

# WiOpt 2022

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## Time Sensitive Networks, Network Calculus and Clock Non-idealities

Jean-Yves Le Boudec

EPFL I&C, Lausanne, Switzerland

Joint work with Thomas Ludovic, Ehsan Mohammadpour and Hossein Tabatabaeef

**EPFL**

Title: Time Sensitive Networks, Network Calculus and Clock Non-idealities

Abstract: Time Sensitive Networks offer guarantees on worst-case delay, worst-case delay variation and zero congestion loss; in addition, they provide mechanisms for packet duplication in order to hide residual losses due to transmission errors. They find applications in many areas such as factory automation, embedded and vehicular networks, audio-visual studio networks, and in the front-hauls of cellular wireless networks. In this talk we will describe how network calculus can be used to analyze time sensitive networks with components such as packet ordering and duplicate removal functions, schedulers, regulators and dampers. We will also explain why clock non-idealities matter, and will describe how to take them into account.

# Contents

1. Time sensitive Networks
2. Network Calculus, Single Node Analysis
3. Network Analysis
4. Regulators
5. Clock Non Idealities
6. Dampers
7. Packet Re-ordering
8. Packet replication and elimination

## 1. Time Sensitive Networks (IEEE TSN, IETF DetNet)

Time Sensitive networks = deterministic service:

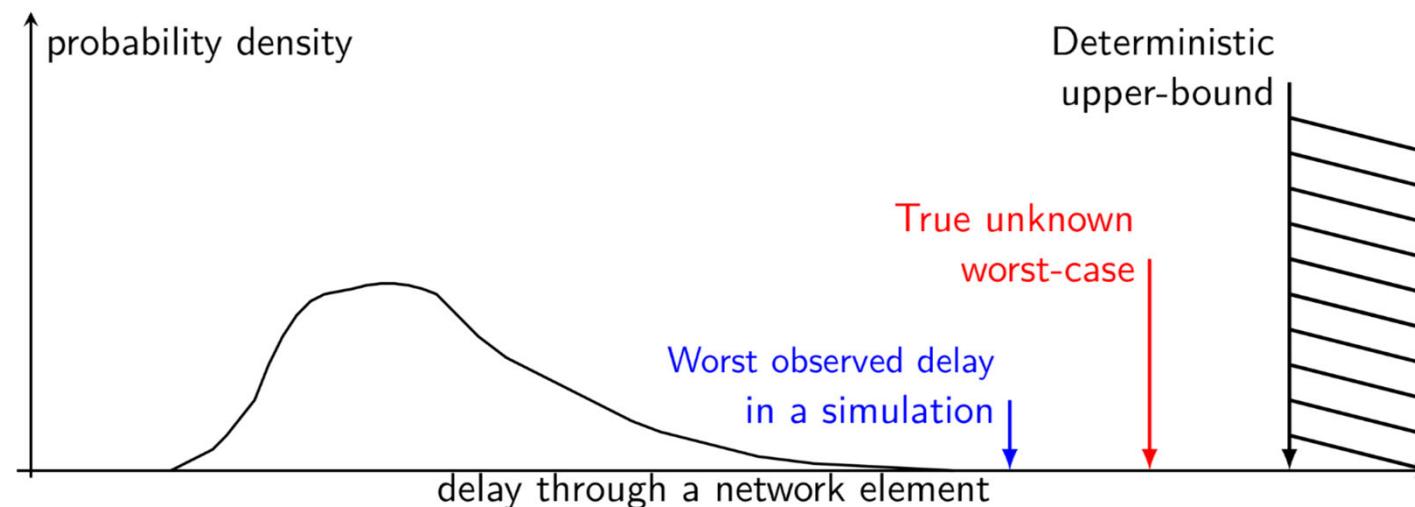
upper bounds on end-to-end delay – not average

upper bound on delay jitter (= worst case – best case delay)

buffer sizing to achieve zero congestion loss.

Congestion control with feedback is not an option here.

Proven bounds are required, simulation is not a solution.



# Time Sensitive Networks: Use Cases

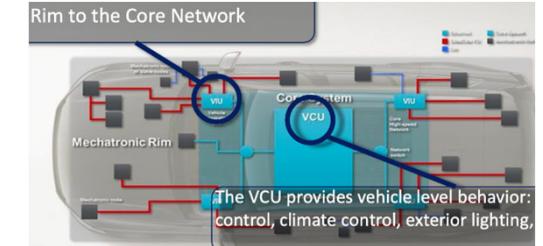
Industrial networks: automotive, aerospace, factory automation

Studio networking

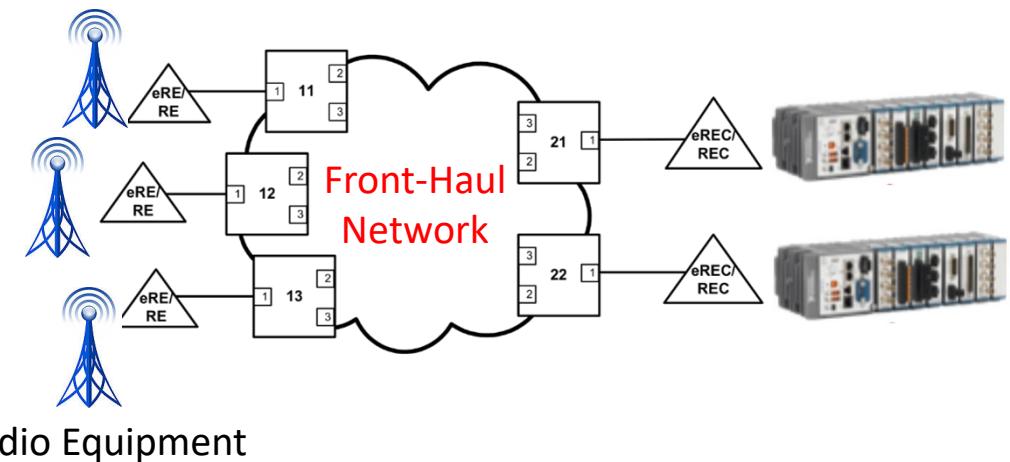
Front-haul of cellular networks

Distributed games

Low latency on-demand video



From [Navet et al,2020]



Standardization:

MAC-layer networks: IEEE TSN (Time Sensitive Networking)

IP and MPLS networks: IETF Detnet (Deterministic Networking)

# How can a Network Offer a Deterministic Service ?

1. Every flow is **constrained at source**

e.g. source is periodic

e.g. source is limited by a token bucket filter with rate  $r$  and burstiness  $b$

→ number of bits sent over any interval of any duration  $t$  is  $\leq rt+b$

(*arrival curve* constraint) (T-SPEC)

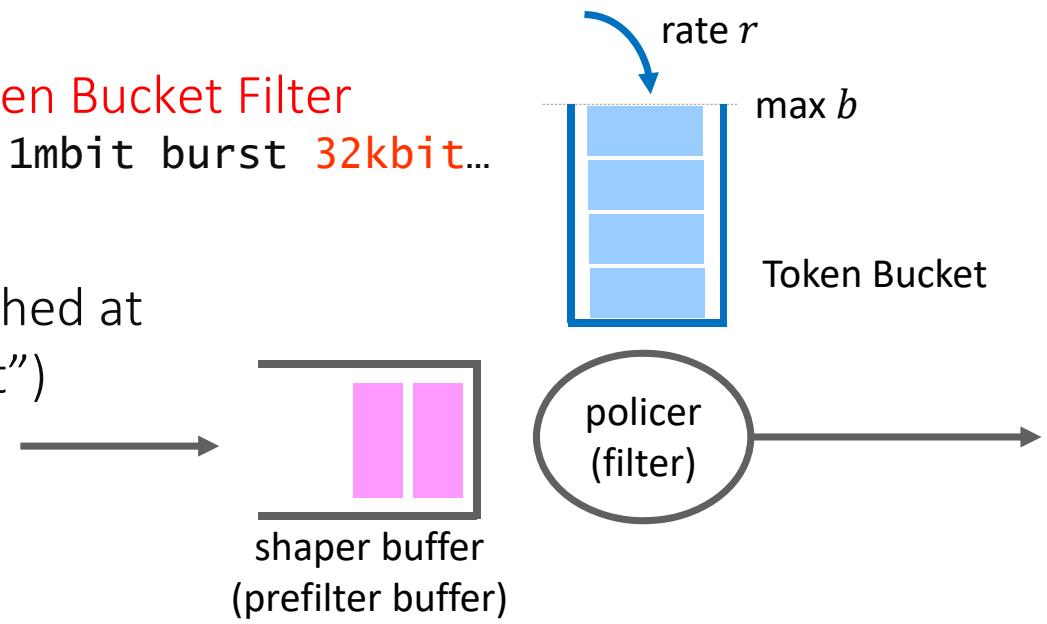
## Token Bucket Filter ( $r, b$ )

Linux implements flow shaping by means of **Token Bucket Filter**

```
tc qdisc add dev eth0 root tbm rate 1mbit burst 32kbit...
```

*Imagine a token bucket, spontaneously replenished at rate  $r$  up to some maximum  $b$  (called the “burst”)*

In order to be released, a packet must consume same amount of tokens as its size.



If there are not enough tokens, packet must wait. As soon as there are enough tokens, packet is released.

This forces the output such that the number of bits sent over any interval of any duration  $t$  is  $\leq rt+b$  (**arrival curve constraint**).

# How can a Network Offer a Deterministic Service ?

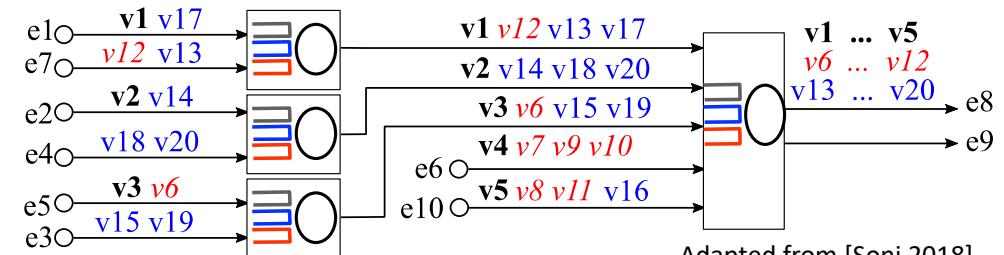
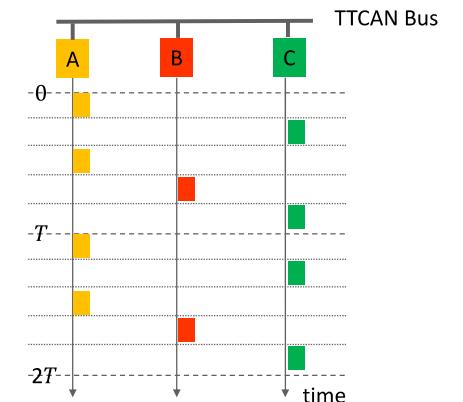
1. Every flow is constrained at source

2. The network nodes offer a guaranteed service to flows or classes of flows

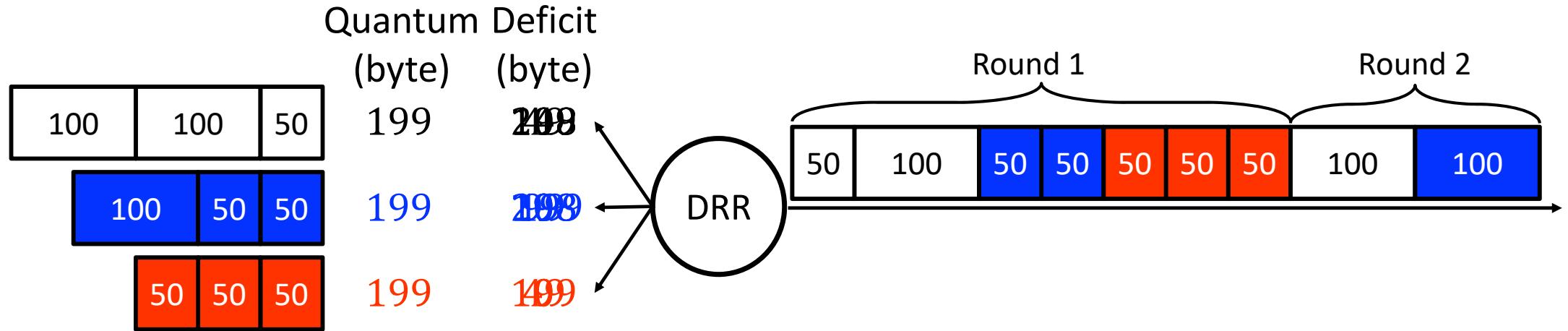
**synchronous**: e.g Time Triggered CAN bus: every flow is scheduled on bus (not our focus today)

**asynchronous**: e.g. switch/router network

- a) Flows are assigned to a small number of **classes** with different quality of service requirements
- b) At every node, traffic of a given class is FIFO; a **scheduler** shares bandwidth and buffer between classes



## Example of Scheduler: Deficit Round Robin (DRR) [Shreedhar 1996]



Implemented in Linux class based queuing    `tc qdisc ... add drr [ quantum bytes ]`

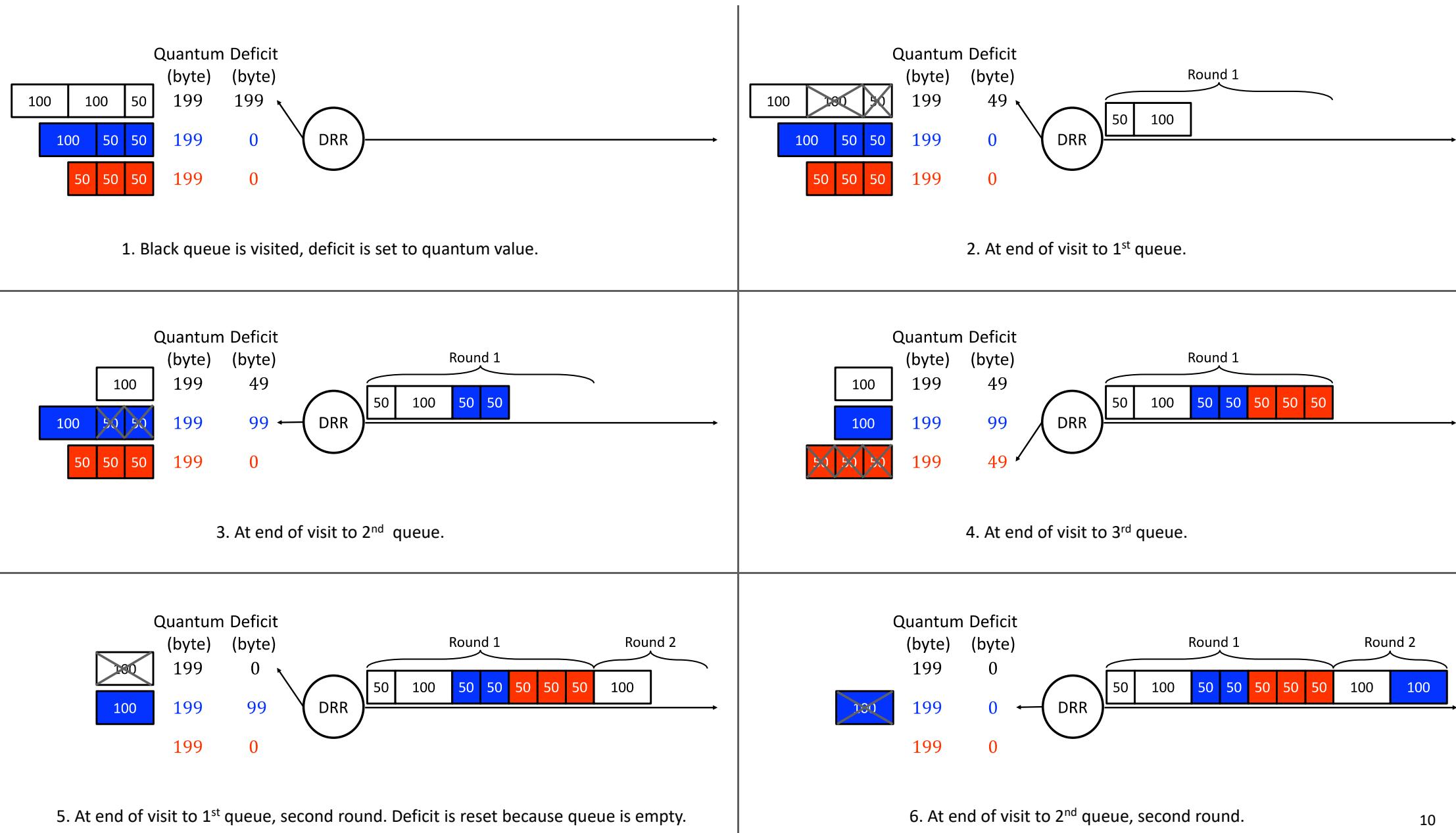
Operation: Each queue (= each class) is given a quantum.

An infinite loop of rounds visits queues.

When a queue is visited its deficit is increased by the quantum.

Service for this queue stops if 1) deficit is smaller than head-of-line packet or 2) queue becomes empty (in which case deficit is reset).

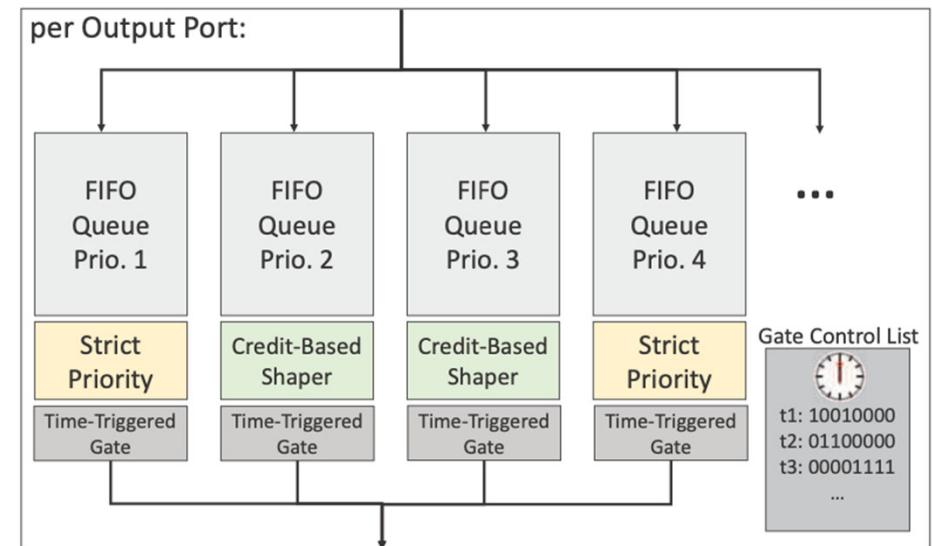
⇒ ≈ Bandwidth is allocated to every class in proportion of the quantum.



## Other Schedulers

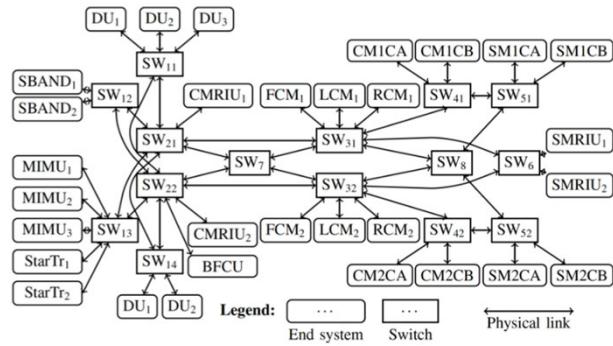
- Weighted Fair Queuing and all variants of Generalized Processor Sharing (such as DRR)
- Audio Visual Bridging (AVB) / Credit Based Shaper (CBS)
- Burst Limiting Shaper
- Time Aware Shaper
- Static Priority

Etc.



