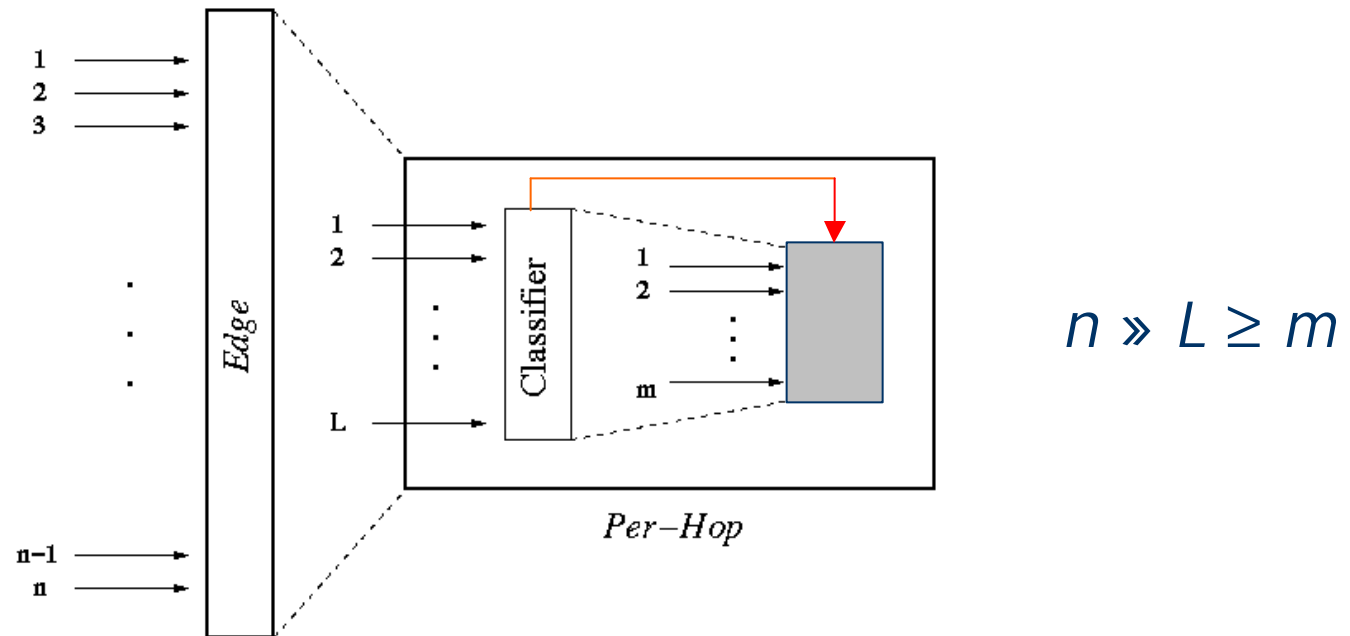
# Adaptive Label Control (cont.)

- ◆ Dynamical: adaptive label control (cont.)



# Adaptive Label Control (cont.)

Optimal aggregate-flow per-hop control:



→  $n$  users,  $L$  labels, and  $m$  service classes

## Adaptive Label Control (cont.)

- ◆ Of interest:  $n \gg L \geq m$
- ◆ Special case:  $n = m$ 
  - per-flow per-hop control
- ◆ Of special interest:  $L = m$ 
  - as many service classes as label values

