## Chapter 7 NETWORK CALCULUS

Discrete Event Systems
Winter 2004 / 2005

What is Network Calculus?

- Problem:
- Queuing theory (Markov/Jackson assumptions) too optimistic.
- Online theory too pessimistic.
- Worst-case analysis (with bounded adversary) of queuing / flow systems arising in communication networks
- Abstraction of schedulers
- uses min, max as binary operators and integrals
- min-plus and max-plus algebra

Motivation / Introduction

- Preliminary concepts
- Sections 1.2, 1.3, 1.4.1
- Min-Plus linear system theory
- The composition theorem
- 

in Book "Network Calculus" by Le Boudec and Thiran

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## An example



- assume $R(t)=$ sum of arrived traffic in $[0, t]$ is known
- required buffer for a bit rate $c$ is $\sup _{s \leq t}\{R(t)-R(s)-c(t-s)\}$

Arrival and Service Curves

- Similarly to queuing thoery, Internet integrated services use the concepts of arrival curve and service curves



## Arrival Curves

- Arrival curve $\alpha: \quad R(t)-R(s) \leq \alpha(t-s)$

Examples:

- leaky bucket $\alpha(u)=r u+b$
- reasonable arrival curve in the Internet $\alpha(u)=\min (p u+M, r u+b)$


## Service Curve

System S offers a service curve $\beta$ to a flow iff for all $t$ there exists some $s$ such that

$$
R^{*}(t)-R(s) \geq \beta(t-s)
$$



Theorem: The constant rate server has service curve $\beta(t)=c t$
buffer


Proof: take $s=$ beginning of busy period. Then,

$$
\begin{aligned}
& R^{*}(t)-R^{*}(s)=c \quad(t-s) \\
& R^{*}(t)-R(s)=c \quad(t-s)
\end{aligned}
$$

The guaranteed-delay node has service curve $\delta_{T}$


A reasonable model for an Internet router

- rate-latency service curve


## Tight Bounds on delay and backlog

If flow has arrival curve $\alpha$ and node offers service curve $\beta$ then

- backlog $\leq \sup (\alpha(s)-\beta(s))$
- delay $\leq h(\alpha, \beta)$


For reasonable arrival and service curves


- delay bound: $b / R+T$
- backlog bound: $b+r T$


## Min-plus convolution

- Standard convolution:

$$
(f * g)(t)=\int f(t-u) g(u) d u
$$

- Min-plus convolution

$$
f \otimes g(t)=\inf _{u}\{f(t-u)+g(u)\}
$$



## Another linear system theory: Min-Plus

- Standard algebra:
$\mathrm{R},+, \times$
$a \times(b+c)=(a \times b)+(a \times c)$
- Min-Plus algebra:

R, min, +
$a+(b \wedge c)=(a+b) \wedge(a+c)$

## Examples of Min-Plus convolution

- $f \otimes \delta_{T}(t)=f(t-T)$
- convex piecewise linear curves, put segments end to end with increasing slope



$$
=
$$



Arrival and Service Curves vs. Min-Plus

- We can express arrival and service curves with min-plus
- Arrival Curve property means

$$
R \leq R \otimes \alpha
$$

- Service Curve guarantee means

$$
R^{*} \geq R \otimes \beta
$$

The composition theorem

- Theorem: the concatenation of two network elements offering service curves $\beta_{\mathrm{i}}$ and $\beta_{2}$ respectively, offers the service curve $\beta_{1} \otimes \beta_{2}$


Example: Tandem of Routers


T2

R1
$=$


Pay Bursts Only Once


$$
D_{1}+D_{2} \leq\left(2 b+R T_{1}\right) / R+T_{1}+T_{2}
$$

D


$$
D \leq b / R+T_{1}+T_{2}
$$

end to end delay bound is less