Typical IEEE TSN scheduler. From [Maile 2020]

They can be combined.

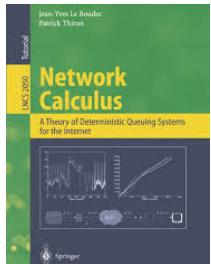


From [Zhao 2018]

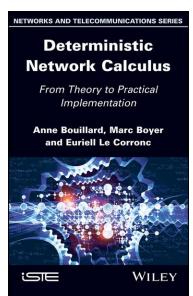
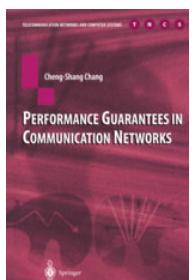
Given source constraints and schedulers, what are the worst-case delay, jitter and backlog ?

## 2. Network Calculus: Single Node Analysis

Finds **bounds** on delay, jitter and backlog that can be **formally proven**.



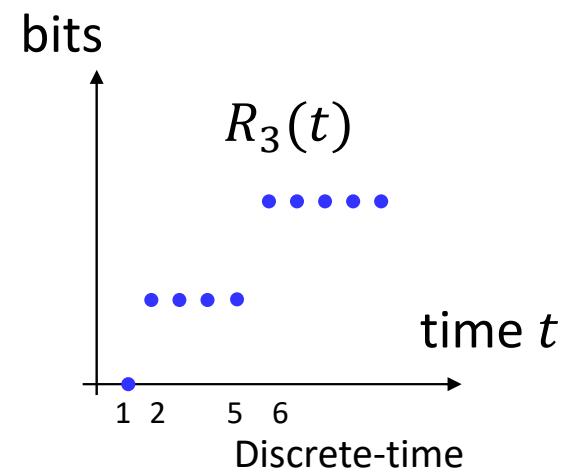
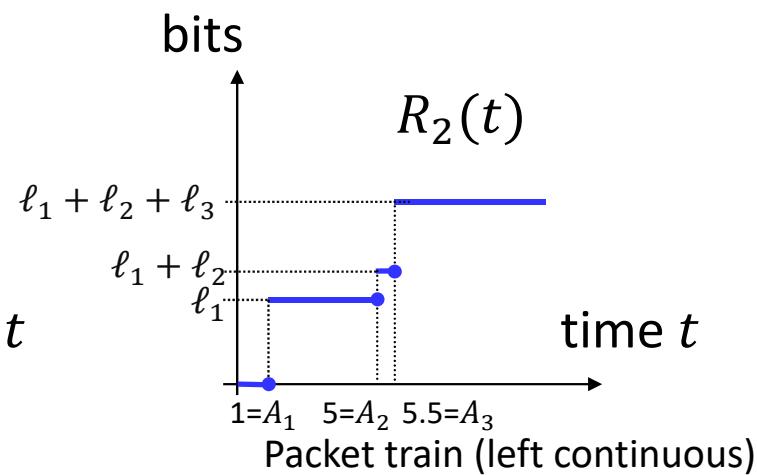
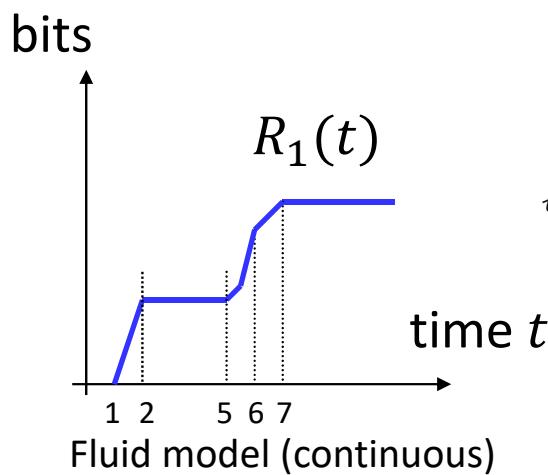
R Cruz, CS Chang, JY Le Boudec, P Thiran, ...



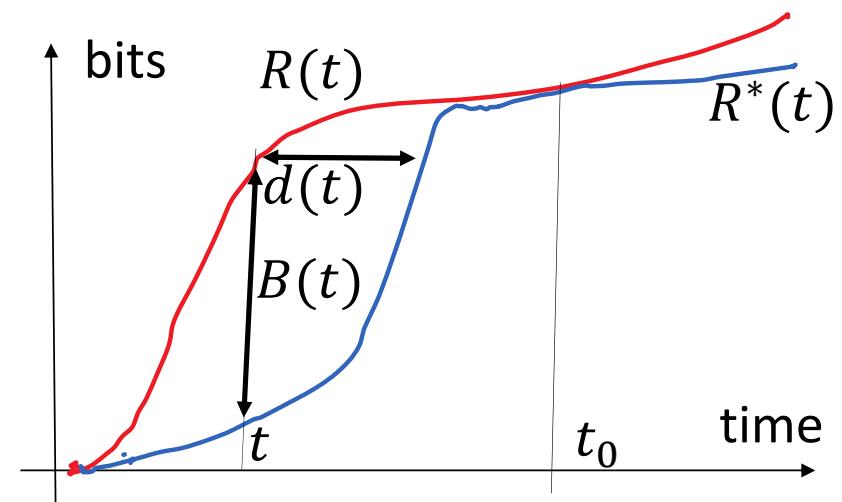
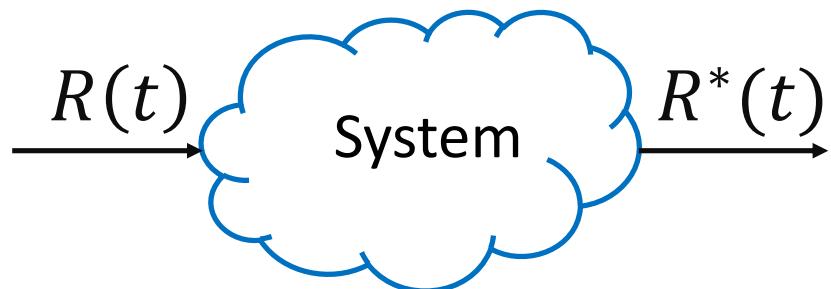
Stochastic extensions exist (not discussed here)

## Representation of Data Flow

Cumulative flow:  $R(t)$ , non-decreasing with  $R(0) = 0$



## Delay and Backlog



Backlog at time  $t = R(t) - R^*(t)$

If System preserves order for this flow: Delay  $\leq h(R, R^*)$

with  $h(R, R^*) = \sup_t d(t)$

and  $d(t) = \inf \{d \text{ s.t. } R(t) \leq R^*(t + d)\}$

(horizontal deviation)

## Arrival Curve

Flow with cumulative function  $R(t)$  has  $\alpha$  as (maximal) arrival curve if

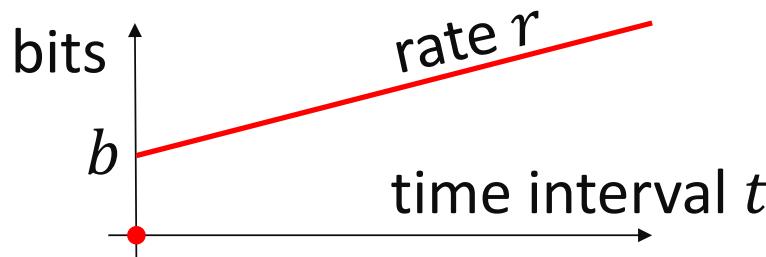
$$R(t) - R(s) \leq \alpha(t - s) \text{ for any } t \geq s \geq 0$$

where  $\alpha$  is a monotonic nondecreasing function  $\mathbb{R}^+ \rightarrow [0, +\infty]$

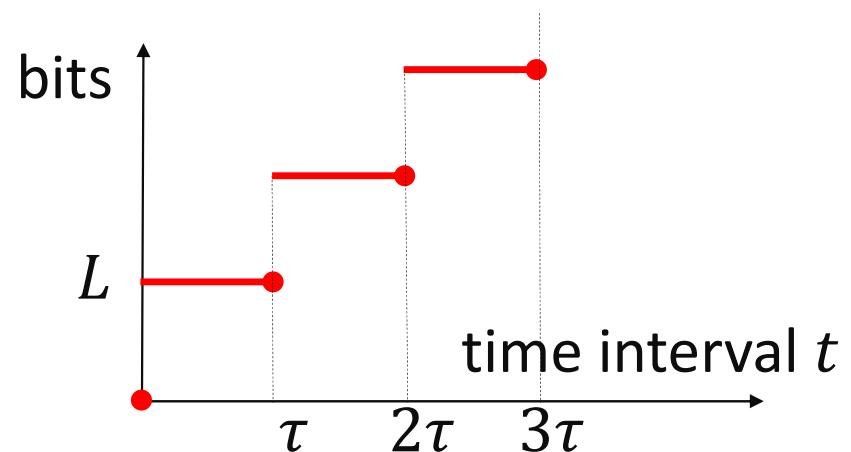
token bucket constraint  $(r, b)$

with rate  $r$  and burst  $b$ :

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



periodic stream of packets of size  $\leq L$ :  $\alpha(t) = L \left\lfloor \frac{t}{\tau} \right\rfloor$



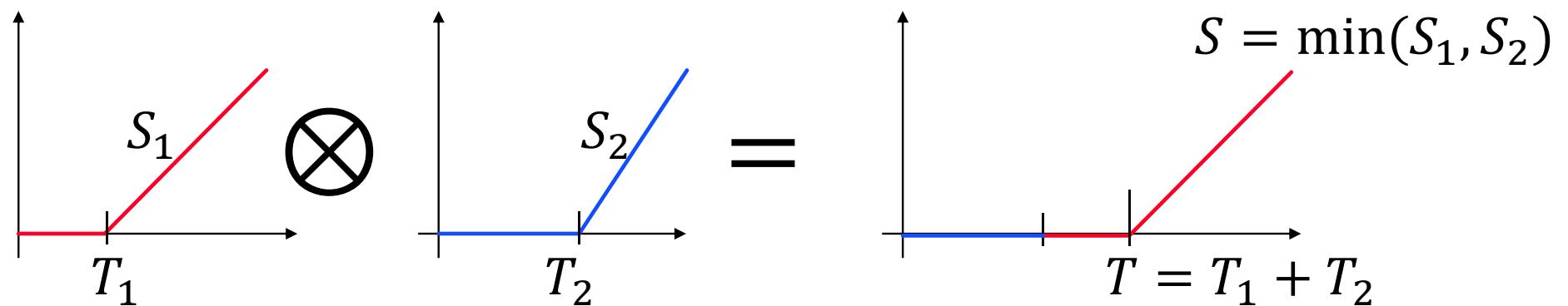
## Min-Plus Convolution of wide-sense increasing functions $[0; +\infty) \rightarrow [0; +\infty]$

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

This operation is called *min-plus convolution*. It has the same nice properties as usual convolution; e.g.

$$(f_1 \otimes f_2) \otimes f_3 = f_1 \otimes (f_2 \otimes f_3)$$
$$f_1 \otimes f_2 = f_2 \otimes f_1$$

It can be computed directly or with tools [Zhou 2020]



## Min-Plus Convolution and Arrival Curves

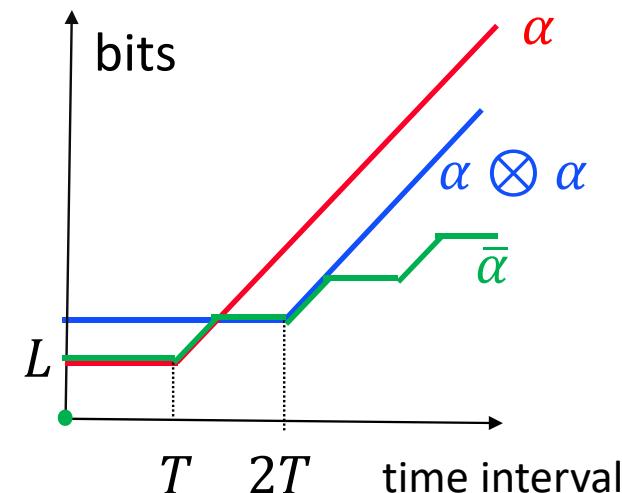
$\alpha$  is an arrival curve for  $R \Leftrightarrow R(t) \leq R(s) + \alpha(t - s), \forall s \in [0, t]$   
 $\Leftrightarrow R \leq R \otimes \alpha$

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.  $\bar{\alpha}(s + t) \leq \bar{\alpha}(s) + \bar{\alpha}(t)$   
and  $\bar{\alpha}(0) = 0$



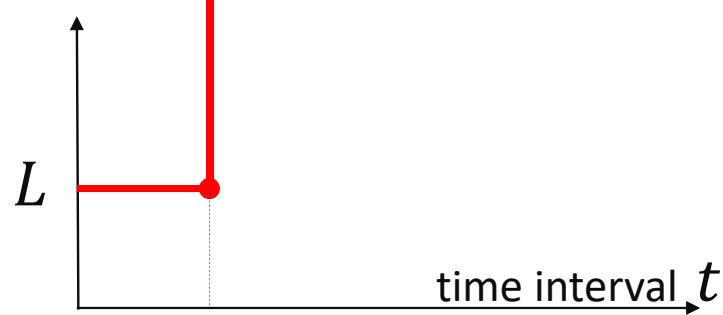
## Example of Sub-Additive Closure

Flow has at most  $L$  bits in any interval of fixed duration  $\tau$

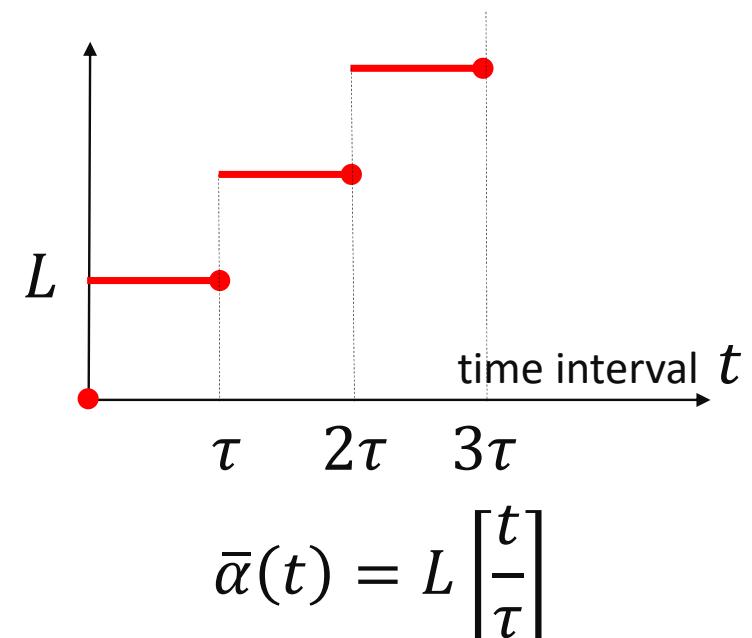
$$\Leftrightarrow R(t + \tau) - R(t) \leq L \text{ for all } t$$

$\Leftrightarrow$  flow has arrival curve  $\alpha$

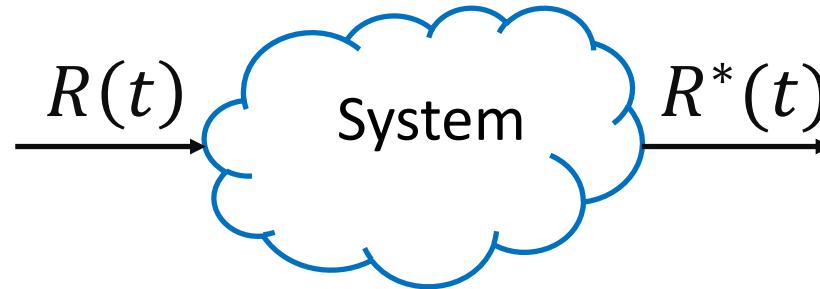
$\Leftrightarrow$  flow has arrival curve  $\bar{\alpha}$



$$\alpha(t) = \begin{cases} L, & t \leq \tau \\ +\infty, & t > \tau \end{cases}$$

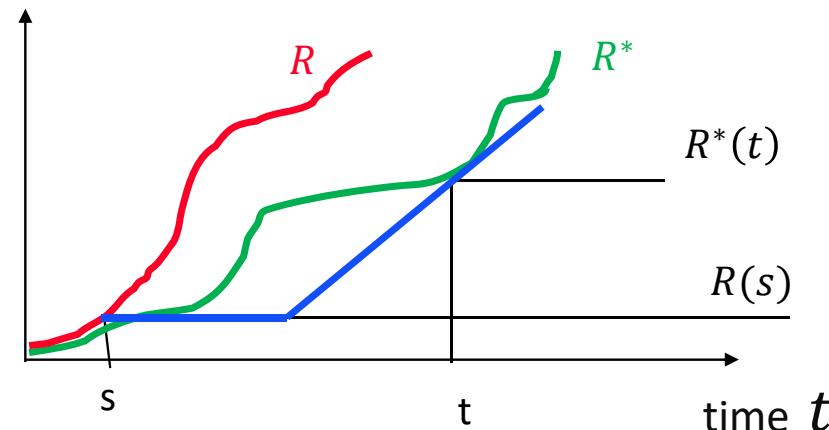
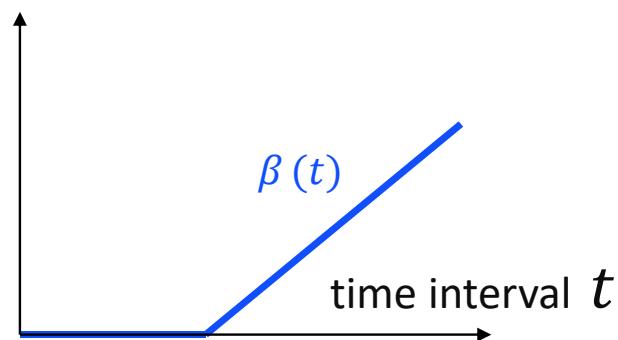


## Service Curve



System offers to this flow a (minimal) service curve  $\beta$  if  $R^* \geq R \otimes \beta$ , i.e. :  
 $\forall t \geq 0, \exists s \in [0, t]: R^*(t) \geq R(s) + \beta(t - s)$

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

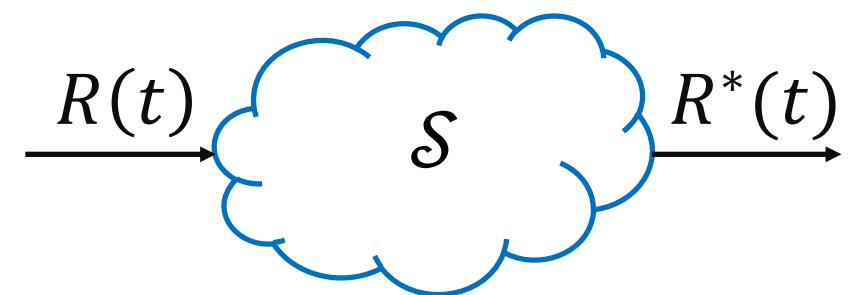


[Le Boudec 1996, Chang 1997, Bouillard 2018]

## Strict Service Curve

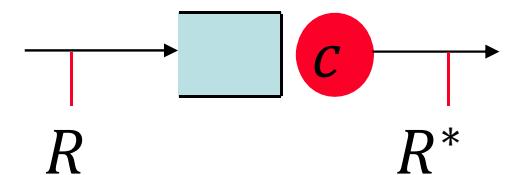
System  $\mathcal{S}$  offers to a flow a **strict service curve**  $\beta$  if for any  $s < t$  inside a backlogged period, i.e. such that  $R^*(u) < R(u), \forall u \in (s, t]$ , we have  $R^*(t) - R^*(s) \geq \beta(t - s)$

$\mathcal{S}$  is typically a single queuing point



$\beta$  is a strict service curve  $\Rightarrow \beta$  is a service curve  
but converse is not true.