Optimality I: service differentiation/shaping

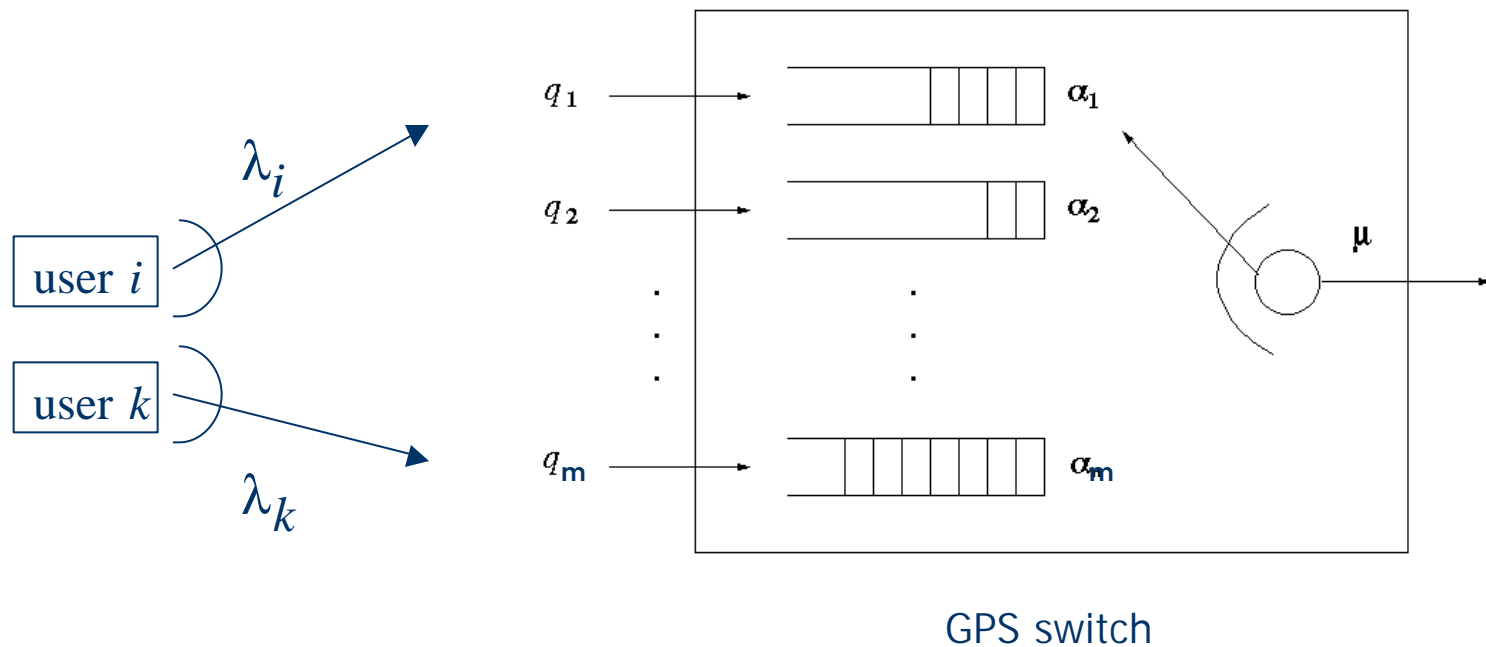


## Adaptive Label Control (cont.)

- ◆ Per-flow Control ( $n = m$ ):
  - Label value  $\eta$  viewed as “code” of user requirement
    - e.g., 1.5 Mbps, relative share of link bandwidth, etc.
  - If infinite resources, then no interaction/coupling
    - e.g., INDEX
  - In resource-bounded systems,  $\exists$  coupling (externality)

## Adaptive Label Control (cont.)

- ◆ Illustration of coupling in simple single switch case:



# Adaptive Label Control (cont.)

- ◆ INDEX (Varaiya et al.)

<u>Platinum Service</u>	$BW_1$	$Price_1$
<u>Gold Service</u>	$BW_2$	$Price_2$
<u>Silver Service</u>	$BW_3$	$Price_3$
<u>Bronze Service</u>	$BW_4$	$Price_4$

- service class: volume insensitive
- infinite resources
- no *externality*

## Adaptive Label Control (cont.)

- Assume label set is metric space (totally ordered)
  - e.g., Euclidean distance ( $L_2$  norm)
  - e.g.,  $\eta = 1 < 2 < \dots < L$
- Mean square measure of goodness:

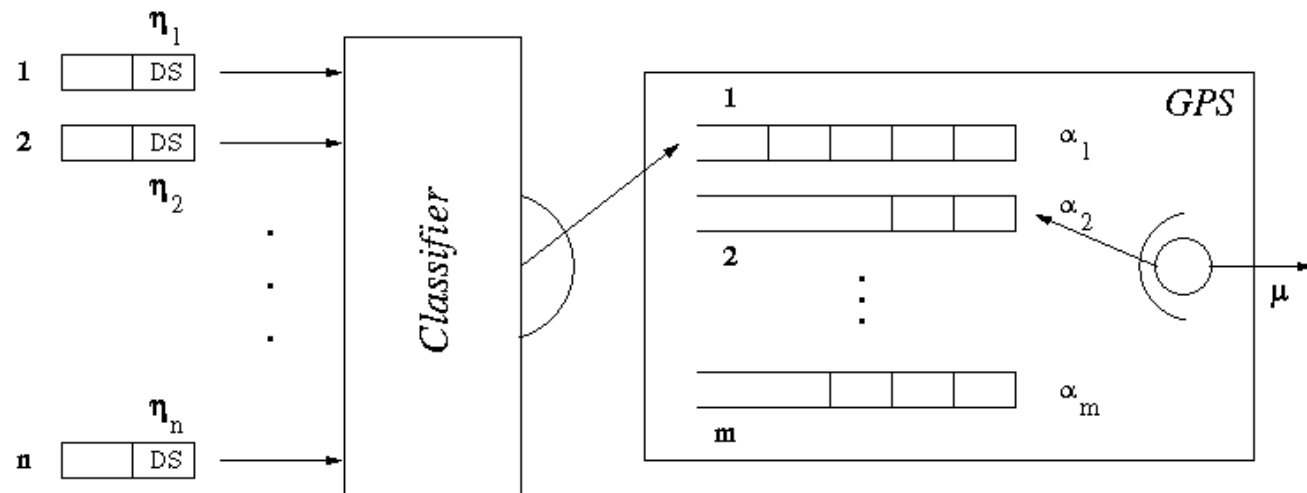
Given  $\eta$ , find resource configuration  $\mathbf{v}$  s.t.

$$\min_{\mathbf{v}} \sum_{i=1}^n (\mathbf{h}_i - \mathbf{v}_i)^2$$



# Adaptive Label Control (cont.)

- ◆ GPS:  $\varpi_i = \alpha_i / \lambda^i$



$$\eta_i \in \{1, 2, \dots, L\}; \quad \xi : \{1, \dots, L\} \rightarrow \{1, \dots, m\}$$

## Adaptive Label Control (cont.)

◆ Normalization: 
$$\frac{h_i - h_{\min}}{h_{\max} - h_{\min}} \in [0,1]$$

◆ Solution: 
$$a_i = (1-u) \frac{l^i h^i}{\sum_k l^k h^k} + u \frac{l^i}{\sum_k l^k}$$

## Adaptive Label Control (cont.)

- ◆ Optimal aggregate-flow classifier:

Given  $\eta$ , find resource configuration  $\mathbf{v}$  s.t.

$$\min_{\mathbf{v}} \sum_{i=1}^n (\mathbf{h}_i - \mathbf{v}_i)^2$$

- ◆ Optimal solution:

Reduce to per-flow optimal solution

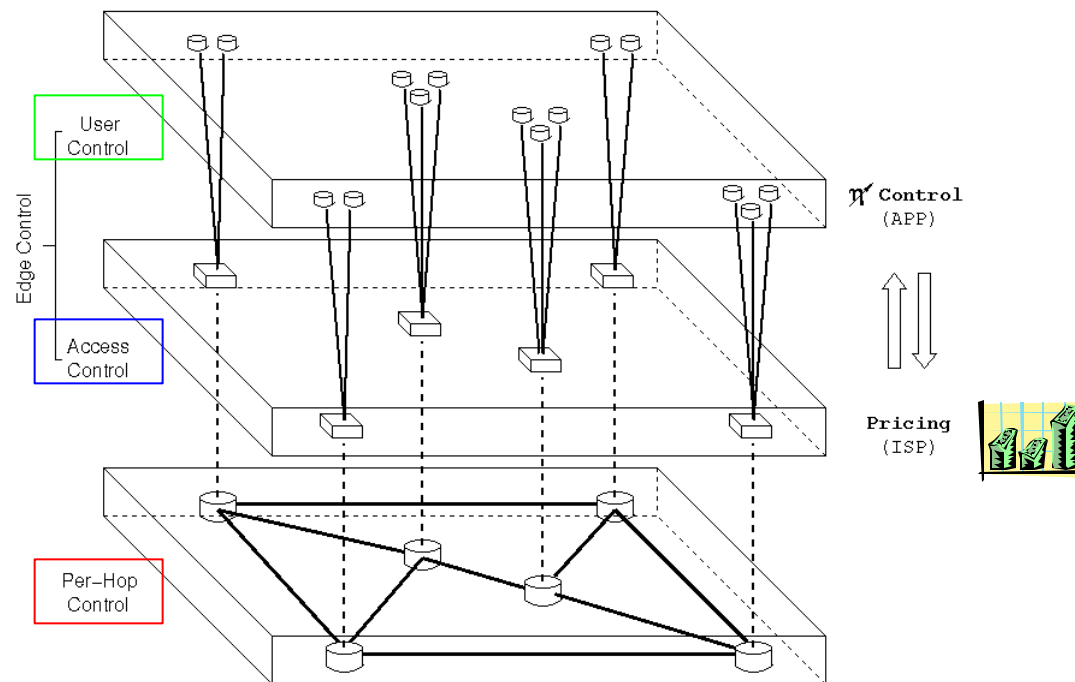
→ optimal clustering problem

## Adaptive Label Control (cont.)

- ◆ Properties (A1), (A2), and (B)
  - (A1) If  $\eta_i$  increases, then QoS of user  $i$  improves
  - (A2) If  $\eta_i$  increases, then QoS of user  $j$  degrades
  - (B) If  $\eta_i \geq \eta_j$  then QoS of user  $i$  is better than QoS of user  $j$
- ◆ Optimal per-flow classifier satisfies (A1), (A2), (B)
- ◆ Optimal aggregate-flow classifier with  $L = m$  satisfies (A1), (A2), (B)

