

## Network Calculus

An example for Network Calculus:

Suppose the scenario of Holy Cow! at EPFL

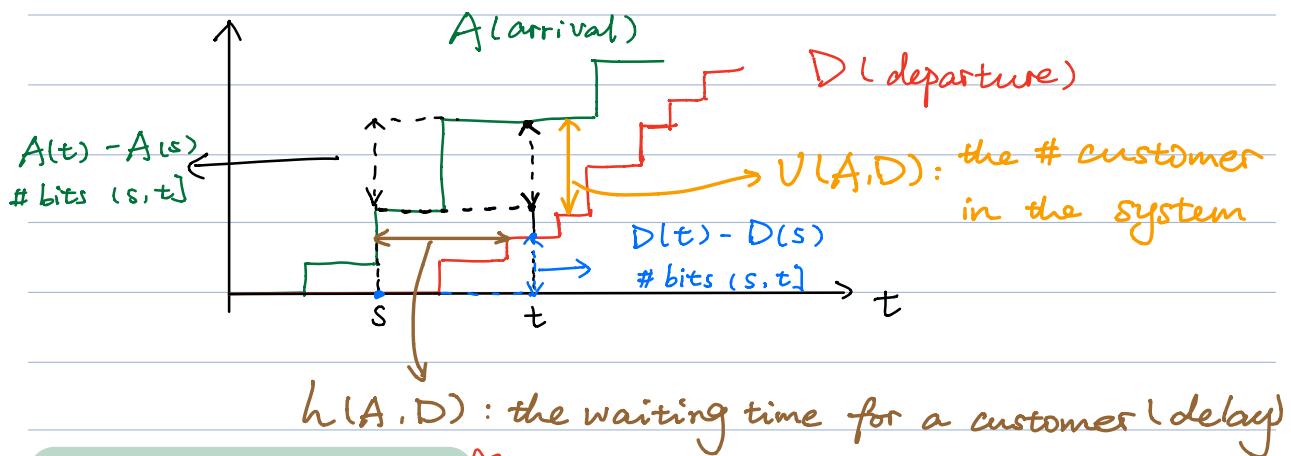
$\text{♀}$  : customers waiting to order (input packets)

$\text{♂}$  : chef (servers)

$\text{♂}$  : customers who get their food (output packets)



The diagram is shown below:



Arrival curve  $\alpha$

$(s, t]$

$$A(t) - A(s) \leq \alpha(t-s)$$

# bits  $(s, t]$  duration of interval

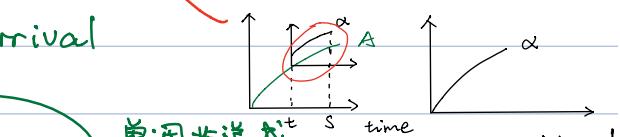
Def. Flow with cumulative function

$R(t)$  has  $\alpha$  as (maximal) arrival

curve if

$$R(t) - R(s) \leq \alpha(t-s)$$

for any  $t \geq s \geq 0$



a monotonic nondecreasing function  $R^+ \rightarrow [0, +\infty]$

## Aggregation Property

If every flow  $f$  has arrival curve  $\alpha_f$ , then the aggregation  $R = \sum f R_f$  has arrival curve  $\sum f \alpha_f$

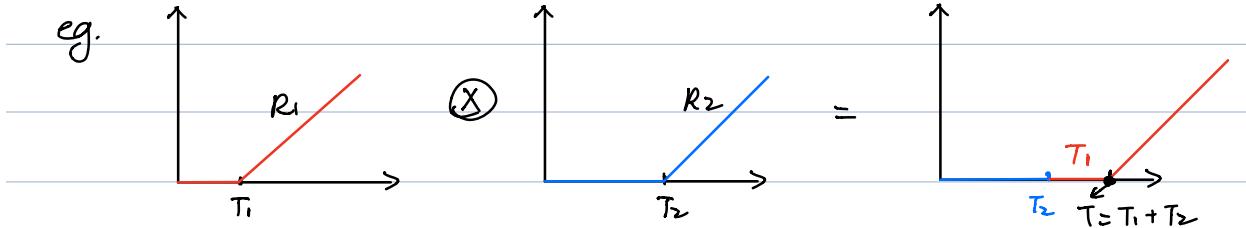
### 卷积 Min-Plus Convolution of $f_1, f_2 \geq 0$

$$f(t) = \inf_{s \geq 0} (f_1(s) + f_2(t-s))$$

$f = f_1 \otimes f_2 \rightarrow$  the max lower bound

- properties:
1.  $(f_1 \otimes f_2) \otimes f_3 = f_1 \otimes (f_2 \otimes f_3)$
  2.  $f_1 \otimes f_2 = f_2 \otimes f_1$

e.g.