Example: constant rate server with line rate  $c$  has  
strict service curve  $\beta(t) = ct$

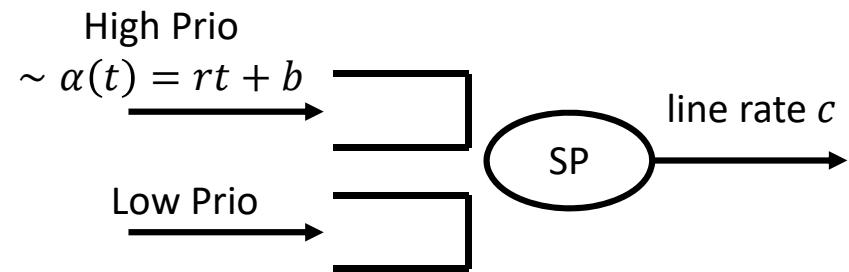


## Example: Non-preemptive Static Priority

High prio:  $\beta_H(t) = (ct - MTU_L)^+$

(strict service curve)

( $MTU_L$  = max packet size, low prio)



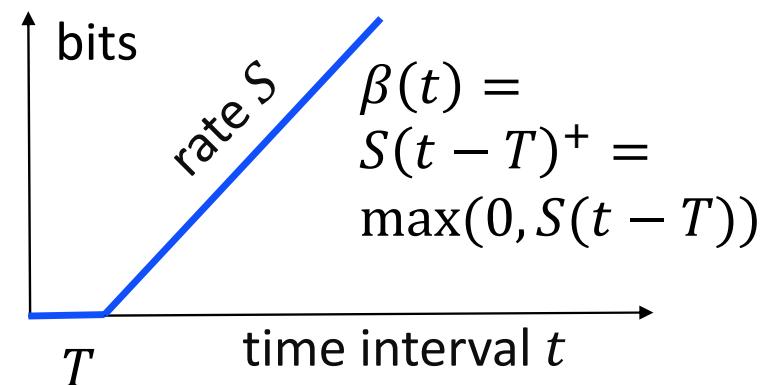
Low prio: when high priority constrained by  $\alpha(t) = rt + b, r < c$ :

$\beta_L(t) = ((c - r)t - b)^+$  (not a strict service curve)

$\beta'_L(t) = ((c - r)t - b - MTU_L)^+$  (strict service curve)

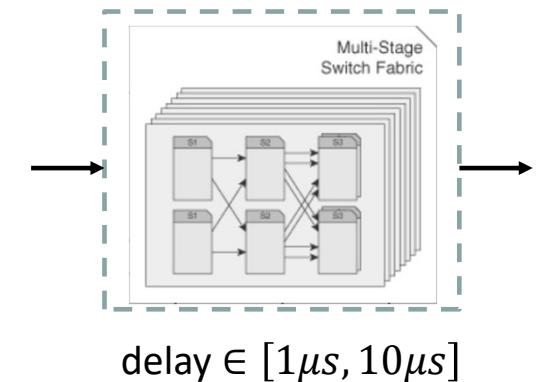
[Bouillard 2018]

A function of the form  $\beta(t) = S(t - T)^+$  is called **rate-latency**, with rate  $S$  and latency  $T$



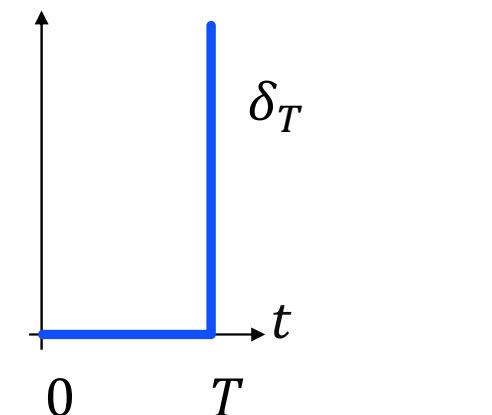
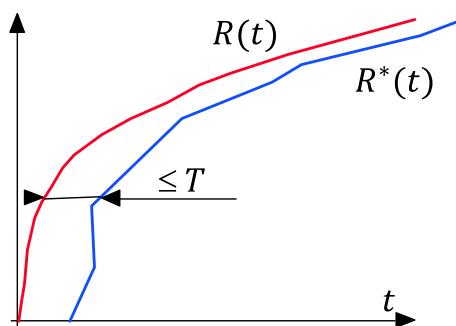
## Bounded Delay Element

Sometimes it is convenient to model a system as a black box with known delay upper bound  $T$ .



For a node that is FIFO for this flow:  $\text{delay} \leq T \Leftrightarrow$  nodes offers to this flow a service curve  $\delta_T$

Not a strict service curve



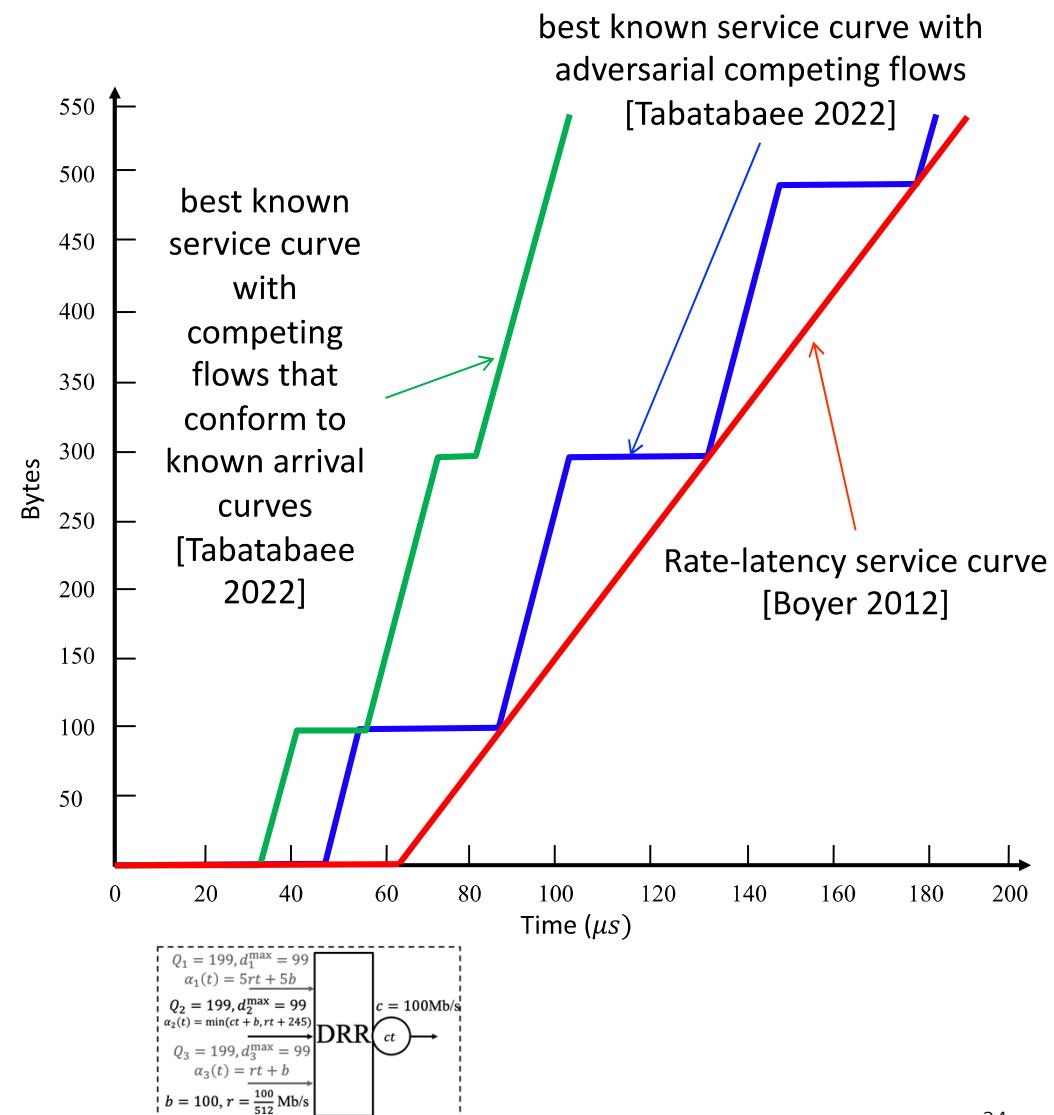
$$\delta_T(t) = 0 \text{ if } t \leq T$$
$$\delta_T(t) = +\infty \text{ if } t > T$$

## Example: Deficit Round Robin

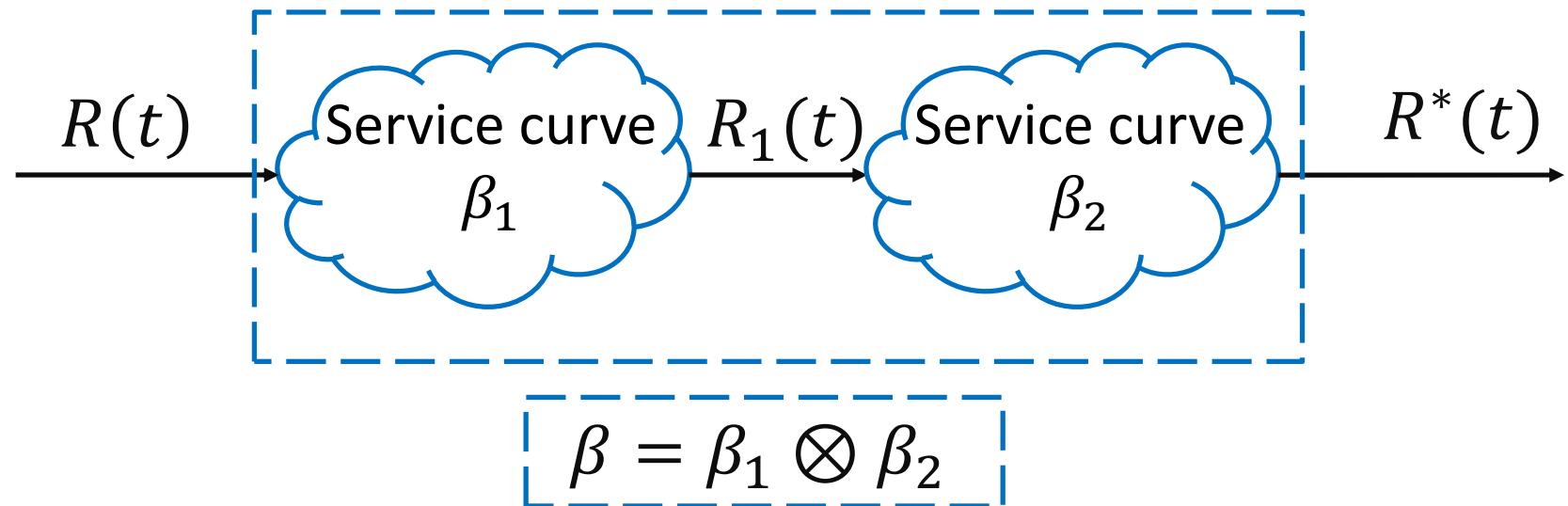
- DRR offers to flow  $i$  a rate-latency strict service curve  $\beta_i(t) = R_i(t - T_i)^+$   
 with  $R_i = \frac{Q_i}{\sum_j Q_j} c$ ,  $T_i = \frac{\bar{Q}_i + \bar{L}_i}{c} + L_{\max,i} \left( \frac{1}{R_i} - \frac{1}{c} \right)$ ,  $\bar{Q}_i = \sum_{j \neq i} Q_j$ ,  $\bar{L}_i = \sum_{j \neq i} L_{\max,j}$   
 and  $c$  is the line rate [Boyer 2012].

Can be improved to more accurate service curves [Tabatabae 2022]

- Other examples: Packetized Generalized Processor Sharing, RFC 2212, IEEE AVB, IEEE TSN, etc. [De Azua 2014] [Bouillard 2018]



## Concatenation of Service Curves

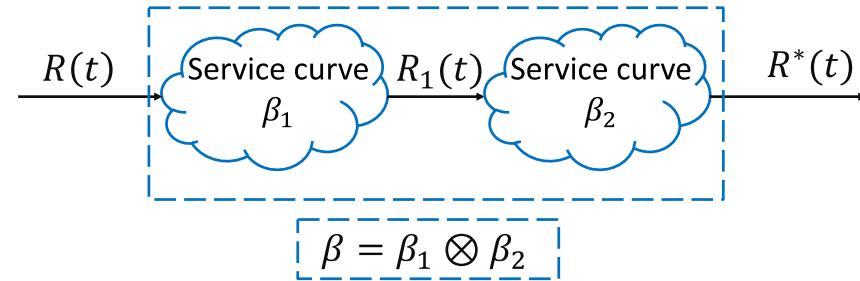


A flow is served in series, network element  $i$  offers service curve  $\beta_i$ .

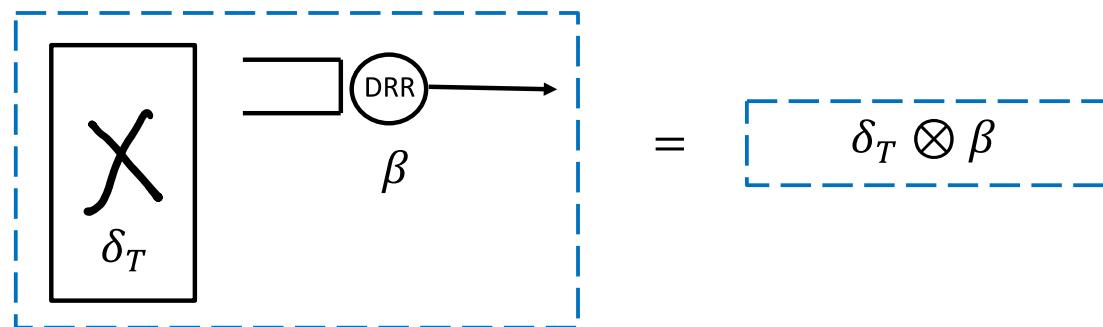
The **concatenation** offers to flow the service curve  $\beta = \beta_1 \otimes \beta_2$

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

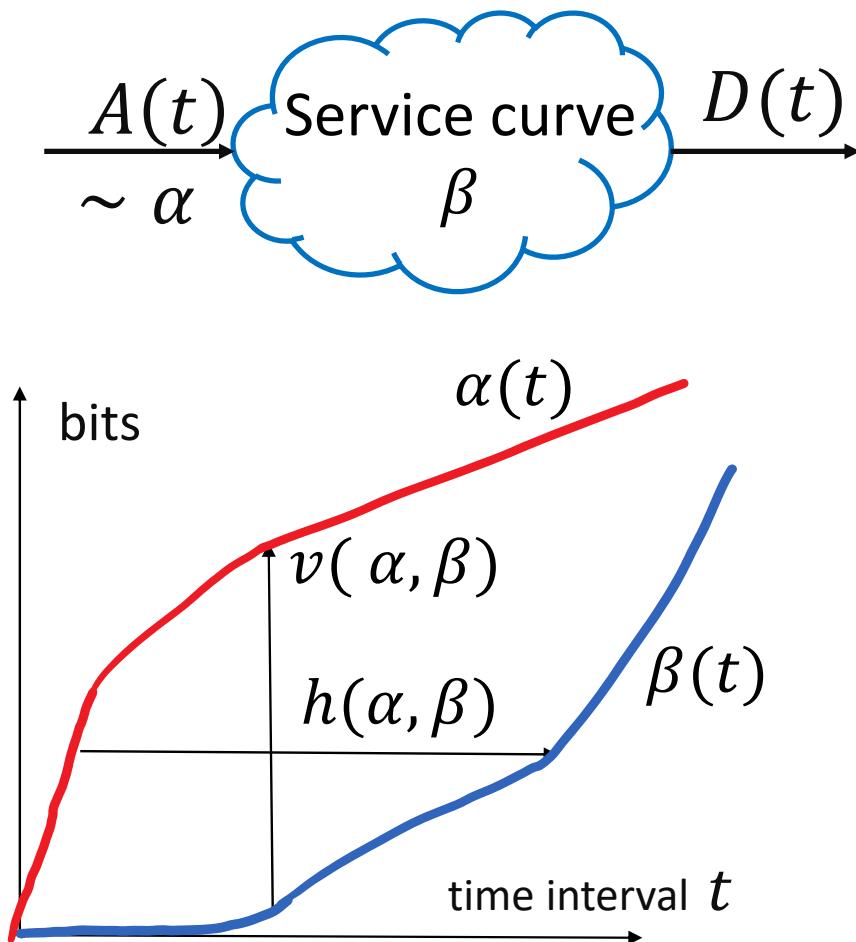
## Example



- If  $\beta_i$  is rate-latency  $R_i, T_i$  then the concatenation  $\beta = \beta_1 \otimes \beta_2$  is rate-latency  $R = \min(R_1, R_2)$  and  $T = T_1 + T_2$
- a scheduler with service curve  $\beta$  combined with a bounded delay element with delay bound  $T$  can be modelled with service curve  $\delta_T \otimes \beta$



## Three Tight Bounds



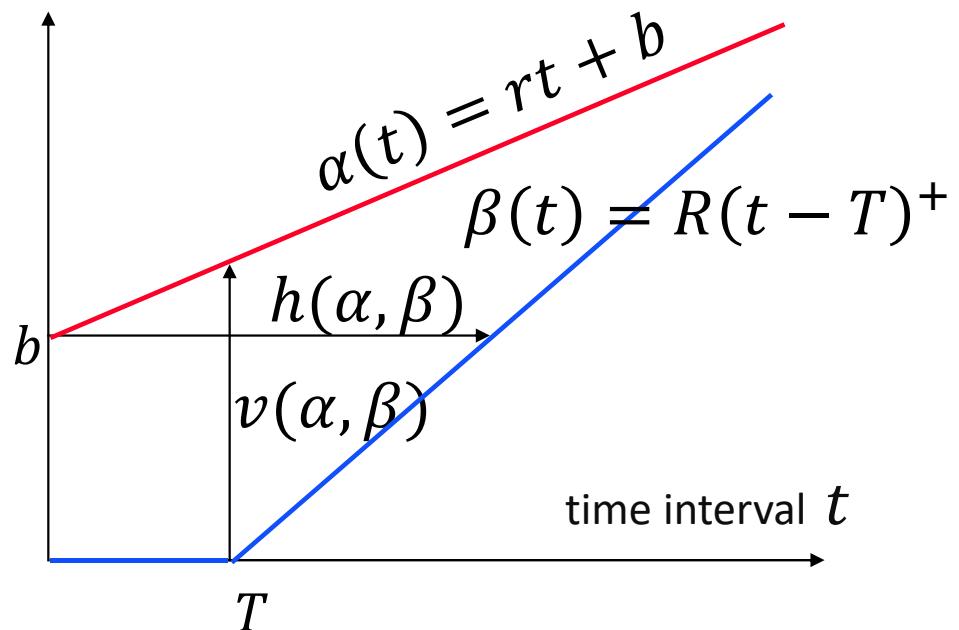
Flow is constrained by arrival curve  $\alpha$ ; served in network element with service curve  $\beta$ . Then

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

Jitter bound =  $h(\alpha, \beta)$  – delay lower bound

Delay bound can be improved if we know line rate of server [Mohammadpour 2019]