# Adaptive Label Control (cont.)

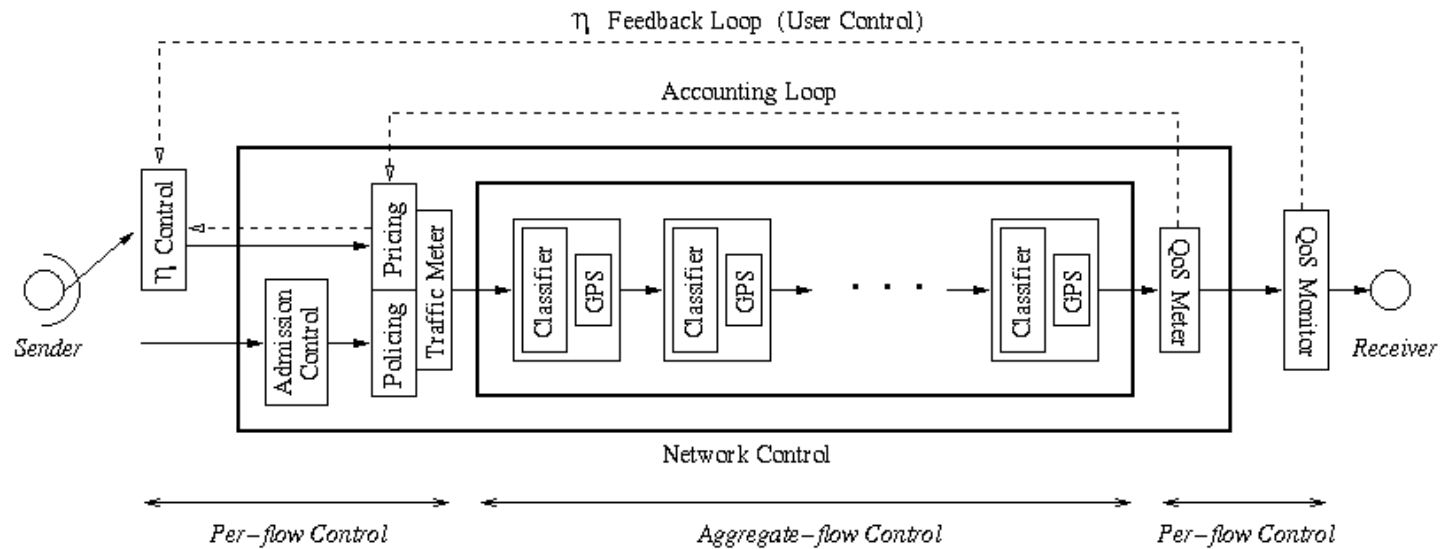
## Overall Architecture



→ three control planes

# Adaptive Label Control (cont.)

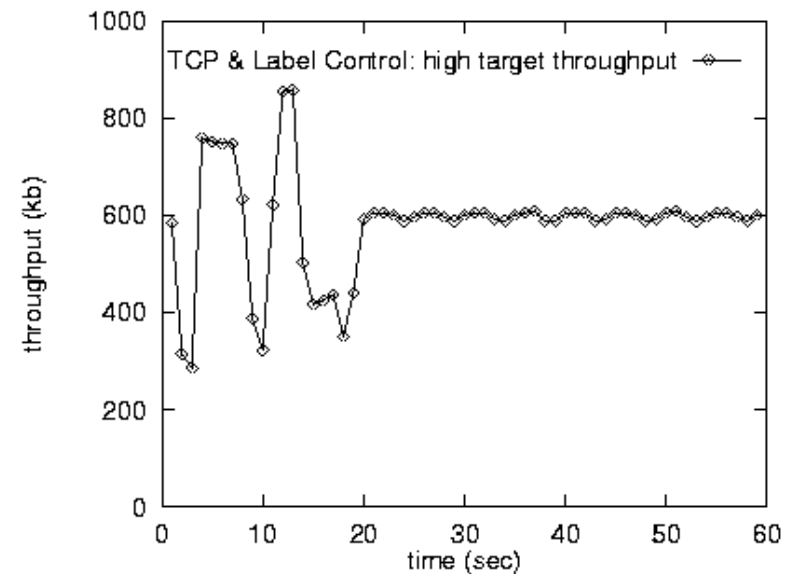
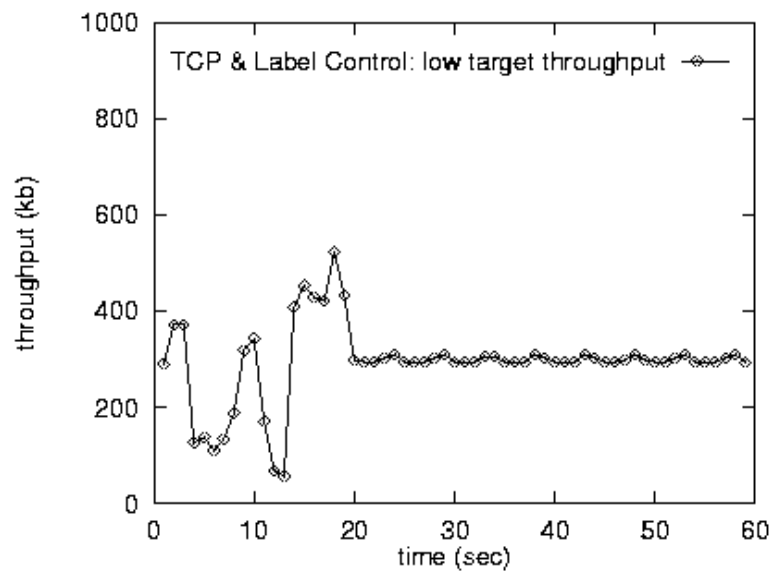
- ◆ End-to-end QoS control: *label control*