### Min-Plus Convolution and Arrival Curves

$\alpha$  is an arrival curve for  $R \Leftrightarrow R(t) \leq R(s) + \alpha(t-s) \quad \forall s \in [0, t]$

$$\Leftrightarrow R(t) \leq R \otimes \alpha$$

Any arrival curve  $\alpha$  can be replaced by its sub-additive closure

$$\bar{\alpha} = \inf \{ \delta_0, \alpha, \alpha \otimes \alpha, \alpha \otimes \alpha \otimes \alpha, \dots \}$$

with  $\delta_0(0) = 0, \delta_0(t) = +\infty$  for  $t > 0$

$\bar{\alpha}$  is sub-additive, i.e.  $\bar{\alpha}(s+t) \leq \bar{\alpha}(s) + \bar{\alpha}(t)$

$$\text{and } \bar{\alpha}(0) = 0$$

when  $\alpha(0) = 0, \alpha$  is a curve for  $R \Leftrightarrow R \otimes \alpha$

e.g. Flow has at most  $L$  bits in any interval of duration  $T$

$$\Leftrightarrow R(t+T) - R(t) \leq L \text{ for all } t$$

(strict) service curve  $\beta$

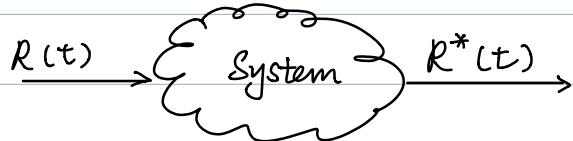
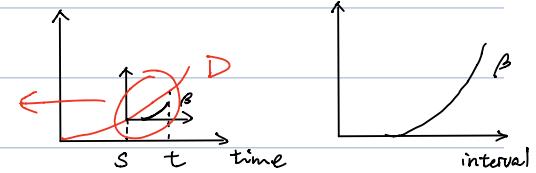
$(s, t]$  a flow is **backlogged (busy)**

$$\Rightarrow \forall \tau \in (s, t], A(\tau) > D(\tau)$$

$$D(t) - D(s) \geq \beta(t-s)$$

# bits departed      Duration

$$D(t) - D(s) \geq \beta(t-s)$$



System offers to this flow a

(minimal) service curve  $\beta$  if

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

$$\forall t \geq 0, \exists s \in [0, t]: R^*(t) \geq R(s) + \beta(t-s)$$

where  $\beta$  is a function:  $R^+ \rightarrow R \cup \{+\infty\}$

System  $S$  offers to a flow a **strict service curve  $\beta$**  if for any  $s < t$  inside a backlogged period, i.e. such that

$$R^*(u) < R(u), \forall u \in (s, t].$$
 we have  $R^*(t) - R^*(s) \geq \beta(t-s)$

$S$  is typically a single queuing point.

strict service curve  $\Rightarrow$  service curve

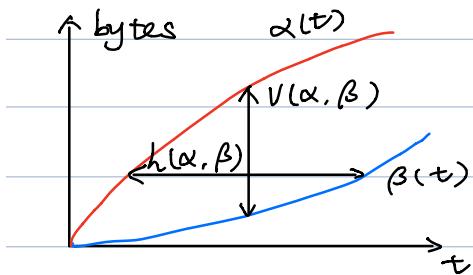
but service curve may not be a strict sc

## Three Tight Bounds



Flow is constrained by arrival

curve  $\alpha$ : served in network element with service curve  $\beta$ . Then



1. **backlog**  $\leq V(\alpha, \beta) = \sup_t (\alpha(t) - \beta(t))$

2. If FIFO for this flow,

- delay**  $\leq h(\alpha, \beta)$

3. **output** is constrained by arrival

curve  $\alpha^*(t) = \sup_{n \geq 0} (\alpha(t+n) - \beta(n))$   
i.e.  $\alpha^* = \alpha \oslash \beta$  (deconvolution)

## Example

One flow, constrained by one token bucket is served in a network element that offers a rate latency service curve