## 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:  $b + rT$

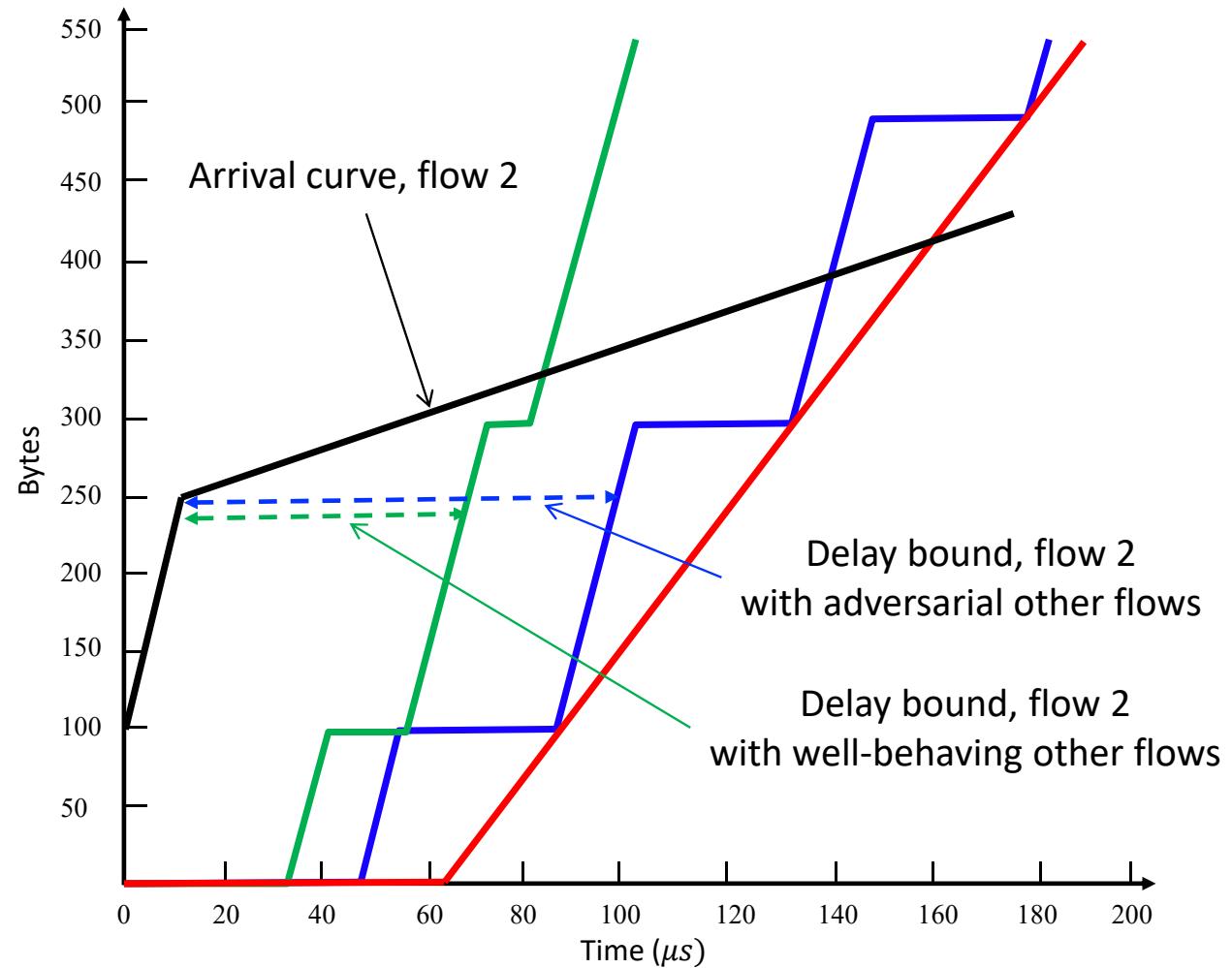
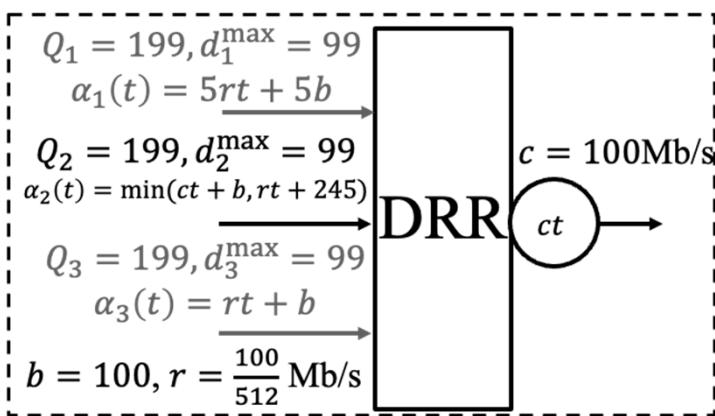
**Delay** bound:  $\frac{b}{R} + T$

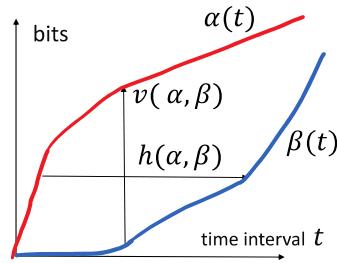
**Output** arrival curve:

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

$$\text{with } b^* = b + rT$$

## Example: DRR





Network calculus uses arrival curves and service curves to derive delay and backlog bounds.

Single node analysis follows immediately.

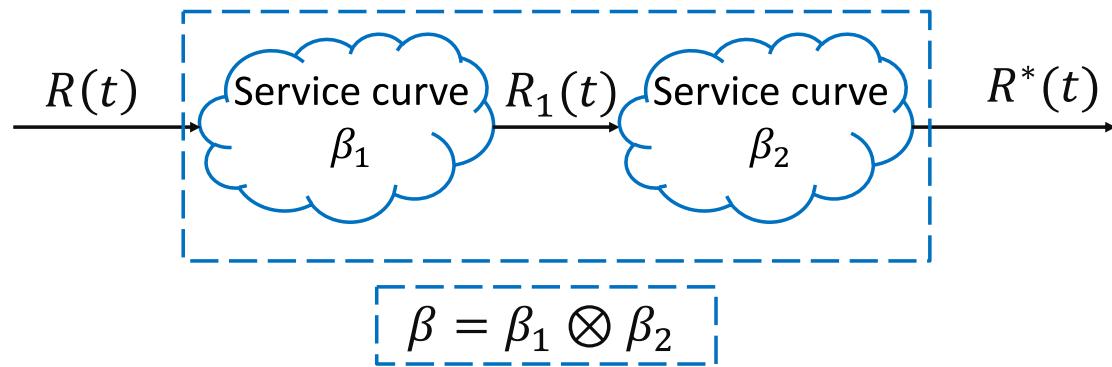
How about network analysis ?

### 3. Network Analysis

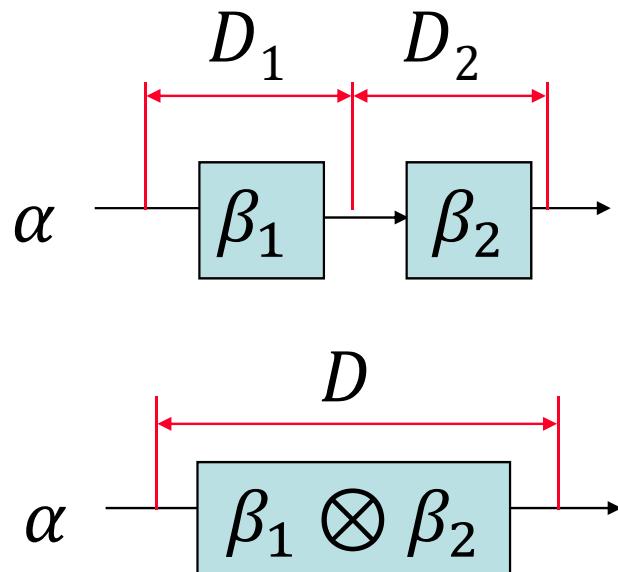
Per-flow network:

network nodes offer guarantees to individual flows  
e.g. IETF IntServ

Solution: apply concatenation result



## Pay Bursts Only Once



$$\begin{aligned}\alpha(t) &= rt + b \\ \beta_1(t) &= R(t - T_1)^+ \\ \beta_2(t) &= R(t - T_2)^+ \\ r &\leq R\end{aligned}$$

In per-flow Network:  
one flow constrained *at source* by  $\alpha$

end-to-end delay bound computed *node-by-node* (also accounting for increased burstiness at node 2):

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

computed by concatenation:

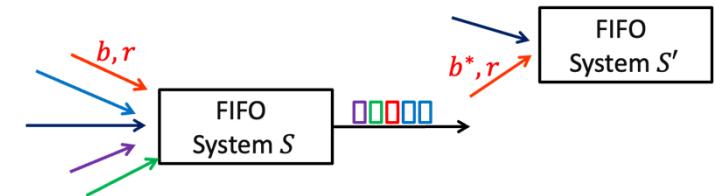
$$D = \frac{b}{R} + T_1 + T_2$$

i.e. worst cases cannot happen simultaneously

## FIFO Per-Class Networks

Most time sensitive networks are **FIFO per-class**:

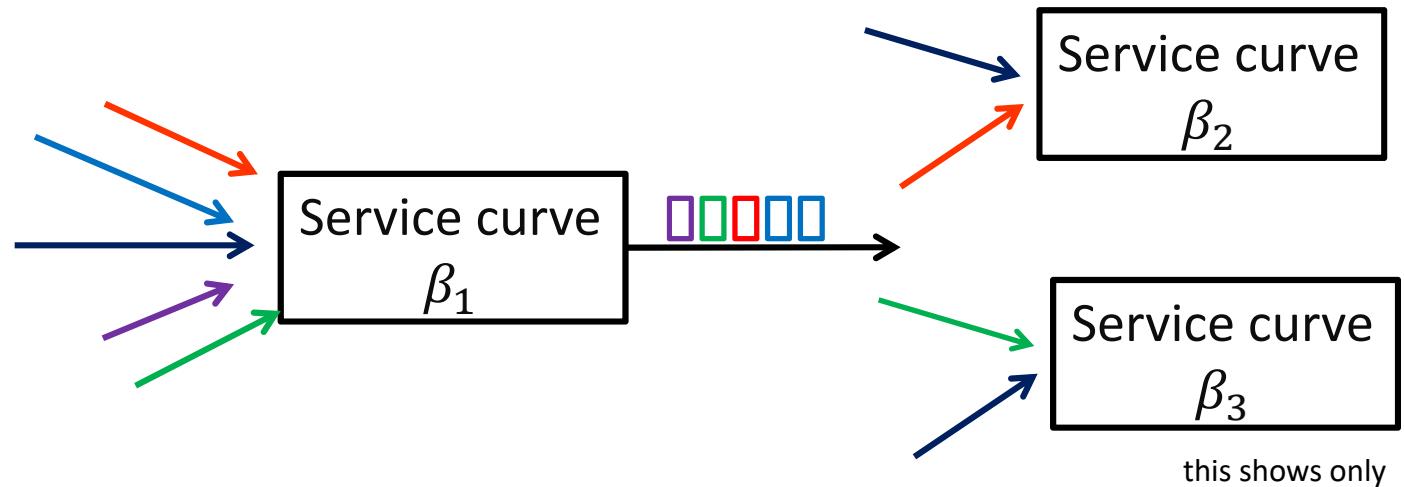
- flows are assigned to classes
- schedulers (such as DRR) separate classes and provide service guarantee to the aggregate of all flows of this class
- Inside a class, service is FIFO
- flows are constrained at sources by arrival curves



Using service curves, such a network can be analyzed per-class

→ one separate FIFO network model per class

## FIFO Networks



Flows merge and split, no simple result as in per-flow networks.

Feedforward networks: obtaining **worst-case delay** is NP-hard  
[Bouillard 2010]

Can be computed with ELP (Exponential Linear Programming)  
[Bouillard 2014]

- service curve, arrival curve and FIFO are expressed as constraints in a linear program
- super-exponential complexity

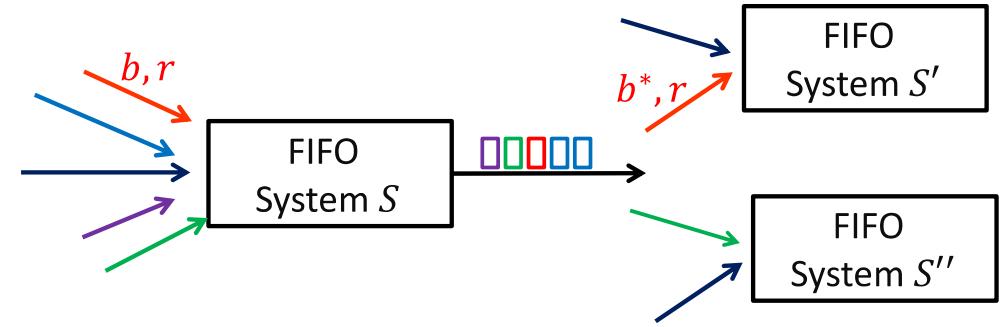
this shows only one class;

the service curves are offered to aggregate of all flows.

## Total Flow Analysis (TFA [Schmitt 2006], TFA++ [Mifdaoui 2017])

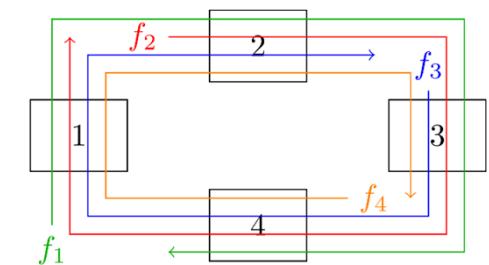
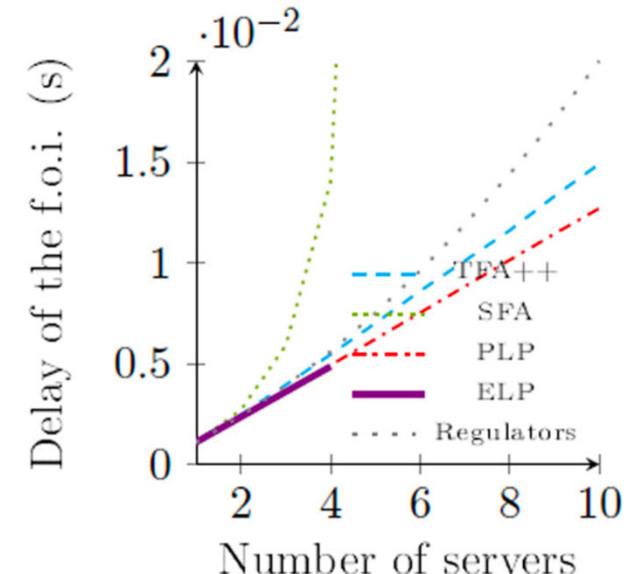
Simple, commonly used method to analyze a generic deterministic network

- Sources are constrained by token buckets
  - a) **Propagated burstiness** of flow at point inside the network is computed by
$$b^* = b + r \times (\text{delay bound between source and here})$$
  - b) **Delay** at every node is computed using single node network calculus, using the propagated burstinesses.  
End-to-end delay bound is sum of nodal bounds on path
- In a feedforward network of depth  $d$ , start at edge nodes and stop in  $d$  iterations
- In a generic network, iterate a) and b) at all nodes until convergence to a **fixpoint** or move to infinity.  
If convergence, the bounds are valid. If divergence, we don't know. [Thomas 2019, Plassart 2022]



## PLP and Other Methods

- PLP (Polynomial Linear Programming) [Bouillard 2022]: relaxation of ELP, with polynomial complexity, uses TFA (and other) bounds as constraints, applies to generic topologies
- Many other methods exist: SFA [Schmitt 2006, Grieu 2004], PMOO, LUDB [Fidler 2003, Lenzini 2006, Bondorf 2017, Geyer 2022] but do not apply to generic topologies;
- Tools: DISCO [Schmitt 2006], WoPaNets [Mifdaoui 2010], Pegase [Boyer 2010]



From [Bouillard 2022]

## Stability of a FIFO Network

Every flow  $f \in \mathcal{F}$  constrained by  $\alpha_f(t) = r_f t + b_f$  at source. Route of flow  $f$  is fixed.  $F_i \subset \mathcal{F}$  is the set of flows passing through node  $i$ .

Every node  $i \in \mathcal{J}$  is FIFO and offers to the aggregate of flows  $f \in F_i$  a rate-latency service curve  $\beta_{R_i, T_i}$ . Load factor  $u = \max_i \left( \frac{\sum_{f \in F_i} r_f}{R_i} \right)$ .  $\mathcal{F}, \mathcal{J}$  finite.

Network **underloaded**:  $u < 1$ ; **overloaded**:  $u > 1$ ; **critical**:  $u = 1$ ;

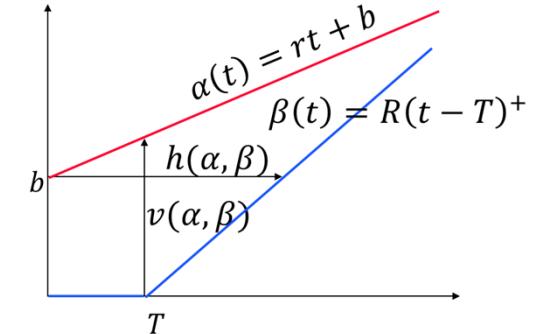
One network instance =  $(\mathcal{F}, r, b, F, \mathcal{J}, R, T)$

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

(existence of a bound on all delays  $\Leftrightarrow$  existence of a bound on all backlogs)

## Which FIFO Networks are Stable ?

- An overloaded FIFO network is not stable.
- A feed-forward network that is underloaded or critical is stable.
- For any  $\varepsilon > 0$  there is an **unstable underloaded** FIFO network with load factor  $u < \varepsilon$  [Andrews 2009]
- Every underloaded **ring** is stable [Tassiulas 1996].
- When PLP (or TFA) does not converge, it may be that network is truly unstable or not. Stability conditions are still an open research issue.



In per-flow networks, deterministic Network analysis is as simple as single node.

In per-class networks and arbitrary topologies, requires finding fixpoints (with e.g. TFA or PLP).

Underloaded networks may be unstable.

## 4. Regulators

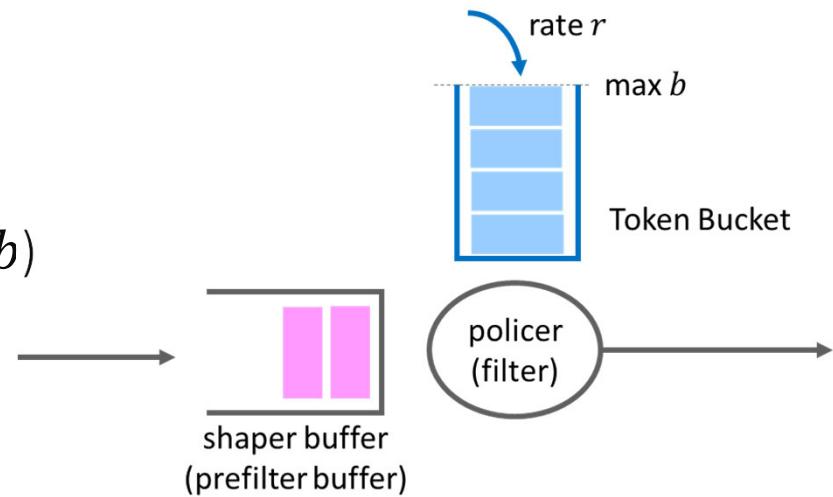
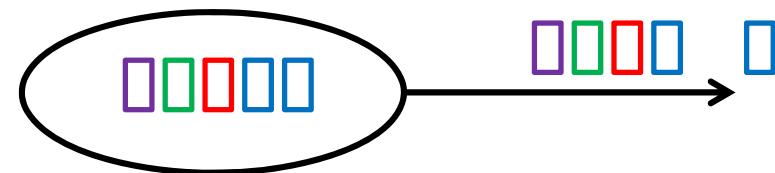
Regulator (= shaper) delays packets in order to limit burstiness to a prescribed value (i.e. enforces an arrival curve constraint).