- open-loop
- closed-loop
  - adaptive label control

# Adaptive Label Control (cont.)

- ◆ Integrated QoS control:
  - e.g., TCP over adaptive label control





# Adaptive Label Control (cont.)

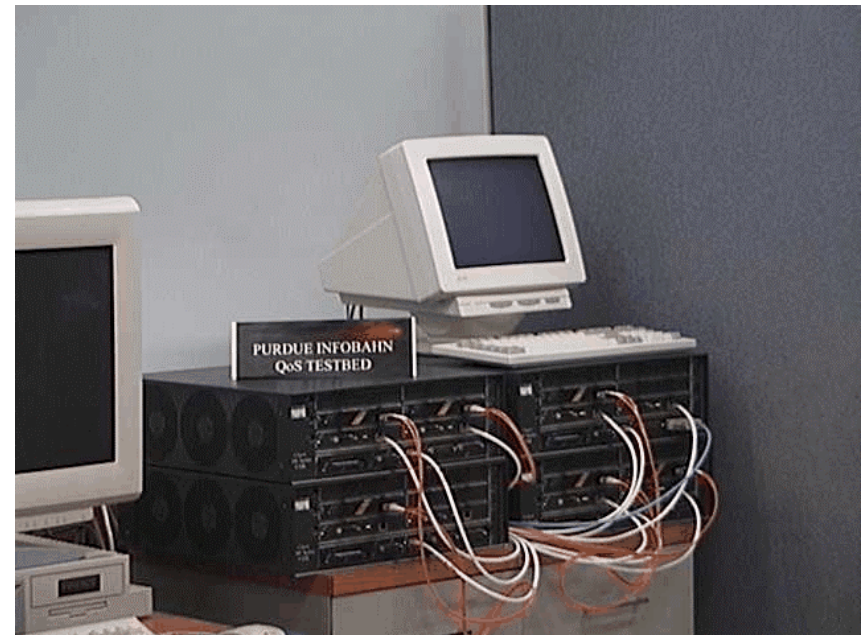
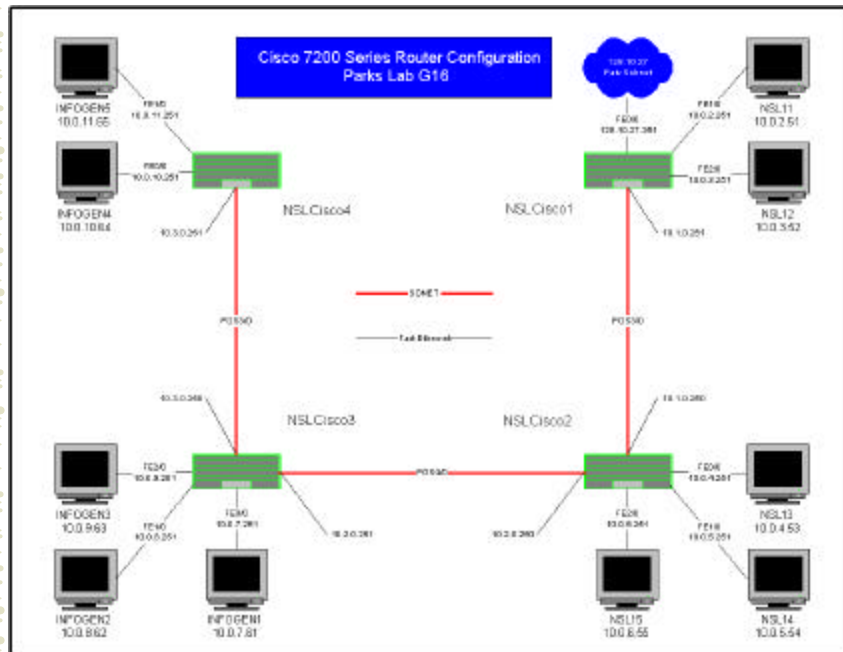
## Benchmark Environment

- Purdue Infobahn QoS testbed: 4 Cisco 7206 VXR routers
  - IP-over-SONET backbone
  - custom classifier implementation in Cisco IOS (Fred Baker)
- NSF vBNS and Abilene connectivity (DS-3)
  - Purdue vBNS/Internet2 Advisory Committee
  - Internet2 collaboration
- Fore ATM, FastEthernet switches



# Adaptive Label Control (cont.)

## Purdue Infobahn





## Adaptive Label Control (cont.)

- Real-time MPEG I & II video/audio compression engines
  - Optibase, Futuretel (Windows NT)
- Video/audio capture equipment
- 35+ Sun/Intel/SGI workstations & PCs
- Prototype software systems: UNIX, Windows NT