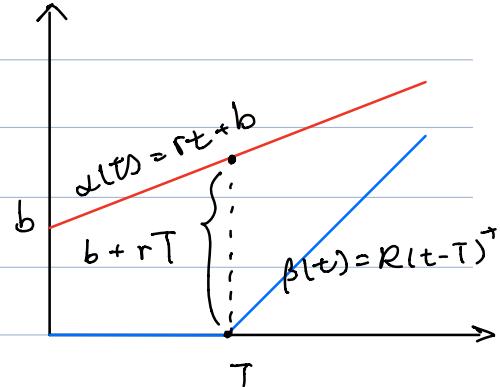
Assume  $r \leq R$

**Backlog bound** :  $b + rT$

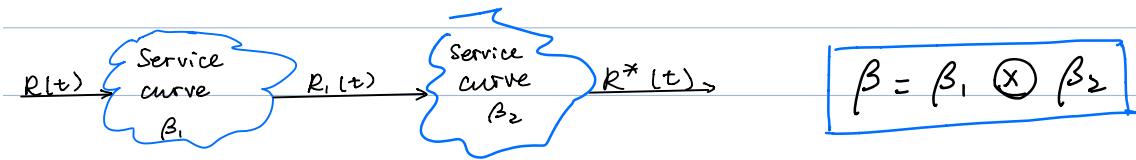
**Delay bound** :  $\frac{b}{R} + T$

**Output arrival curve** :  $\alpha^*(t) = rt + b^*$

with  $b^* = b + rT$



## Concatenation - 一系列相互关联的事

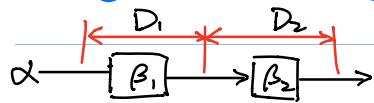


A flow is served in series, network element  $i$  offers service curve  $\beta_i$ . The **concatenation** offers to flow the service curve  $\beta = \beta_1 \otimes \beta_2$

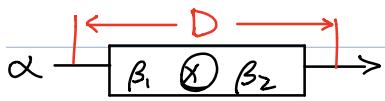
$$\text{Proof: } R^* \geq R_1 \otimes \beta_2 = (R \otimes \beta_1) \otimes \beta_2 = R \otimes (\beta_1 \otimes \beta_2)$$

If  $\beta_i$  is rate-latency  $R_i, T_i$ , then the concatenation  $\beta$  is rate-latency  $R = \min(R_1, R_2)$  and  $T = T_1 + T_2$

### Pay Bursts Only Once



one flow constrained at source by  $\alpha$   
end-to-end delay bound computed



node-by-node (also accounting for increased burstiness at node 2):

$$D_1 + D_2 = \frac{2b + rT_1}{R} + T_1 + T_2$$

$$\alpha(t) = rt + b$$

computed by concatenation:

$$\beta_1(t) = R(t - T_1)^+$$

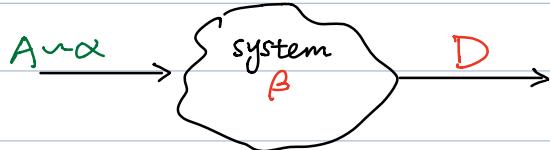
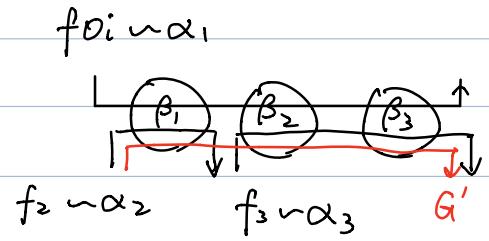
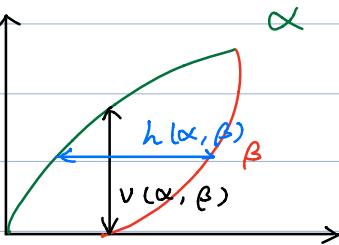
$$D = \frac{b}{R} + T_1 + T_2$$

