



**Distributed Computer Systems Lab**

<http://disco.informatik.uni-kl.de>



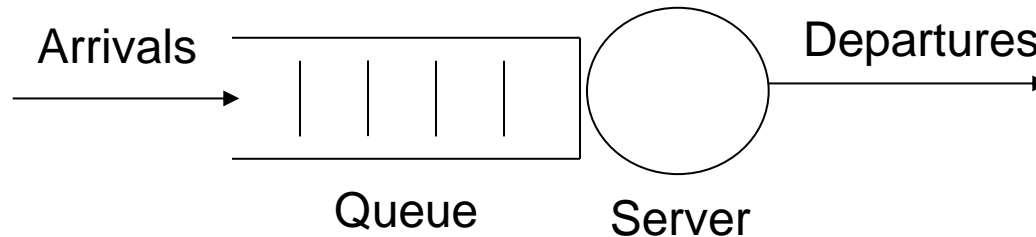
# Performance Modelling of Distributed Systems

## 4. Modelling of the Service Processes

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# The „Canonical“ Problem – Still ...

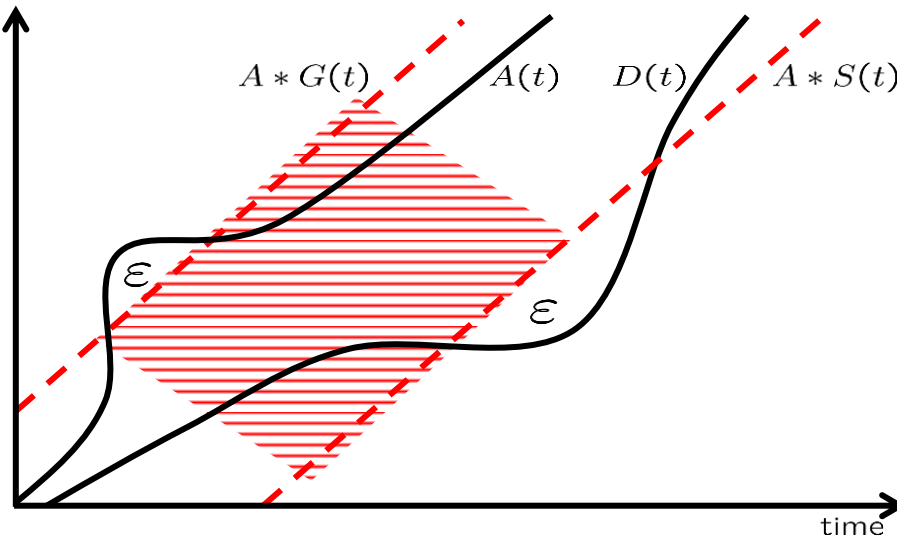
Goal: Compute delay for a single flow at a single server



- QT approach: knowledge about arrival and service distributions
- DNC approach: deterministic bounds on arrivals and service
- SNC approach: **probabilistic** bounds on arrivals and **service**

# Deterministic Bounds on Service (1)

- Lower bound on service necessary to control the system behaviour



- Definition: Strict Service Curve

A service element offers a strict service curve  $\beta : \mathbb{N}_0 \rightarrow \mathbb{R}_0^+$ , if for all backlogged periods  $[m, n]$  and all input flows  $A$  it holds that:

$$D(n) - D(m) \geq \beta(n - m).$$





# Take Step Back: The „Natural“ Laws of Queueing

## ■ Lindley's equation

A service element fulfills Lindley's equation if for all  $q(n) := A(n) - D(n)$  and all input flows  $A$  it holds that:

$$q(n + 1) = [q(n) + a(n + 1) - s(n + 1)]^+,$$

where  $s(n)$  is the amount of data the service element can process at time  $n$ .