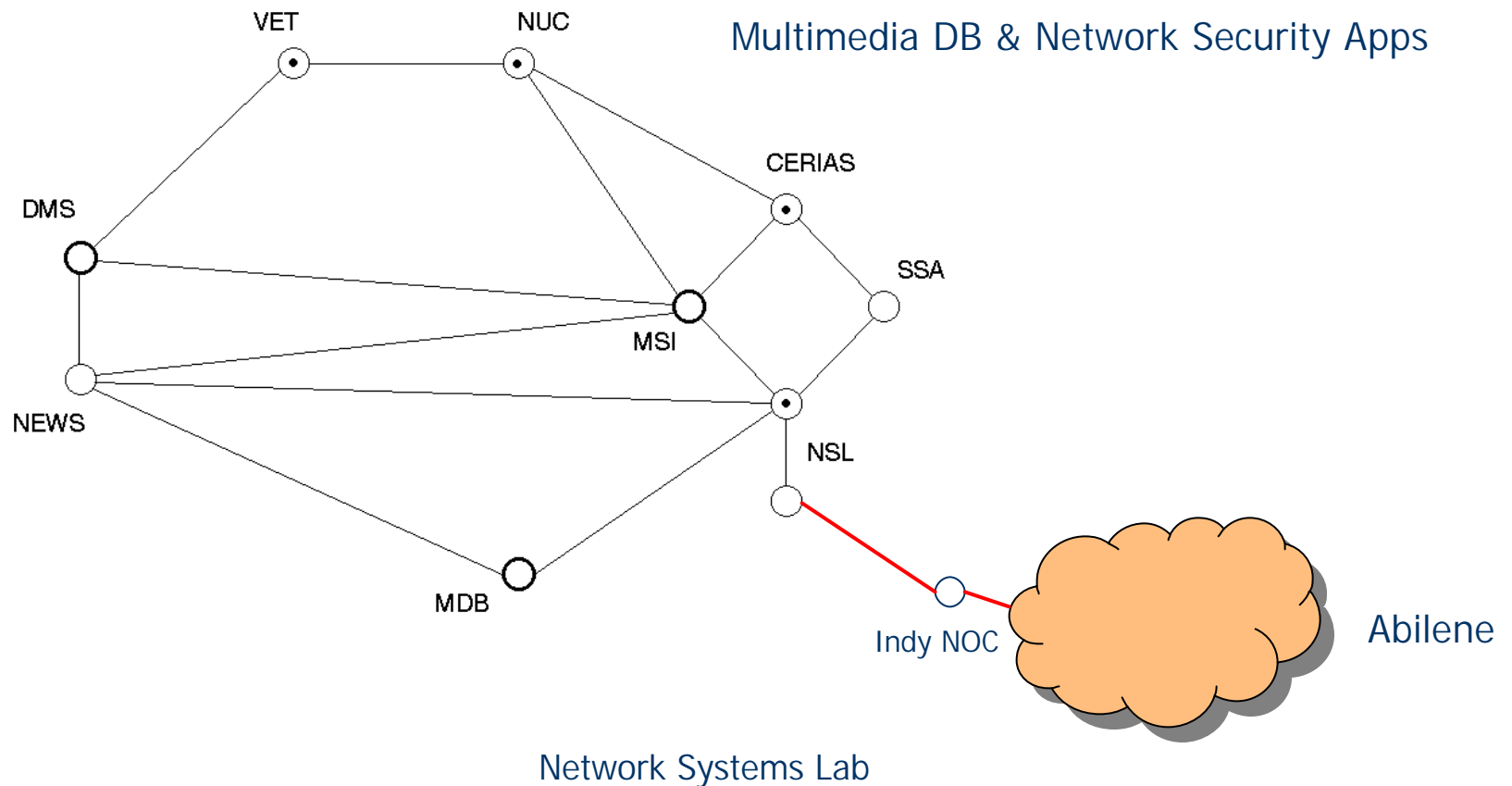
# Adaptive Label Control (cont.)

## Performance Evaluation and Benchmarking

- ◆ Internet2 benchmarking of
  - Multiple time scale traffic control (TCP-MT, AFEC-MT)
  - Adaptive redundancy control (AFEC)
  - Adaptive label control (Diff-Serv router support)
    - vBNS/Abilene
- ◆ Commodity Internet benchmarking
- ◆ Evaluate effectiveness of end-to-end QoS amplification
  - model of future Internet (NGI)