Non work-conserving.

Example: Token Bucket regulator  
(regulator for the arrival curve constraint  $\alpha(t) = rt + b$ )

Typically placed at source / network edge to protect deterministic network from misbehaving sources

Can also be used inside the network



## Cascading Burstiness

In a per-flow network, burstiness of a flow increases linearly with number of hops, but pay-bursts-only allows to still have good delay bounds.

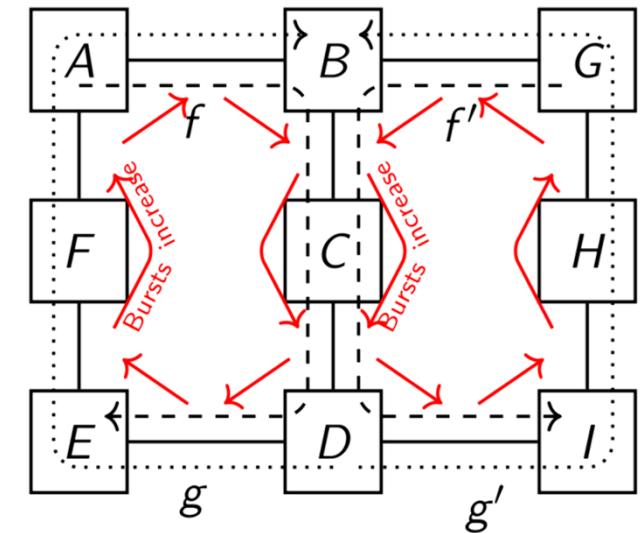
In per-class networks, burstiness of every flow increases at every hop as a function of other flows' burstiness:

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

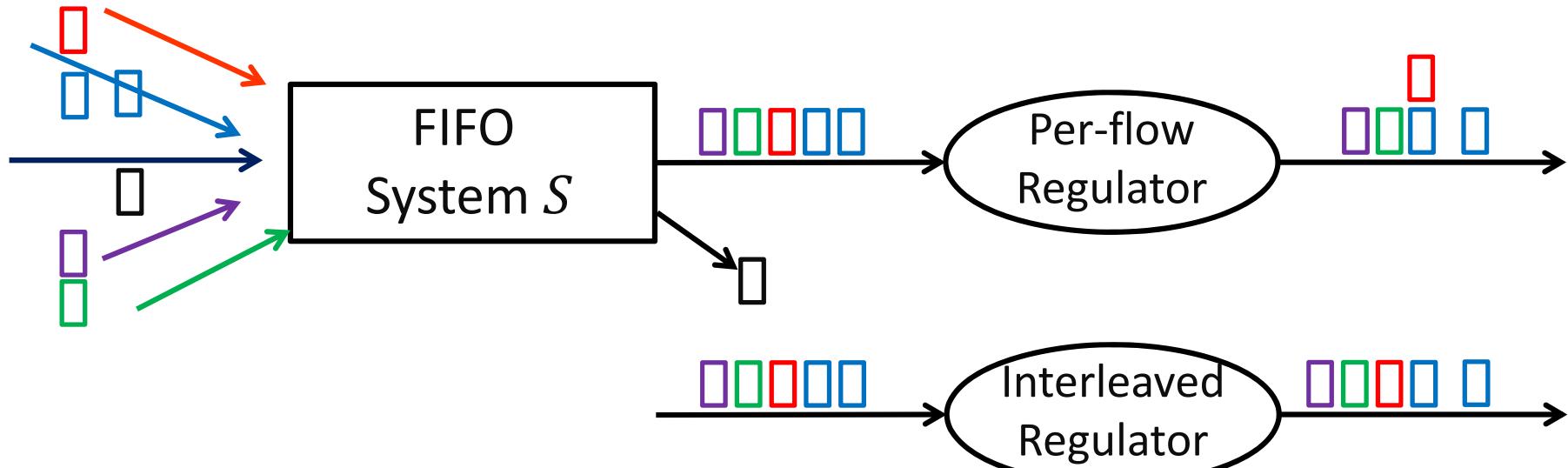
Increased burstiness causes increased burstiness (**cascade**).

Propagated burstiness is computed by PLP / TFA as solution to a fixpoint problem.

Cyclic dependencies are root cause for bad worst-case delays.



## Regulators Avoid Cascading Burstiness in Per-Class Networks

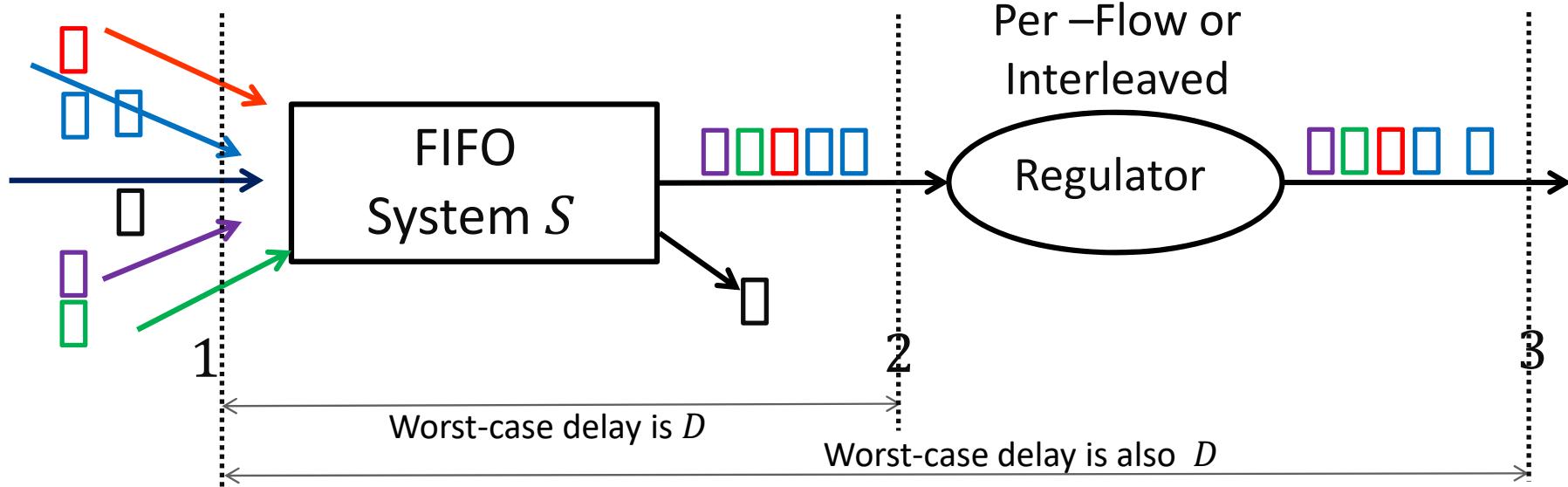


Per flow regulator: one state + one queue per flow.

Interleaved regulator: one state per flow + one global queue:

- packet at head of queue is examined against the arrival constraint (e.g. rate  $r_f$  and burstiness  $b_f$ ) of its flow  $f$ ; this packet is delayed if it came too early; different flows in same queue can have different arrival constraints;
- packets not at head of queue wait for their turn to come [Specht 2016].

## Regulators do not Increase Worst Case Delay



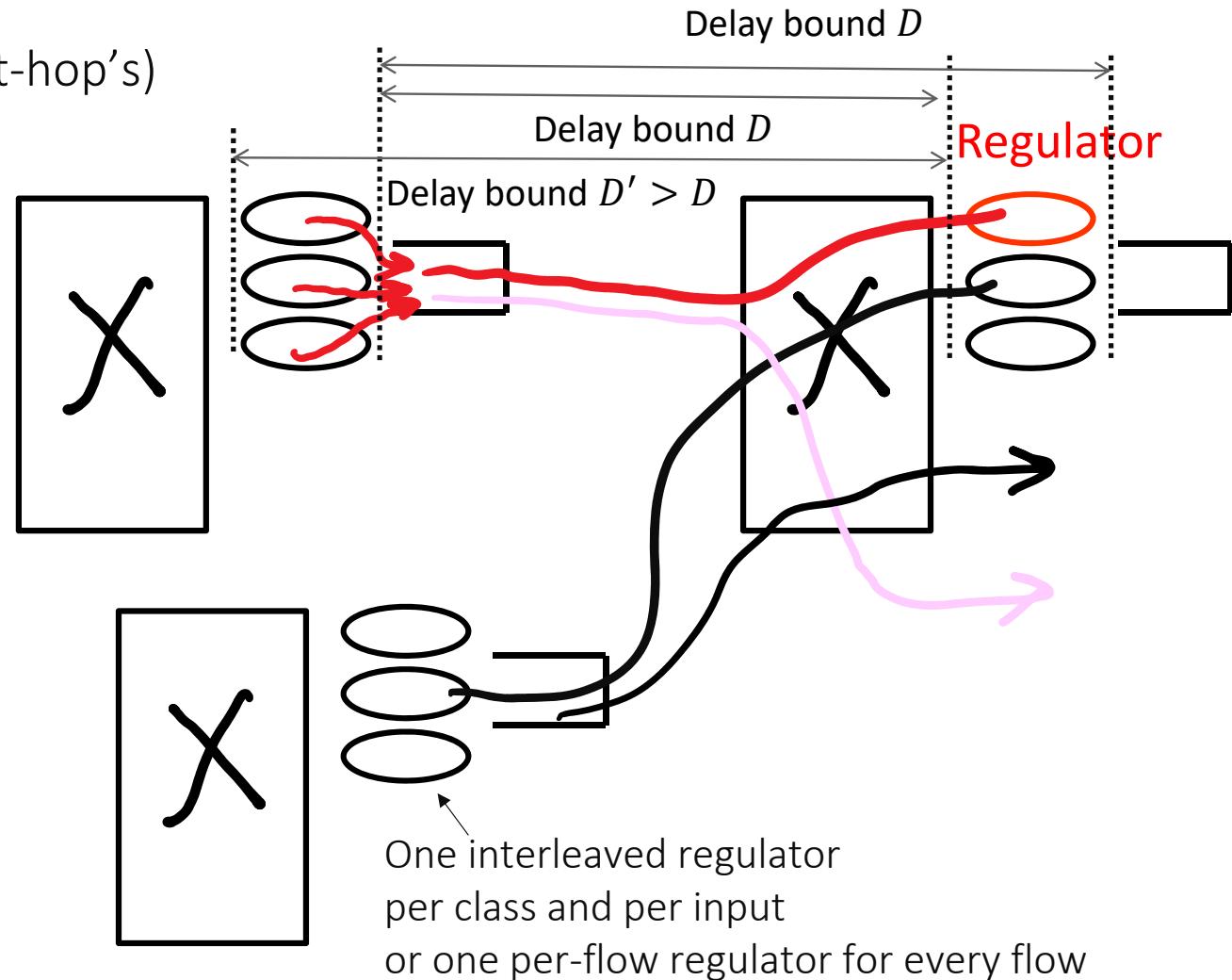
Assume  $S$  is FIFO per flow (per-flow regulator) or globally (interleaved regulator).

Assume every flow satisfies some arrival constraint at 1 (e.g. rate and burstiness) and regulators enforces same constraint at 3.

The worst case delay 1 – 3 is the same as the worst-case delay 1 – 2 [Le Boudec 2018].  
(Reshaping-for-free property)

## Network With Regulators [IEEE TSN ATS]

- Regulators are integrated in (next-hop's) queuing system.
- Worst case **end-to-end** queuing delay can ignore regulators. Worst-case delay at one regulator is absorbed by delay bound at previous hop.
- Queuing delay and backlog at **every hop** can be computed using single node analysis.
- Underloaded network is always stable.



[Mohammadpour 2018]

Deterministic networks use regulators at edge to protect determinism

Can also be deployed internally to avoid burstiness increase / to simplify network analysis

Re-shaping is for free (w.r. to worst-case delay)

## 5. Clock Non Idealties

Previous theory assumes perfect time everywhere.

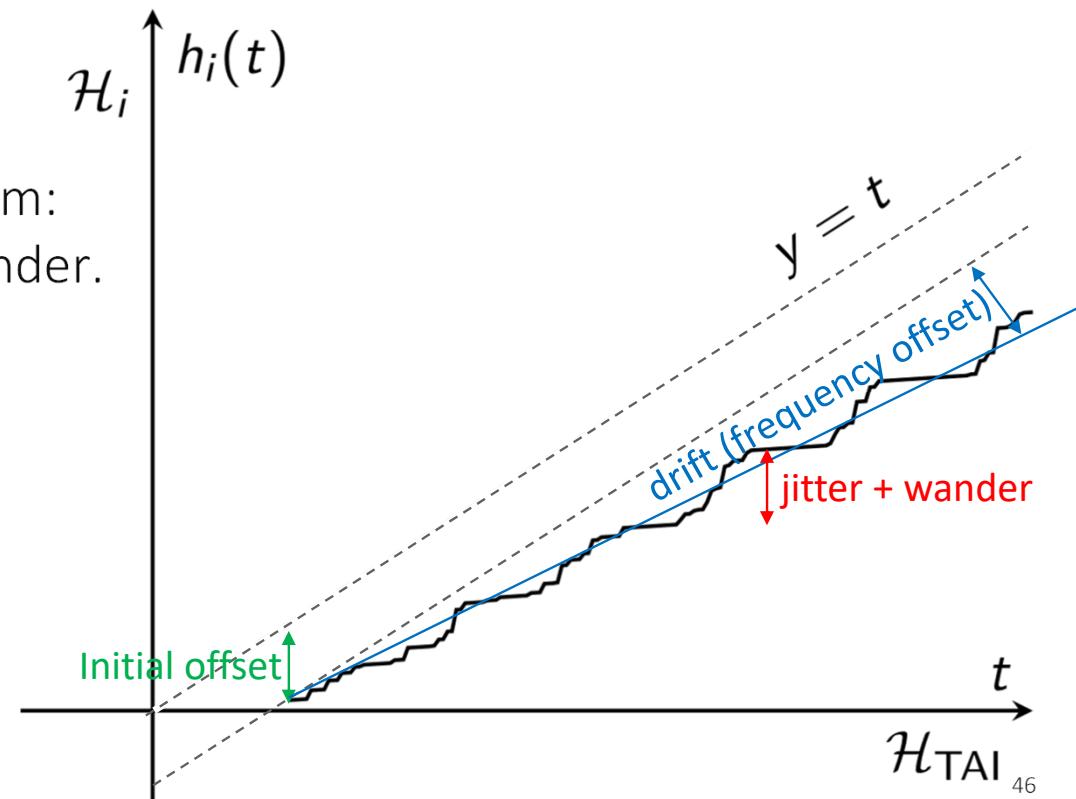
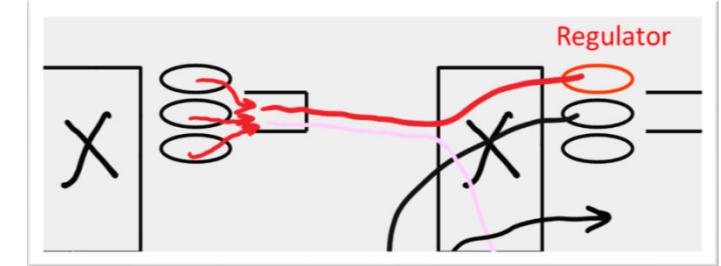
In reality, nodes use local clocks that are not ideal.

- **tight sync** (PTP, White Rabbit, GPS) : timestamping error  $\leq \omega \approx 10\text{ns} - 1\mu\text{s}$
- **loose sync** (NTP):  $\omega \approx 1\text{ms} - 1\text{s}$
- **no sync**: timestamping error  $\omega$  unbounded; measurement of time interval on same system: error is bounded by clock drift, jitter and wander.

[ITU-T 1996]

Regulators use time measurements to decide when a packet can be released.

What is the effect of clock non ideality ?



## Clock Model in Network Calculus [Thomas 2020]

Measurement of a time interval is performed with one clock  $\rightarrow d$  and with another clock  $\rightarrow d'$

$$\text{Time synchronization error: } d' - d \leq 2\omega$$

$$\text{Clock jitter and wander: } d' \leq \rho d + \eta$$

This gives the **change-of-clock inequalities**

$$\max\left(0, \frac{d - \eta}{\rho}, d - 2\omega\right) \leq d' \leq \min(\rho d + \eta, d + 2\omega)$$

$\omega$  = time error bound  
=  $1\mu\text{s}$  in TSN with PTP;  
=  $+\infty$  if no synchronization

$\rho$  = clock-stability bound  
=  $1.0001$  (e.g. in TSN)

$\eta$  = timing-jitter bound  
=  $2\text{ns}$  (e.g. in TSN)

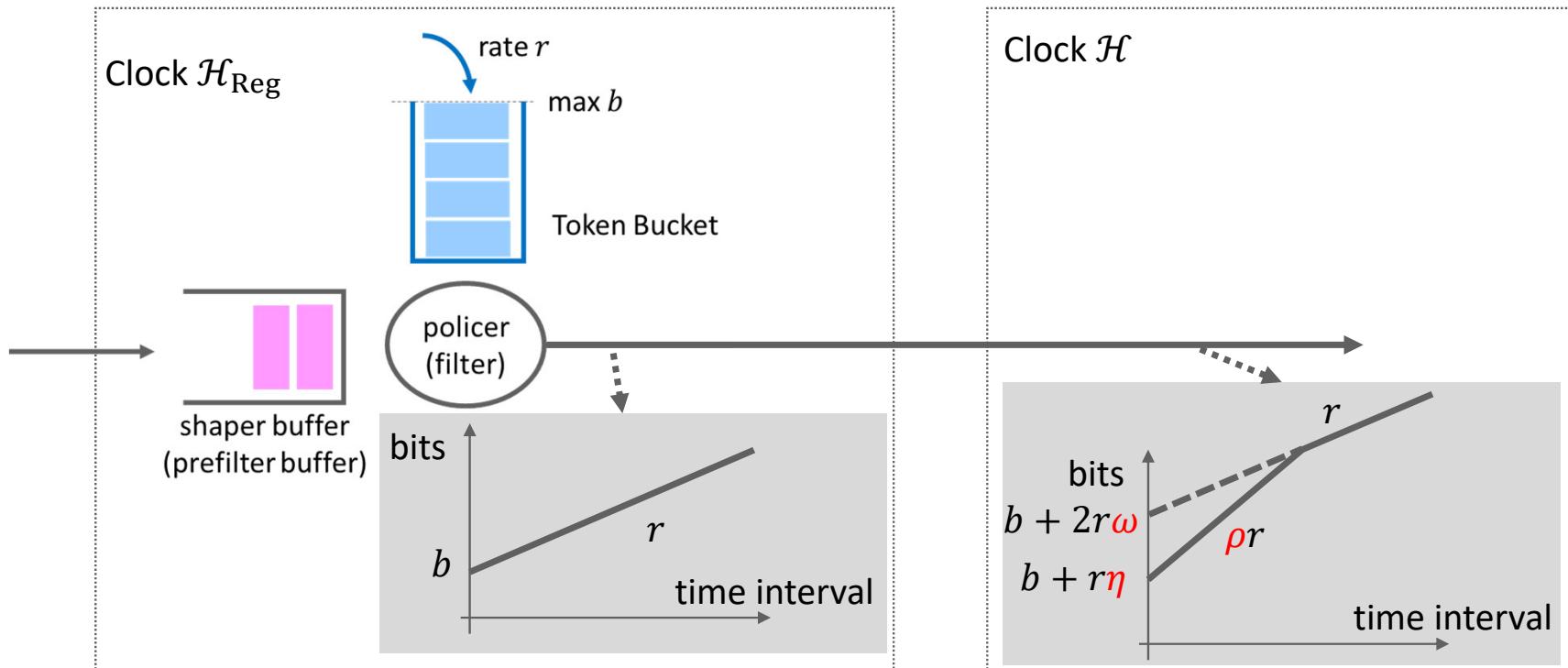
Model is symmetric, i.e. same inequalities if we exchange  $d' \leftrightarrow d$

Relative error on estimation of delays is, in general,  $\approx 10^{-4}$ , i.e. negligible. However there are some corner cases.