$$\beta_2(t) = R(t - T_2)^+$$

$$r \leq R$$

i.e. worst cases cannot happen

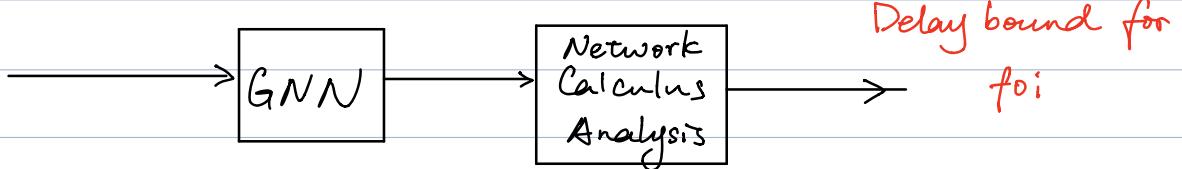
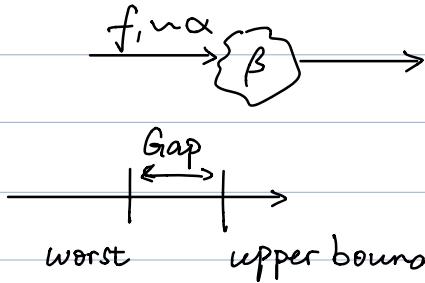
simultaneously - concatenation captures this!



$$D(G, f_{oi})$$

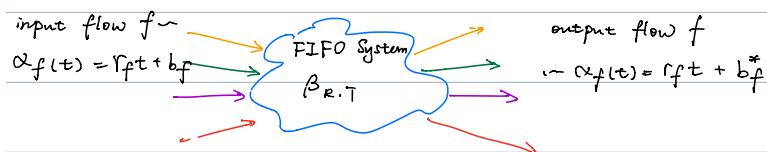
Properties of the system

- 1) FIFO
- 2) Lossless
- 3) Causal



"Delay" and "Backlog" are the two things that we are interested about.

## Analyzing Per-class Networks

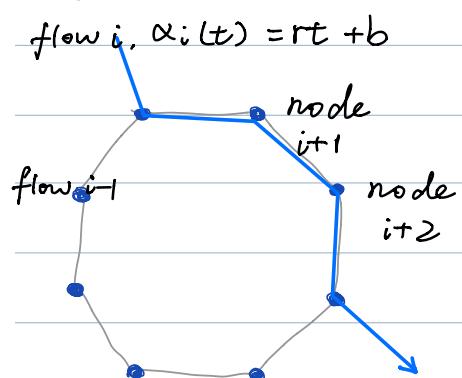


arrival curve for output  $f$  is leaky bucket  $r_f^n, b_f^*$  with

$$b_f^* = b_f + r_f \left( T + \frac{b_{tot} - b_f}{R} \right)$$

Burstiness of every flow inside network increases along its path as a function of other flows' burstiness (**cascade**)

e.g.



$$\text{flow } i, \alpha_i(t) = rt + b$$

$b_j$  = burstiness of every flow  $i$  after  $j$  hops with  $b_0 = b$ :

$$b_j = b_{j-1} + r(T + \frac{b_{tot} - b_{j-1}}{R})$$

$$b_{tot} = b + b_1 + \dots + b_{k-1}$$

Fixed point in  $(b_{tot}, b_1, \dots, b_{k-1})$  has a positive solution when

$$(k-1)r + (1-r)^k < 1, \text{ which occurs for } r < r_{crit}$$

## Other Methods

- Several techniques improve delay bounds, tightness and **Ucrit**: PMOO, PMOC, linear programming, etc.
- There cannot be a bound that depends only on **max aggregate burstiness**, number of hops  $h$  and **link utilization**  $u$  when  $u \geq \frac{1}{h-1}$

## Stability of a FIFO Network

A network instance is **stable** if there is a bound on all delays (or backlog), that is valid for any execution trace of the network. (existence of a bound on all delays  $\Leftrightarrow$  existence of a bound on all backlog)

- An overloaded FIFO network is **NOT** stable
- A single-node network that is underloaded or critical is stable
- A feed-forward network that is underloaded or critical is stable  $\hookrightarrow$  [Boyce et al 2011]
- For any  $\epsilon > 0$  there is an **unstable** underloaded FIFO network with load factor  $u < \epsilon$
- Every underloaded ring is stable
- If the interference condition holds and service curves are strict then the FIFO network is stable; in the special case  $R_i = R, \forall i$ , the condition is  $r_f \leq R / (1 + RIN_f)$  where  $RIN_f$  is the number of flows that interfere with  $f$ .

### Conclusion:

- Network calculus main concepts:
  - ① arrival curve,
  - ② minimal service curve and universal bounds shapers
  - ③ concatenation for packet-based systems and for fluid systems
- Some key results are based on existence of minimal or maximal solutions to functional problems.
- Challenges exist for per-class systems
- Fundamental results use min-plus convolution; other techniques (later-based) can be useful.