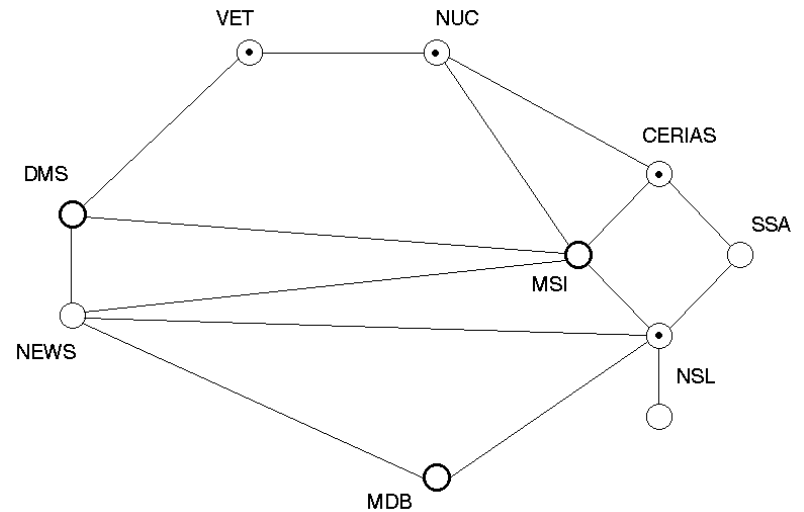
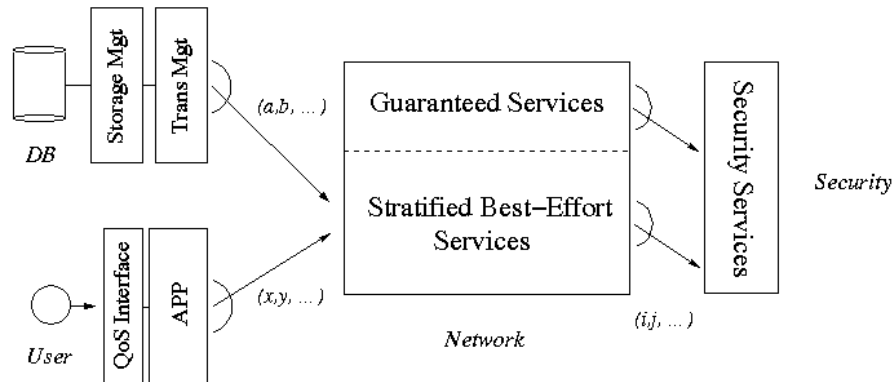
# Adaptive Label Control (cont.)

- ◆ Integration with Purdue Infobahn & QoS peering



# Adaptive Label Control (cont.)

- ◆ Application Benchmarking:





# Collaborations

## ◆ Academic:

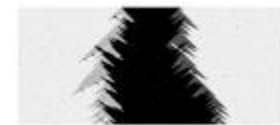
- Boston Univ. (A. Bestavros)
- Ohio State Univ. (J. Hou)
- Santa Fe Institute (Fellow-at-Large)
- Univ. of Wisconsin (P. Barford; WAWM)
- Seoul National Univ. (S. Bahk)

## ◆ Industry/Research Labs:

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- Cisco (F. Baker)
- Sprint (K. Metzger)

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  - Sprint
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- ◆ Research assistants & postdocs:
  - RAs: A. Balakrishnan, S. Chen, J. Cruz, G. Nalawade, H. Ren, M. Tripunitara, T. Tuan, W. Wang
  - Postdocs/visting scientists: S. Bahk, H. Lee, J. Park
- ◆ Network Systems Lab
  - <http://www.cs.purdue.edu/nsf>



# Acknowledgments & More Info (cont.)

## ◆ Related publications:

- Chen & Park. An architecture for noncooperative QoS provision in many-switch systems. In *Proc. IEEE INFOCOM*, 1999.
- Cruz & Park. Towards performance-driven system support for distributed computing in clustered environments. *Journal of Parallel and Distributed Computing*, 1999.
- Park & Tuan. Performance evaluation of multiple time scale TCP under self-similar traffic conditions. *ACM Trans. on Modeling and Computer Simulation*, 2000.
- Park & Wang. QoS-sensitive transport of real-time MPEG video using adaptive forward error correction. In *Proc. IEEE Multimedia Systems*, 1999.
- Park & Willinger. *Self-Similar Network Traffic and Performance Evaluation*. Wiley-Interscience, 2000.
- Ren & Park. Toward a theory of differentiated services. In *Proc. IEEE/IFIP IWQoS*, 2000.
- Ren & Park. Efficient shaping of user-specified QoS using aggregate-flow control. In *Proc. International Workshop QoSIS*, Lectures Notes in Computer Science, 2000.
- Tuan & Park. Multiple time scale congestion control for self-similar network traffic. *Performance Evaluation*, 1999.
- Tuan & Park. Multiple time scale redundancy control for QoS-sensitive transport of real-time traffic. In *Proc. IEEE INFOCOM*, 2000