## Change of Clock: Arrival Curves

Assume a flow satisfies a token bucket constraint  $(r, b)$  when observed with clock  $\mathcal{H}_{\text{Reg}}$   
i.e. arrival curve constraint  $\alpha^{\mathcal{H}_{\text{Reg}}}(t) = rt + b$

When observed with some other clock  $\mathcal{H}$ , it satisfies the arrival curve constraint  
 $\alpha^{\mathcal{H}}(t) = \min(prt + b + r\eta, rt + b + 2r\omega)$

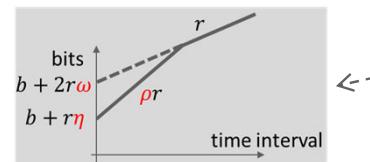


# Consequences for Non-Adapted Regulators

*Non adapted* regulator : uses same nominal arrival curve as at source.

Perfect clocks:

- Regulator does not increase worst-case delay



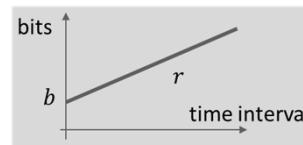
In regulator's clock,  
flow satisfies this  
constraint at source

Non-synchronized network:

- Per-flow and interleaved regulator unstable (unbounded delay).

Synchronized network:

- Per-flow regulator incurs delay penalty up to  $4\omega$ ;
- Interleaved regulator is **unstable**.



Source

Network  
Elements

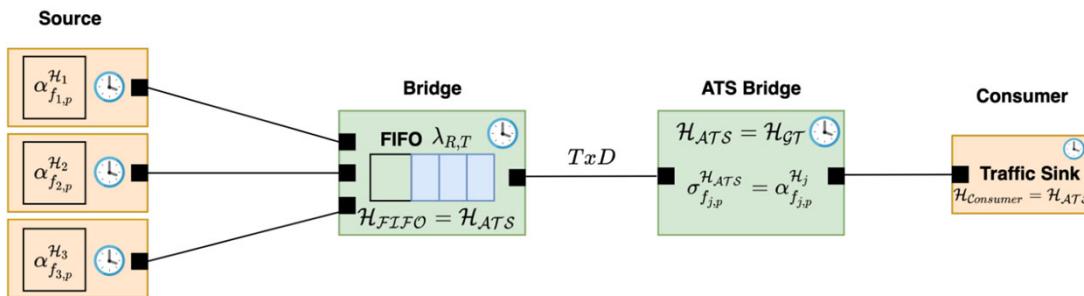
Non adapted  
Regulator  
(PFR or IR)

Flow constrained  
by  $\alpha(t) = rt + b$   
in local clock

Implements constraint  
 $\alpha(t) = rt + b$   
in local clock

# Synchronized clocks, Unstable non-adapted Interleaved Regulator (= IEEE TSN ATS)

ns-3 simulations



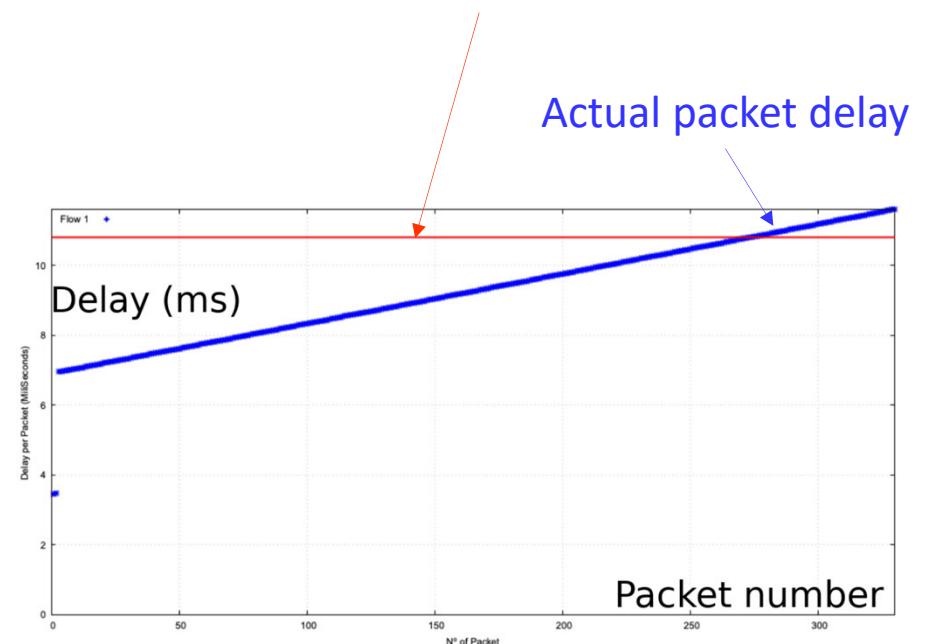
3 sources @ 147 kb/s

$$\omega = 1\mu\text{s}, \rho = 1.0001$$

Delay increases by up to  $100\mu\text{s}$  per second of operation.

[Thomas 2020]

Delay bound ignoring clock non ideality

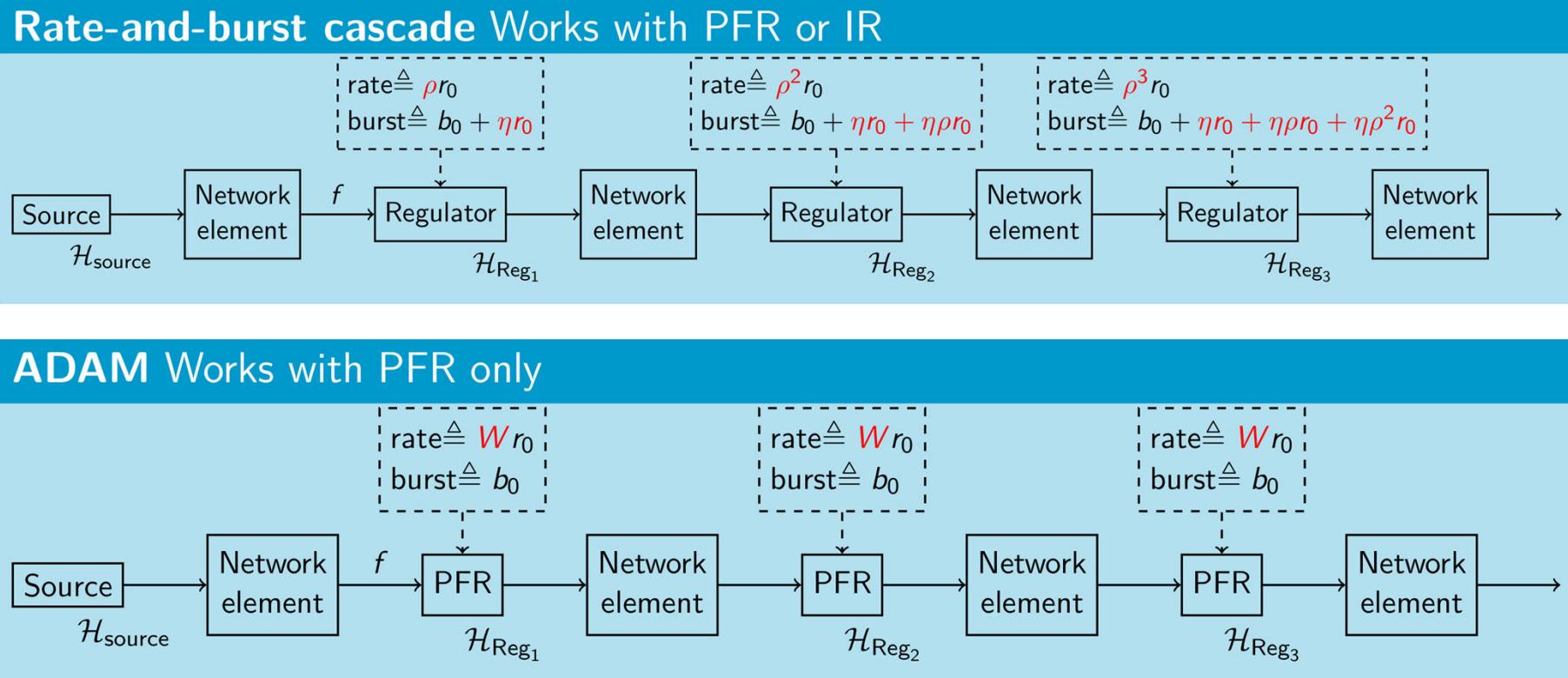


Work by Guillermo Aguirre

# Regulators are sensitive to clock inaccuracies

In **tightly synchronized** networks, IR must be adapted otherwise is unstable; PFR need not be adapted but increased delay due to clock inaccuracy must be accounted for. In loosely synchronized or non synchronized networks, both PFR and IR must be adapted.

Examples of adaptation methods

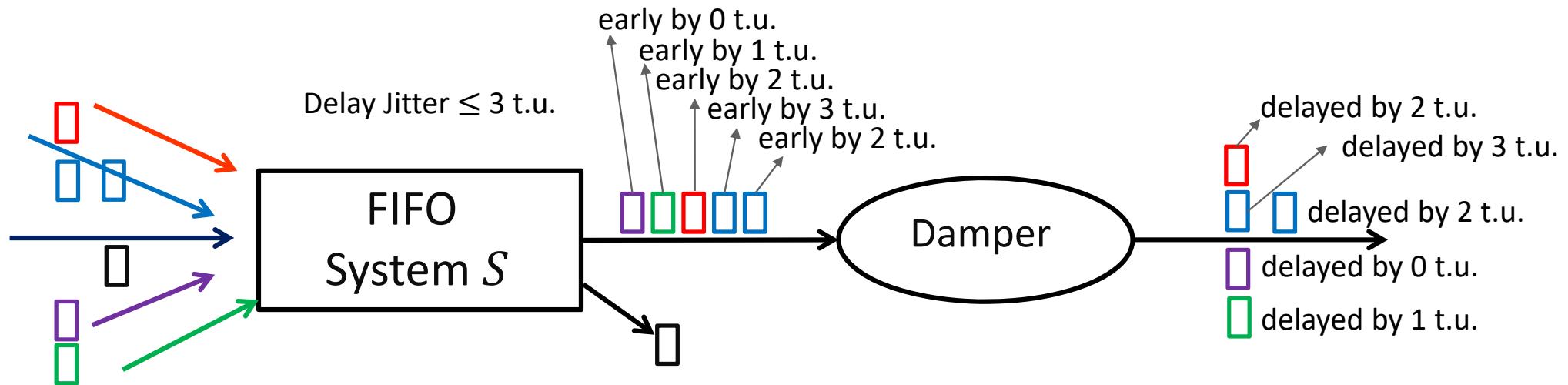


Clock non idealities can easily be accounted for in a network calculus analysis

Both for synchronized and non-synchronized networks

Arrival curves and delay bounds are (very slightly) affected, but regulators are dramatically affected and need to provision safety margins

## 6. Dampers



Damper delays a packet by “earliness” read from packet header.

Removes (almost all) jitter.

Non work-conserving

Like a regulator, does not exist in isolation, is combined with queue at next hop.

Unlike regulator, is stateless.

[Cruz 1998] RCSP [Zhang 1993], RGCQ [Shoushou 2020], ATS with Jitter Control [Grigorjew 2020].

## Low end-to-end jitter

- Many time sensitive applications require low latency only:
    - e.g. 50ms for AVB (video processing);
    - e.g.  $\leq 1$  ms Tactile Internet.
  - Some applications may require low latency + very low jitter:
    - e.g. remote process control requires latency bound 1ms, delay variation bound  $1\mu\text{s}$ ; latency bound alone is not sufficient for some machine control applications.
- [ITU-T 2020 ]

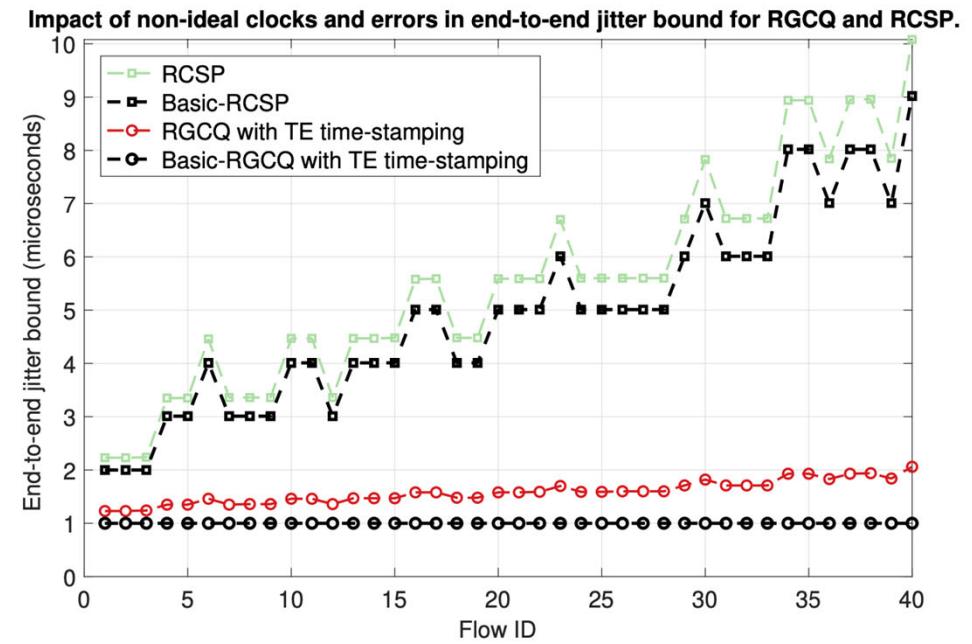
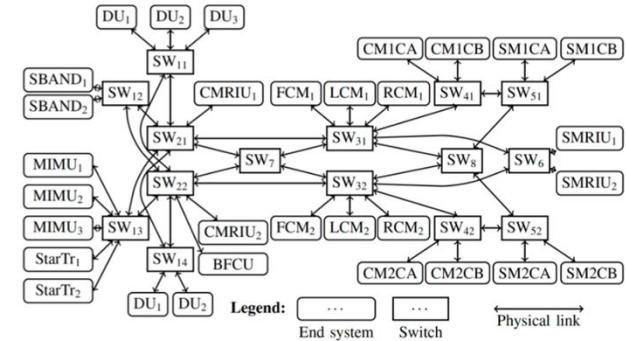
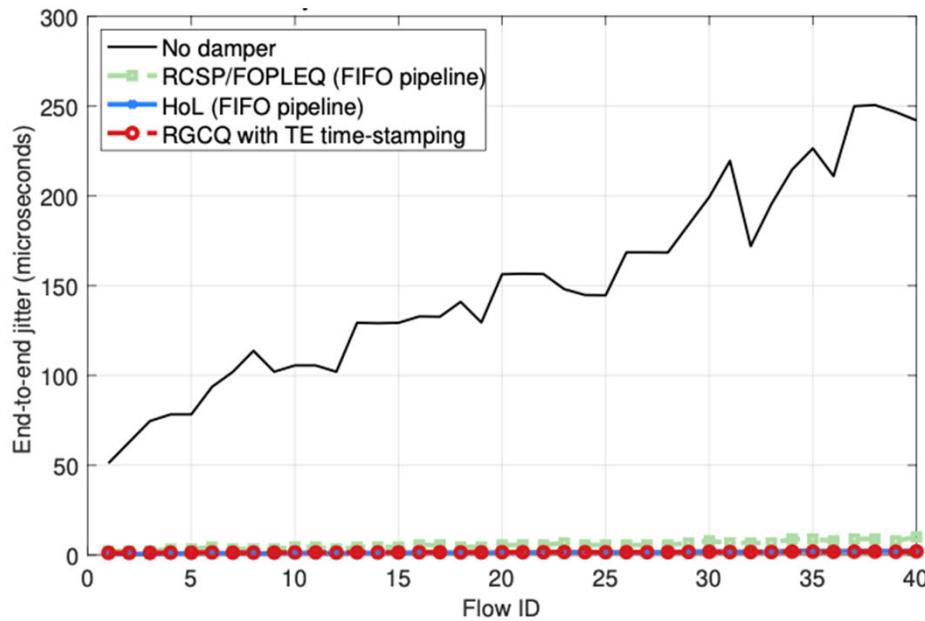


- Dampers can provide very low end-to-end jitter.
- Modelling clock accuracy [Thomas 2020] matters for very low jitter.

# Analysis of Dampers with Realistic Clock Model

[Mohammadpour 2022]

incorporates measurement and clock errors  
using the network calculus methods shown above

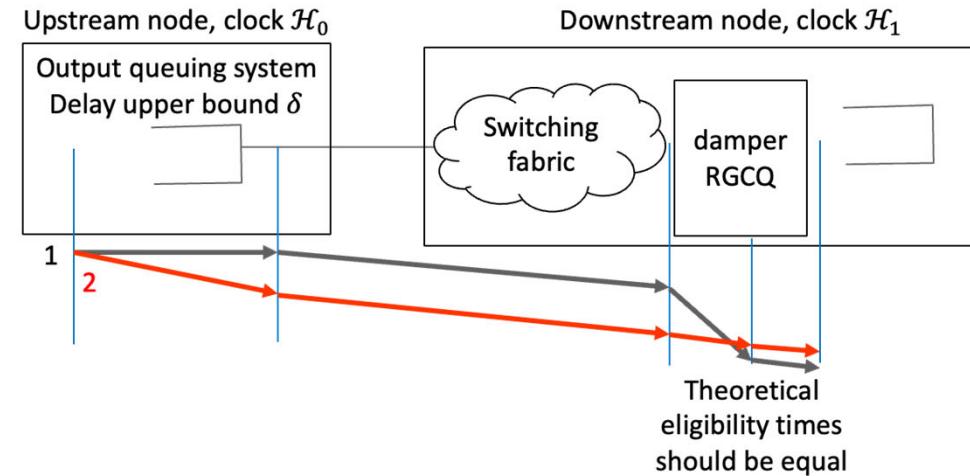


## Dampers may cause re-ordering

[Mohammadpour 2022]

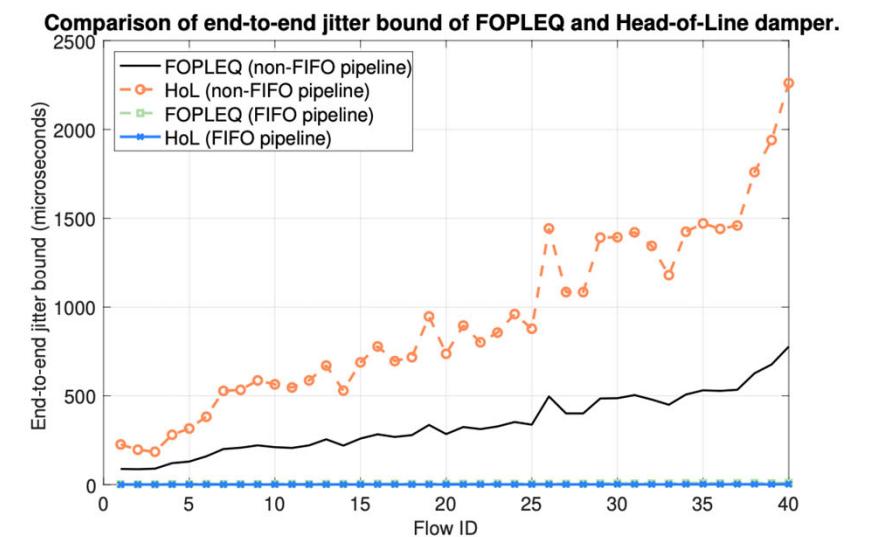
Two consecutive packets  
should be released by  
damper at ca. the same time.