## ■ Reich's equation

$$D(n) = \min_{0 \leq k \leq n} \{A(k) + S(k, n)\} =: A \otimes S(n)$$

$$\text{with } S(k, n) := \sum_{i=k+1}^n s(i)$$









# Deterministic Bounds on Service (2)

## ■ Definition: Service Curve

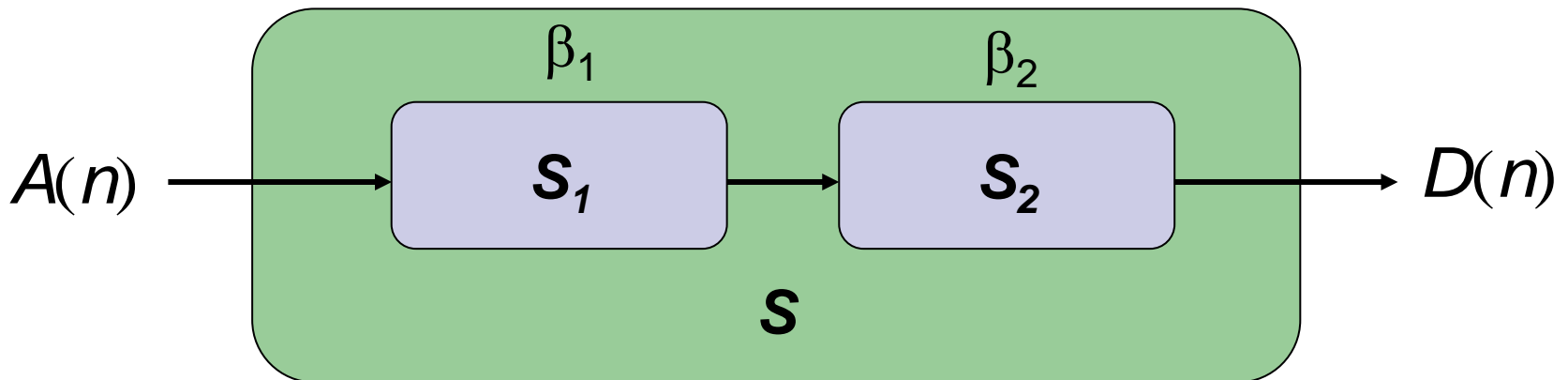
A service element offers a service curve  $\beta : \mathbb{N}_0 \rightarrow \mathbb{R}_0^+$

if for all  $n \geq m \in \mathbb{N}_0$  and all input flows  $A$  it holds that:

$$D(n) \geq \min_{0 \leq k \leq n} \{A(k) + \beta(n - k)\} = A \otimes \beta(n).$$