Timing inaccuracies may  
lead to mis-ordering.

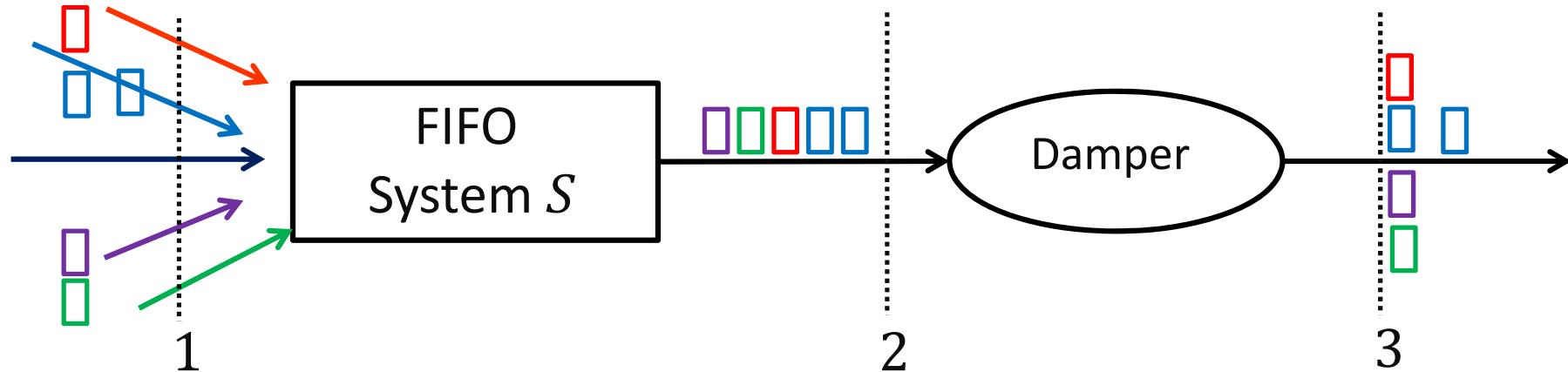


⇒ Some dampers enforce per-flow packet order (e.g.  
FOPLEQ, ATS with Jitter Control [Grigorjew 2020]).

- Avoids misordering
- Counterproductive if some network elements are non-FIFO



## Dampers solve Burstiness Cascade Problem



Delay jitter  $1 \rightarrow 3$  is 0 in theory; in practice, a small residual jitter  $\leq \Delta$  (in true time):

At 1: assume a flow is constrained by token bucket with rate  $r$  and burstiness  $b$  (in true time);

⇒ At 3, same flow is constrained by token bucket with rate  $r$  and burstiness  $b + r\Delta$  (in true time).

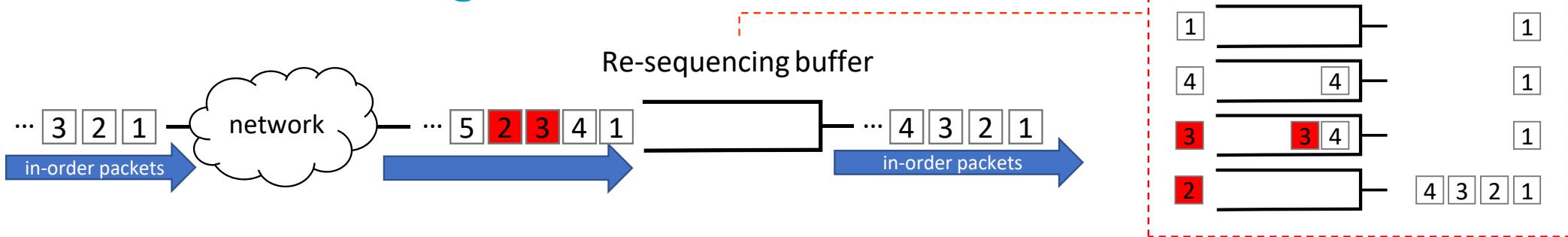
Tolerance  $\Delta$  depends on jitter implementation and not on traffic  
⇒ no burstiness cascade.

Dampers are non work-conserving devices that can dramatically reduce delay jitter

Stateless, unlike regulators

Like regulators, solve burstiness cascade and simplify network analysis

## 7. Packet Re-Ordering



Time Sensitive Networks may cause packet re-ordering due to e.g. parallel paths in switching fabrics.

**Re-sequencing buffer** may be needed before delivery:

stores packets until in-sequence delivery or timeout

Questions: Buffer size ? Minimal timer value ? Effect on worst-case delay bounds ?

# Reordering late Time Offset (RTO)

[RFC 4737, Mohammadpour 2021]

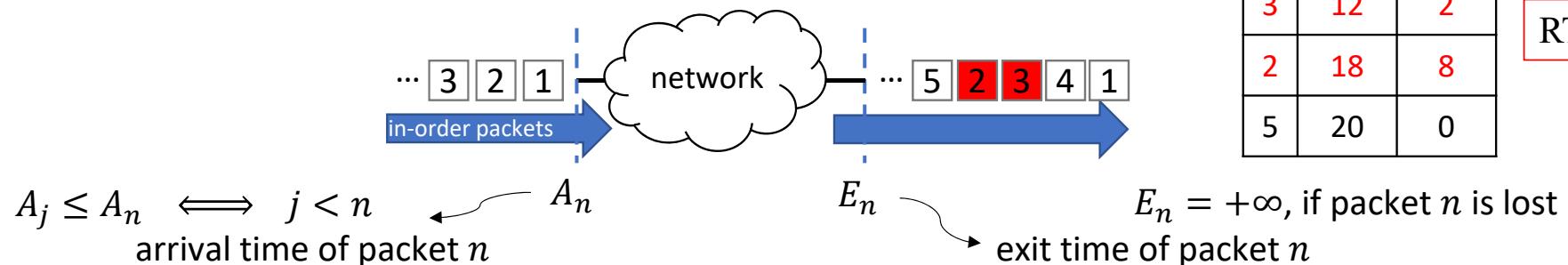
Defined between two observation points, and for a flow of interest

First observation point defines the reference order of packets

RTO = largest time by which a mis-ordered packet is late

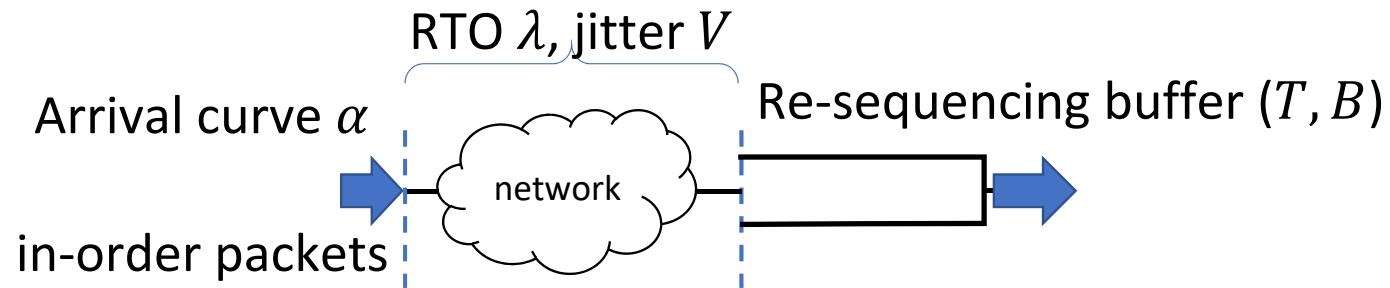
$$\text{RTO} = \max_{n|E_n < +\infty} \lambda_n$$

$$\lambda_n = E_n - \min_{j \geq n, E_j \leq E_n} \{E_j\}$$



RTO = 0 means no re-ordering

## Resequencing Buffer Calculus



1. Re-sequencing buffer timeout  $T$  minimum value is  $T_{\min} = \lambda = \text{RTO}$
2. Required size of resequencing buffer is  $B_{\min} = \alpha(V + T)$

[Mohammadpour 2021]

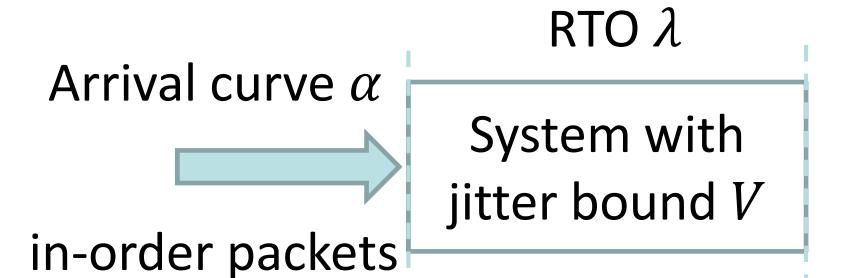
## Calculus of RTO (1)

For a system that may re-order packets and has known delay jitter  $V$ , the best RTO bound for a flow with arrival curve  $\alpha$  is  $\lambda = [V - \alpha^\downarrow(2L^{\min})]^+$ .

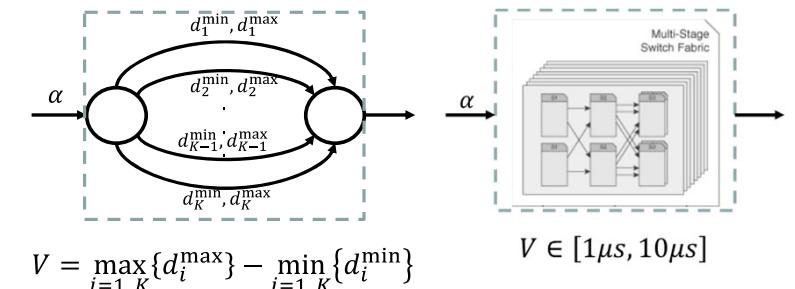
Example: (token bucket)  $\alpha(t) = rt + b$

If  $b < 2L^{\min}$  and  $V \leq \frac{2L^{\min} - b}{r}$  then  $\lambda = 0$  (no reorder)

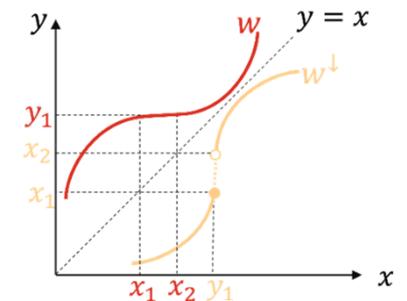
If  $b > 2L^{\min}$  then  $\lambda = V$  (reordering is possible)



Examples of systems



Lower pseudo-inverse

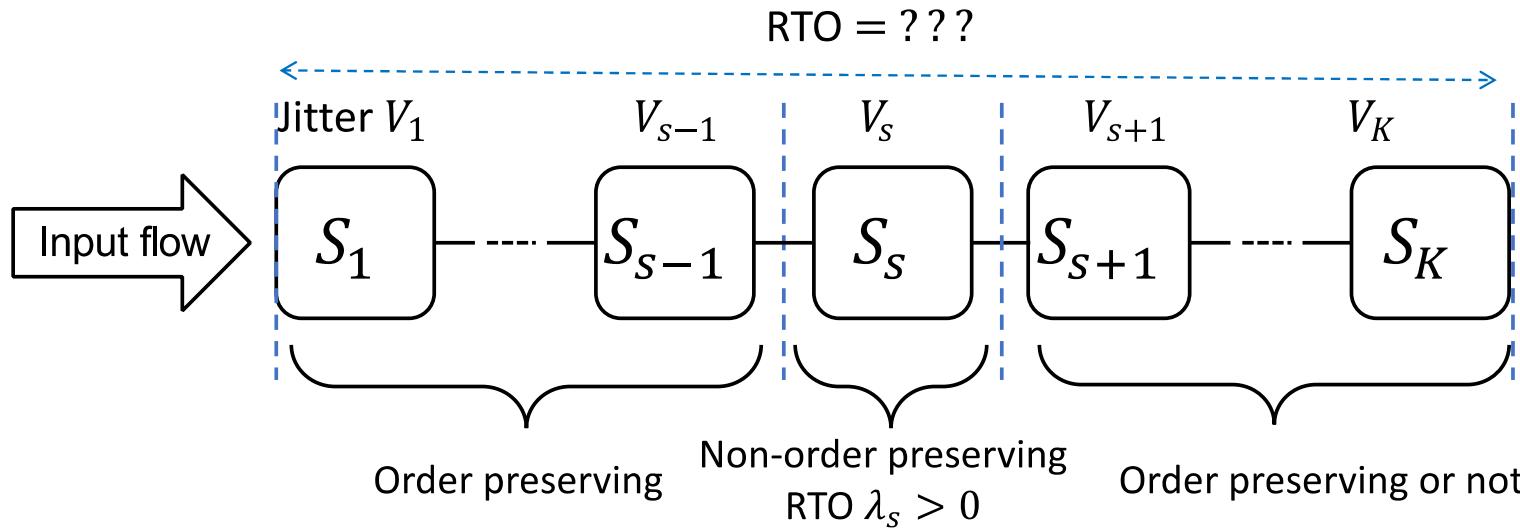


Other bounds exist for flow constraints at packet level.

[Mohammadpour 2021]

All bounds in TAI (temps atomique international)

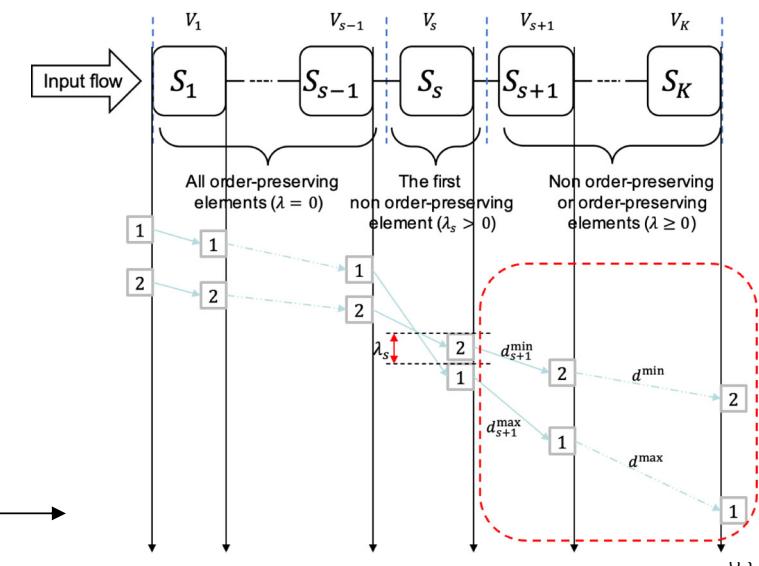
## Calculus of RTO (2): Concatenation



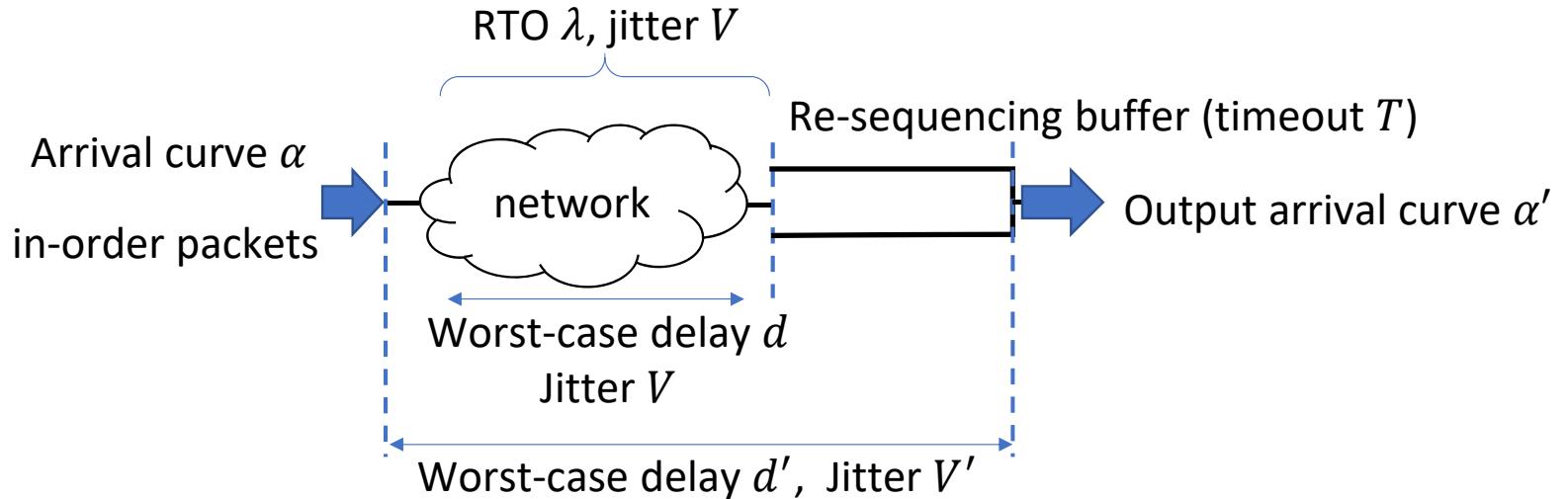
Best RTO bound for concatenation is

$$\Lambda(K) = \lambda_s + \sum_{i=s+1}^K V_i$$

RTO amplification by downstream jitter



## Network Calculus with Re-sequencing Buffers



Lossless network:

$$d' = d, V' = V \text{ and } \alpha'(t) = \alpha(t + V) \text{ (re-sequencing is for free)}$$

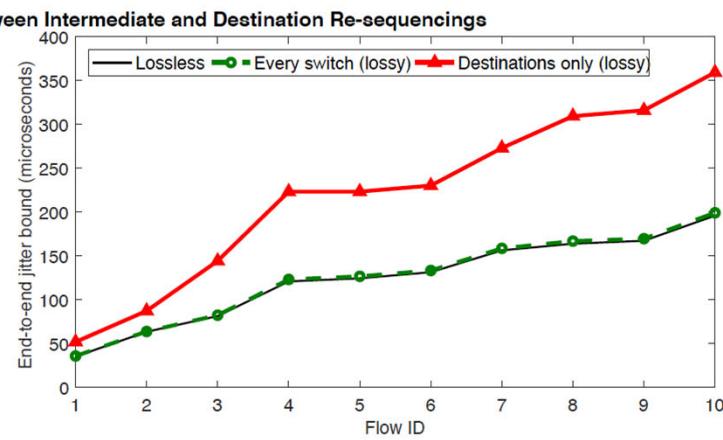
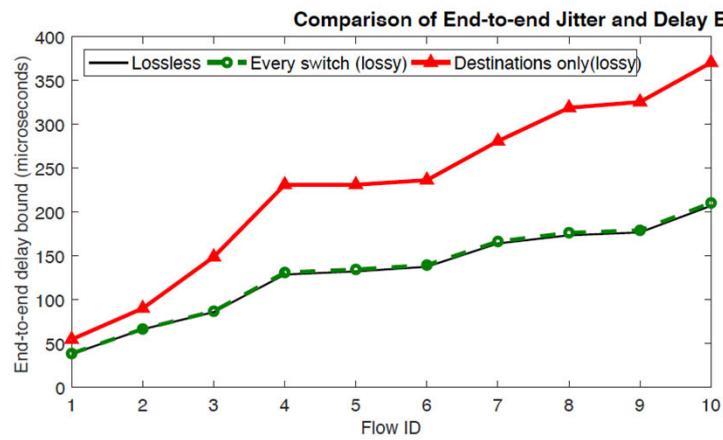
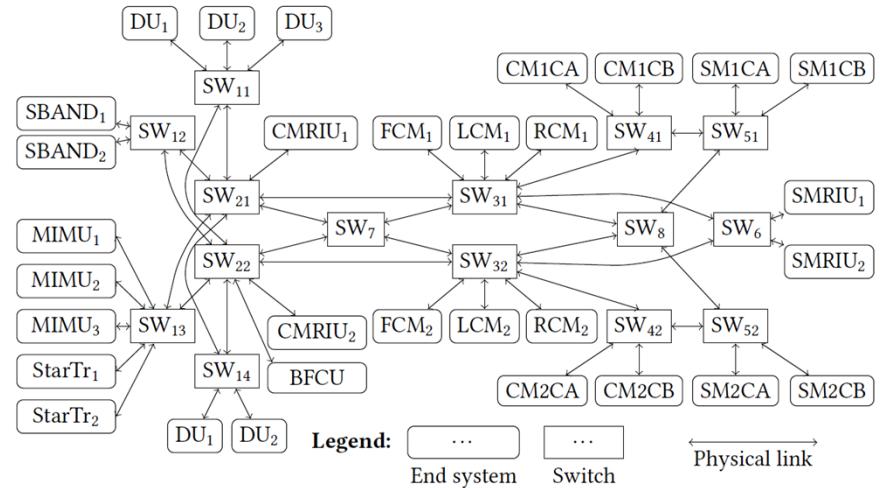
Lossy network:

$$d' = d + T, V' = V + T \text{ and } \alpha'(t) = \alpha(t + V + T).$$

# Example

Re-sequencing at destination vs at every switch increases end-to-end worst-case delay and jitter

[Mohammadpour 2021]



Packet reordering metric of interest is the RTO

Resequencing is for free in lossless networks

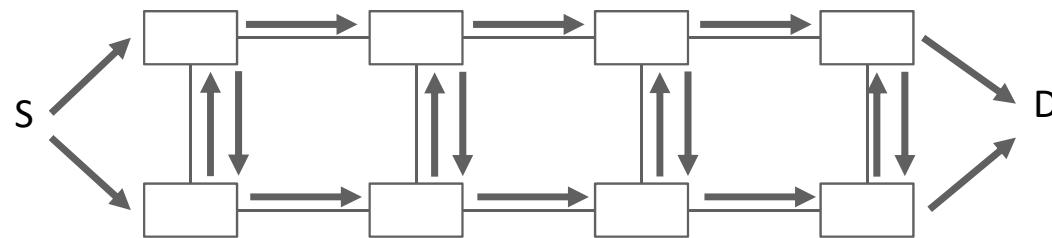
In lossy networks, timeout value (hence RTO) affects delay, jitter and propagated burstiness

Resequencing-at-end only may cause large resequencing delay due to RTO amplification

## 8. Packet Replication

Deterministic networks guarantee 0 congestion loss, but other losses may occur (transient failures, reboots, transmission errors).

This is mitigated with **packet replication** and duplicate removal.



Any combination of failures that leaves at least one path up is masked (“0 msec repair”) [IEEE 802.1CB]

FRER: Frame Replication and Elimination for Reliability (IEEE TSN)

PREOF: Packet Replication Elimination and Ordering Function (IETF Detnet)

Packets are duplicated at sources and at intermediate points. Packet duplicates are removed at intermediate points and at destination.

## Packet Elimination Function

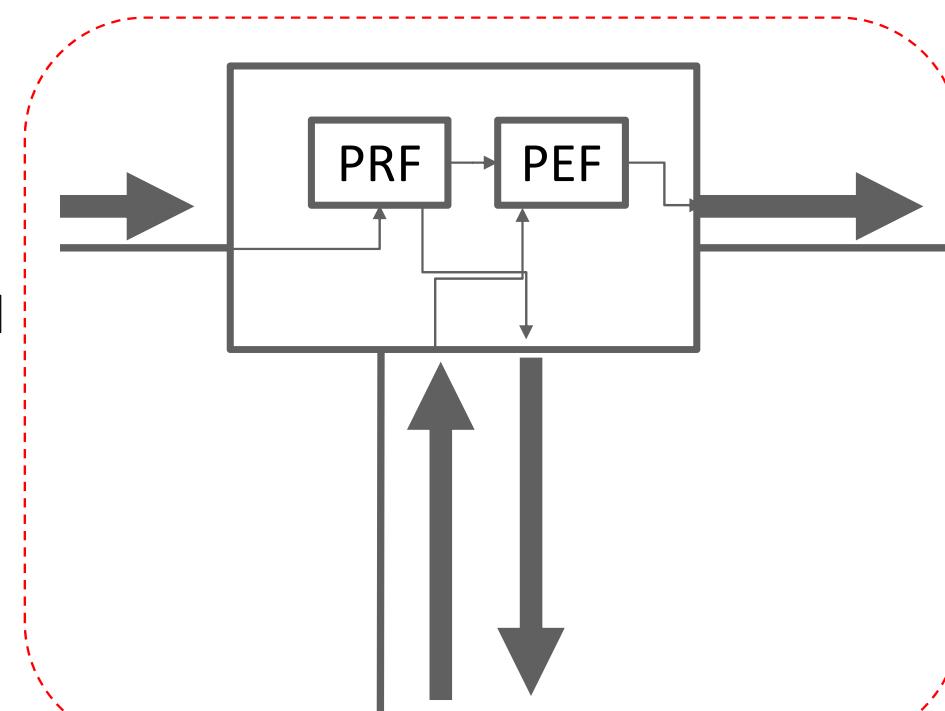
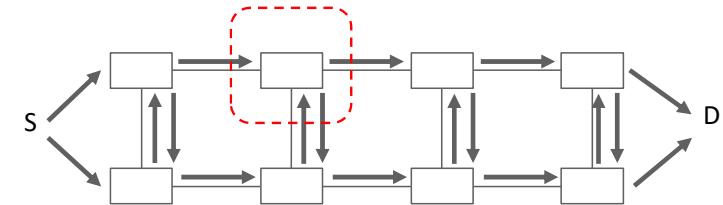
Packet duplicates are eliminated (Packet Elimination Function, PEF).

Packet replication function (PRF) multicasts  $n$  copies towards destination (here  $n = 2$ ).

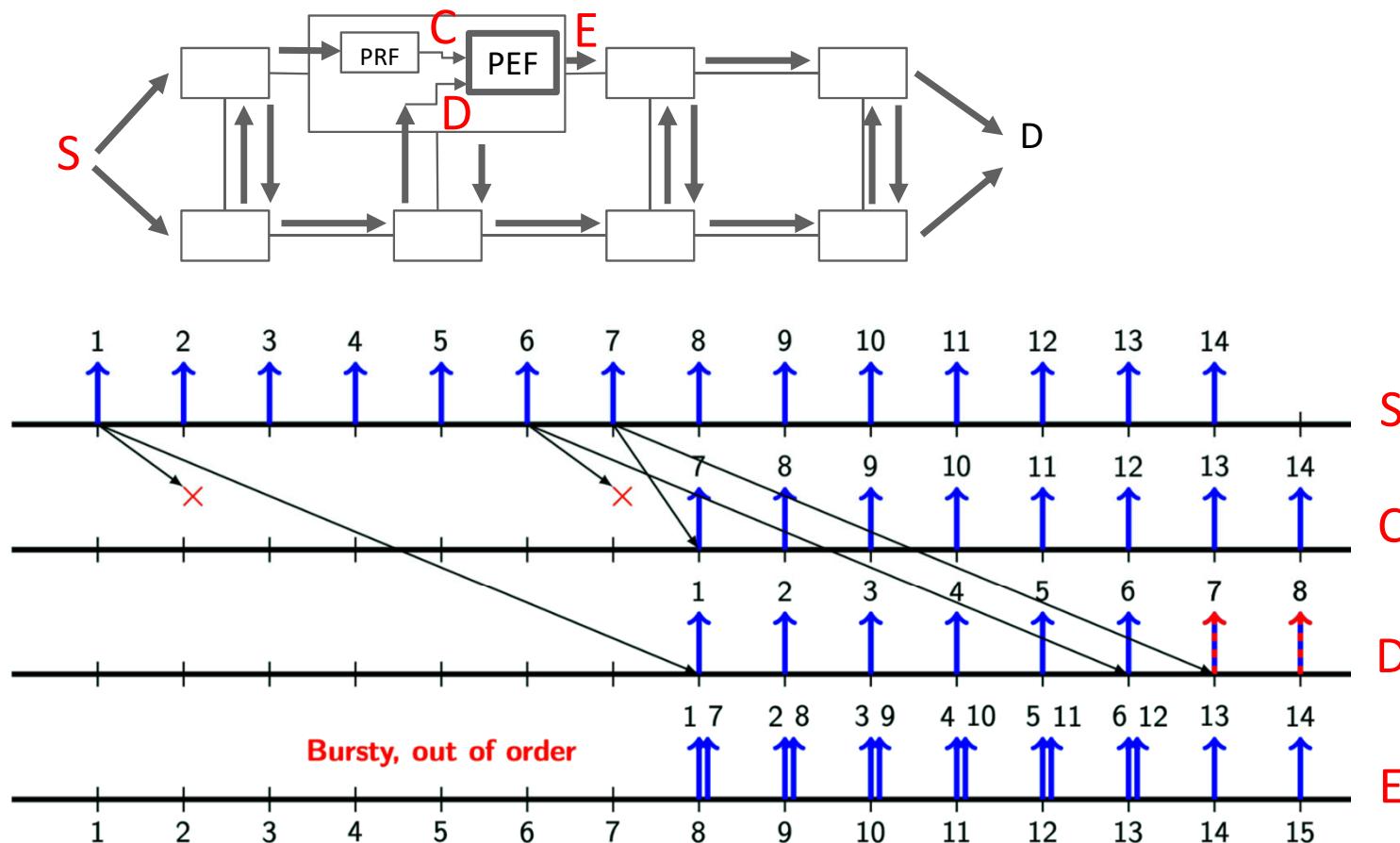
Question: effect on delay analysis ?

PRF simply generates cloned flows – business as usual

PEF requires special analysis



# Packet Elimination Function Causes Mis-Ordering + Increased Burstiness [Thomas 2022]



# Network Calculus Analysis of Packet Elimination Function

Arrival curve at output of PEF:  $\alpha^* = \alpha^{\text{AGG}} \otimes \alpha^{\text{JIT}}$  where:

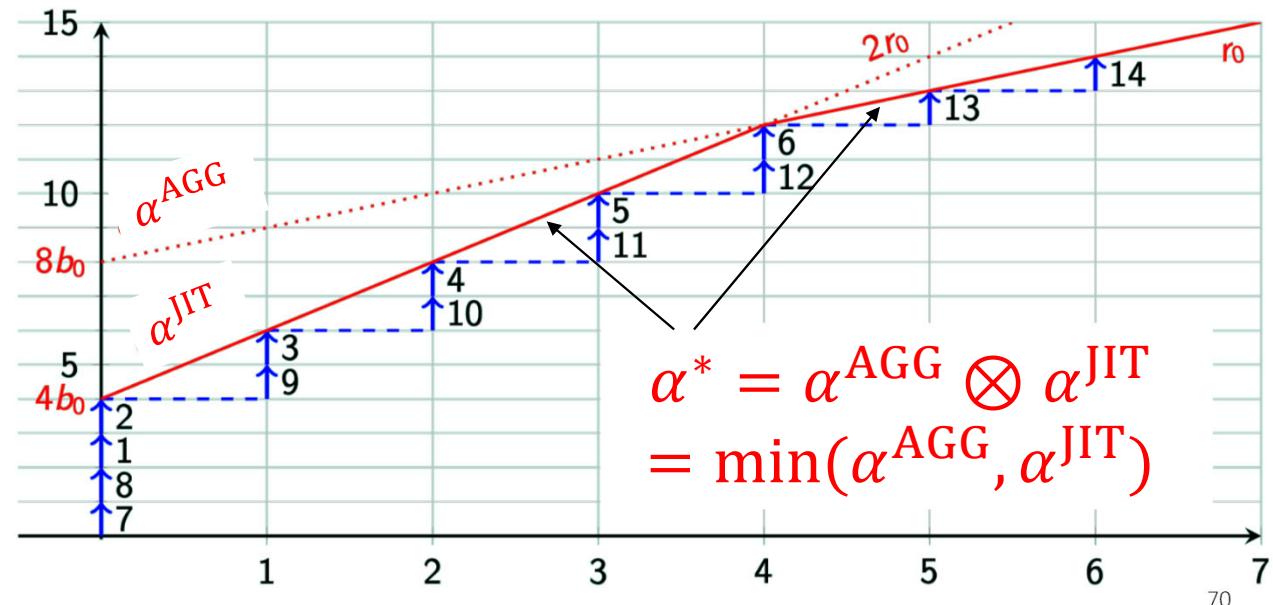
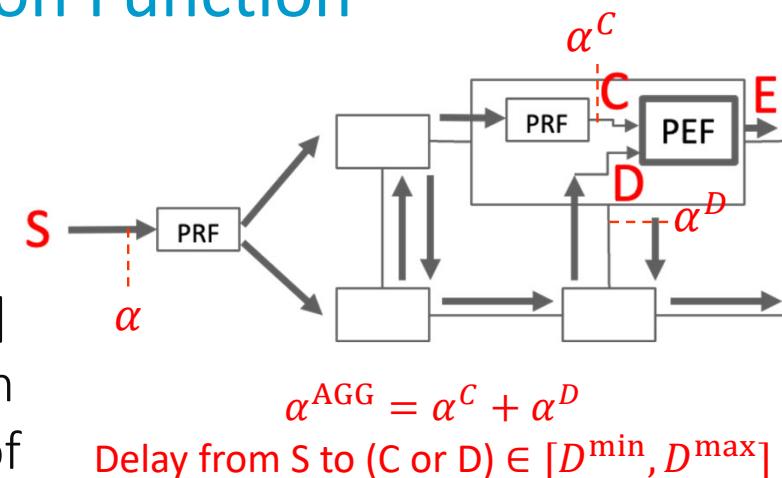
- $\alpha^{\text{AGG}} = \sum$  propagated arrival curves at input of PEF;
- $\alpha^{\text{JIT}}(t) = \alpha(t + D^{\max} - D^{\min})$  where  $D^{\max}$  [resp.  $D^{\min}$ ] is an upper [resp. lower] bound on delay between common ancestor and input of PEF and  $\alpha$  is arrival curve at output of common ancestor on any path.

Bound on RTO (amount of re-ordering)

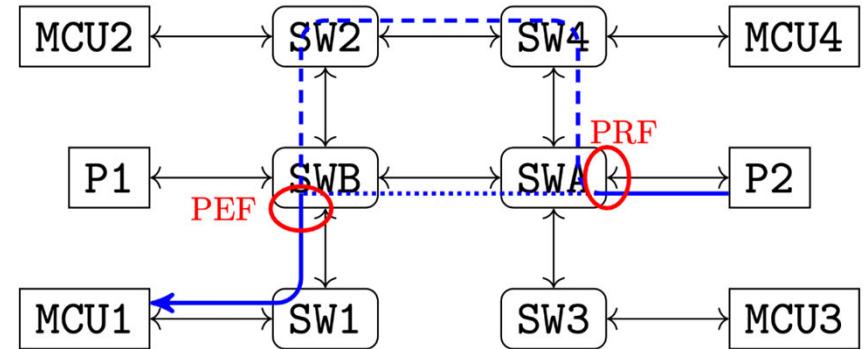
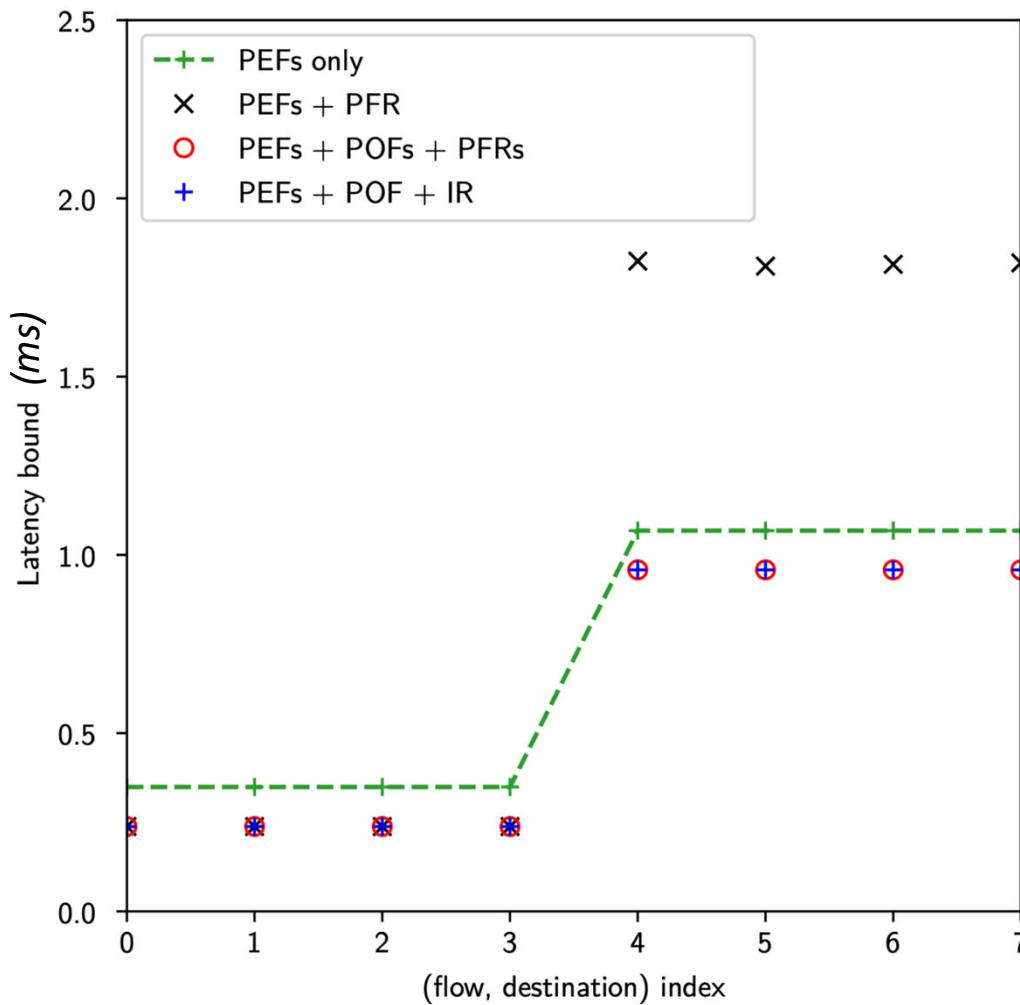
$$\lambda = [D^{\max} - D^{\min} - \alpha^\downarrow(2L^{\min})]^+$$

Network Analysis implemented in extension of TFA (xTFA).

[Thomas 2022]



## Example



- PEF can be complemented with a resequencing buffer and a regulator to mitigate its negative impact
- PEF and regulator without resequencing buffer is worse / unstable

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In-network packet replication and elimination is present in time-sensitive networks

Packet elimination negatively affects the deterministic delay bounds and must be taken into account

## Conclusion

Time Sensitive Networks require deterministic, proven bounds on delay, jitter, backlog and re-ordering.

Network Calculus provides theory and software tools for computing such bounds and for understanding operation of regulators, dampers, re-sequencing buffers or packet elimination functions.

Clock non-idealities can easily be incorporated. Regulators are dramatically affected, other systems not.

Stochastic Network calculus promises to apply to wireless networks.

# Thank You !

References are in the online version.

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