## ■ Concatenation

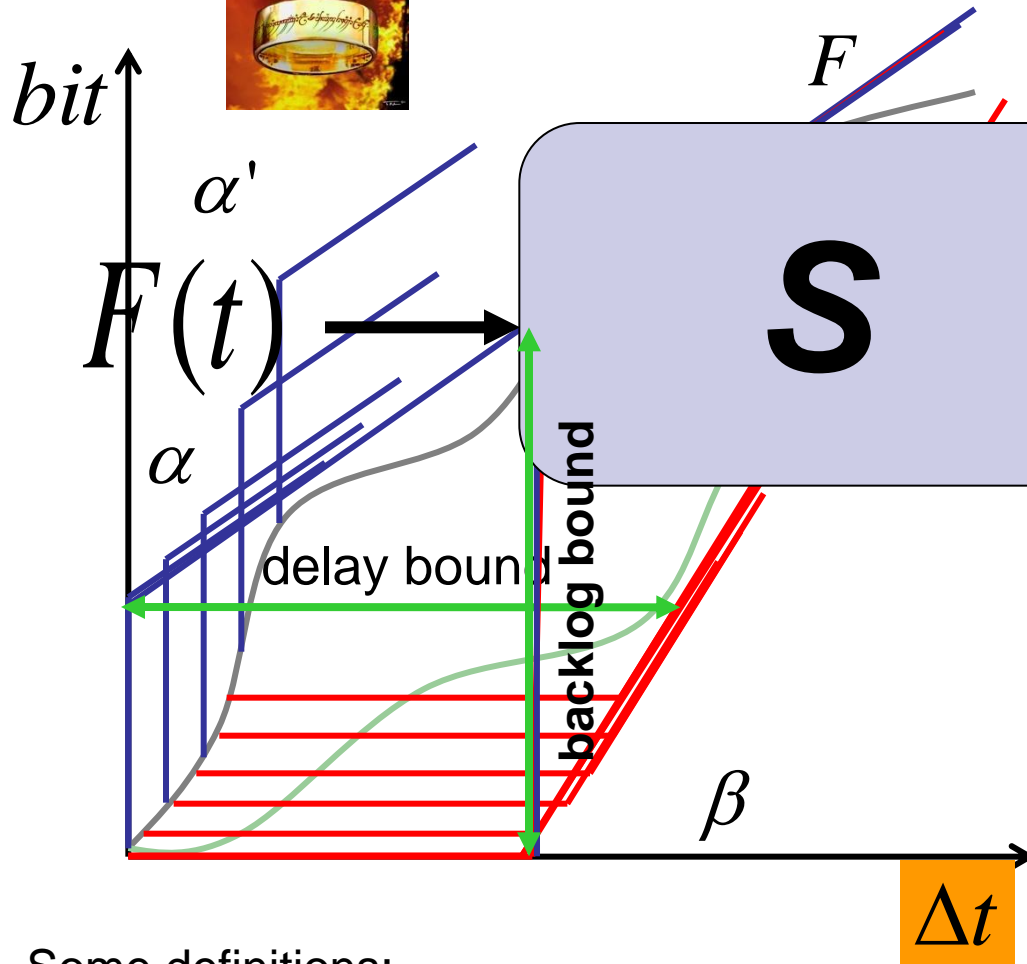
$$\beta_1 \otimes \beta_2$$



## ■ A strict service curve is a service curve but not vice versa

□ If the server is work-conserving then they are equivalent

# Network Calculus – One (Semi-)Ring to Rule them All



arrival curve  $\alpha$

$$\Leftrightarrow F \leq F \otimes \alpha$$

service curve  $\beta$

$$\Leftrightarrow F' \geq F \otimes \beta$$

$$\text{backlog} \leq v(\alpha, \beta)$$

$$\text{delay} \leq h(\alpha, \beta)$$

output bound

$$\alpha' = \alpha \odot \beta$$

Some definitions:

$$(f \otimes g)(t) := \inf_{0 \leq s \leq t} \{f(t-s) + g(s)\}$$

$$(f \odot g)(t) := \sup_{u \geq 0} \{f(t+u) - g(u)\}$$







# Stochastic Bounds on Service

- The (recurring) difficulties of deterministic bounds on service
  - Assume two flows sharing a server, one of them with exponentially i.i.d. increments, (no queueing yet)

## ■ Notation

- triangular array  $\Lambda(\mathbb{N}_0)$
- doubly indexed stochastic process  $\mathcal{S}_2$
- bivariate flow  $\mathcal{F}_2$

## ■ System-theoretic operators

- Remember univariate min-plus convolution

$$A \otimes B(n) = \min_{0 \leq k \leq n} \{A(k) + B(n - k)\}$$

- Bivariate convolution

$$A \otimes B(m, n) := \min_{m \leq k \leq n} \{A(m, k) + B(k, n)\}$$





# Dynamic S-Server

## ■ Definition

Assume a service element has a flow  $A$  as input and the output is denoted by  $D$ . Let  $S \in \mathcal{S}_2$  be a doubly indexed stochastic process with:

$$S(m, n) \leq S(m, n') \quad \forall n \leq n' \in \mathbb{N}_0 \text{ a.s.}$$

The service element is a dynamic S-server if for all  $n \geq 0$  it holds that:  $D(0, n) \geq A \otimes S(0, n)$  a.s.

## ■ Examples

- Deterministic rate-latency service curve
- Left-over service curve





# Stochastic Bounds on Service: MGF and Tail

## ■ Definition (MGF Bound on Service)

A dynamic S-server is  $(\sigma(\theta), \rho(\theta))$ -bounded for some  $\theta > 0$ , if  $\phi_{S(m,n)}(-\theta)$  exists and

$$\phi_{S(m,n)}(-\theta) \leq e^{\theta\rho(\theta)(n-m)+\theta\sigma(\theta)} \quad \forall (m, n) \in \Lambda(\mathbb{N}_0).$$

A dynamic S-server is  $f(\theta, n)$ -bounded for some  $\theta > 0$ , if  $\phi_{S(m,n)}(-\theta)$  exists and

$$\phi_{S(m,n)}(-\theta) \leq f(\theta, n - m) \quad \forall (m, n) \in \Lambda(\mathbb{N}_0).$$

## ■ Definition (Tail Bound on Service)

A dynamic S-server is tail-bounded by envelope  $\alpha$  with error  $\eta$  if for all arrival flows  $A$  and all  $n \in \mathbb{N}_0, \varepsilon \in \mathbb{R}^+$

$$\mathbb{P}(D(0, n) < A \otimes (S - \alpha(\varepsilon))(0, n)) < \eta(n, \varepsilon).$$







