



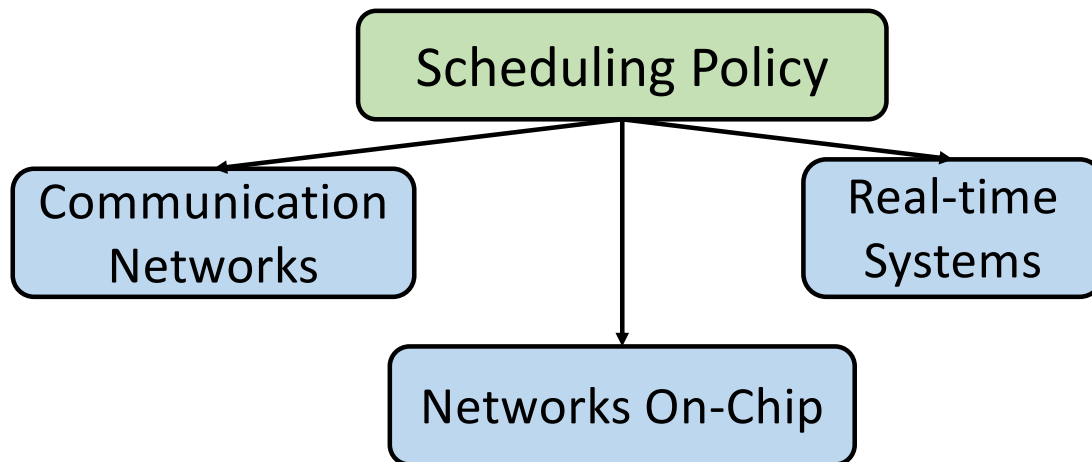
# Interleaved Weighted Round-Robin: A Network Calculus Analysis

ITC 32, September 2020, Osaka, Japan

5<sup>th</sup> Workshop on Network Calculus (WoNeCa-5)  
Virtual Event on October 9<sup>th</sup>, 2020

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Marc Boyer (ONERA, France)

# Weighted Round-Robin (WRR)



## WRR Behavior

Each queue is given a weight.



An infinite loop of rounds to visit queues.



When a queue with weight  $w$  is visited.

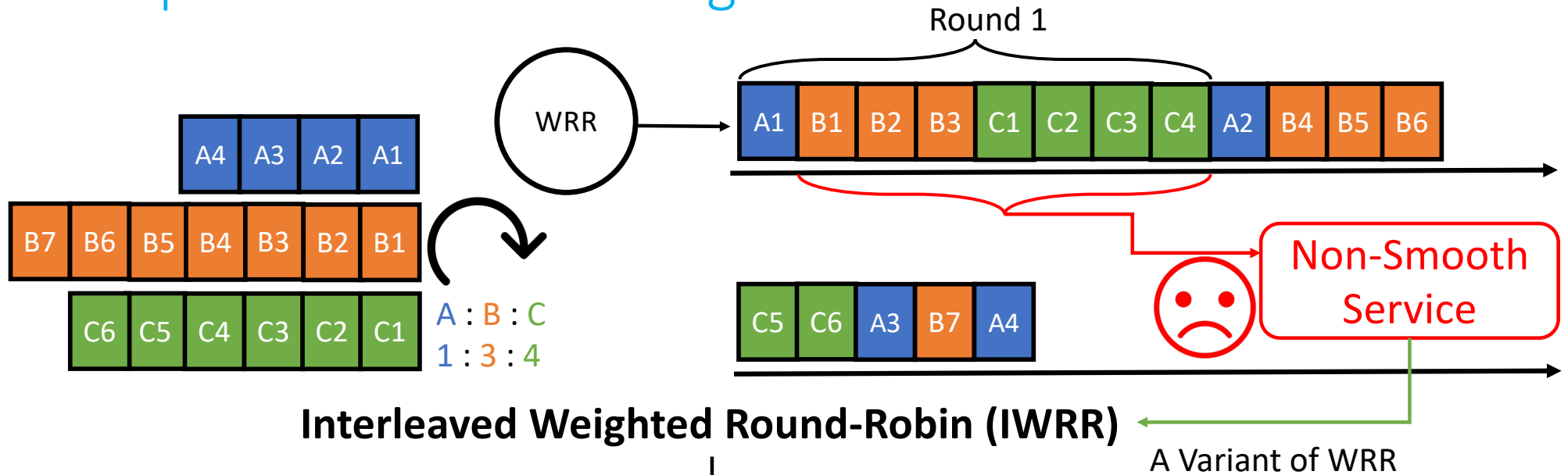


It can send up to  $w$  packets



Simple

# Example of WRR Scheduling



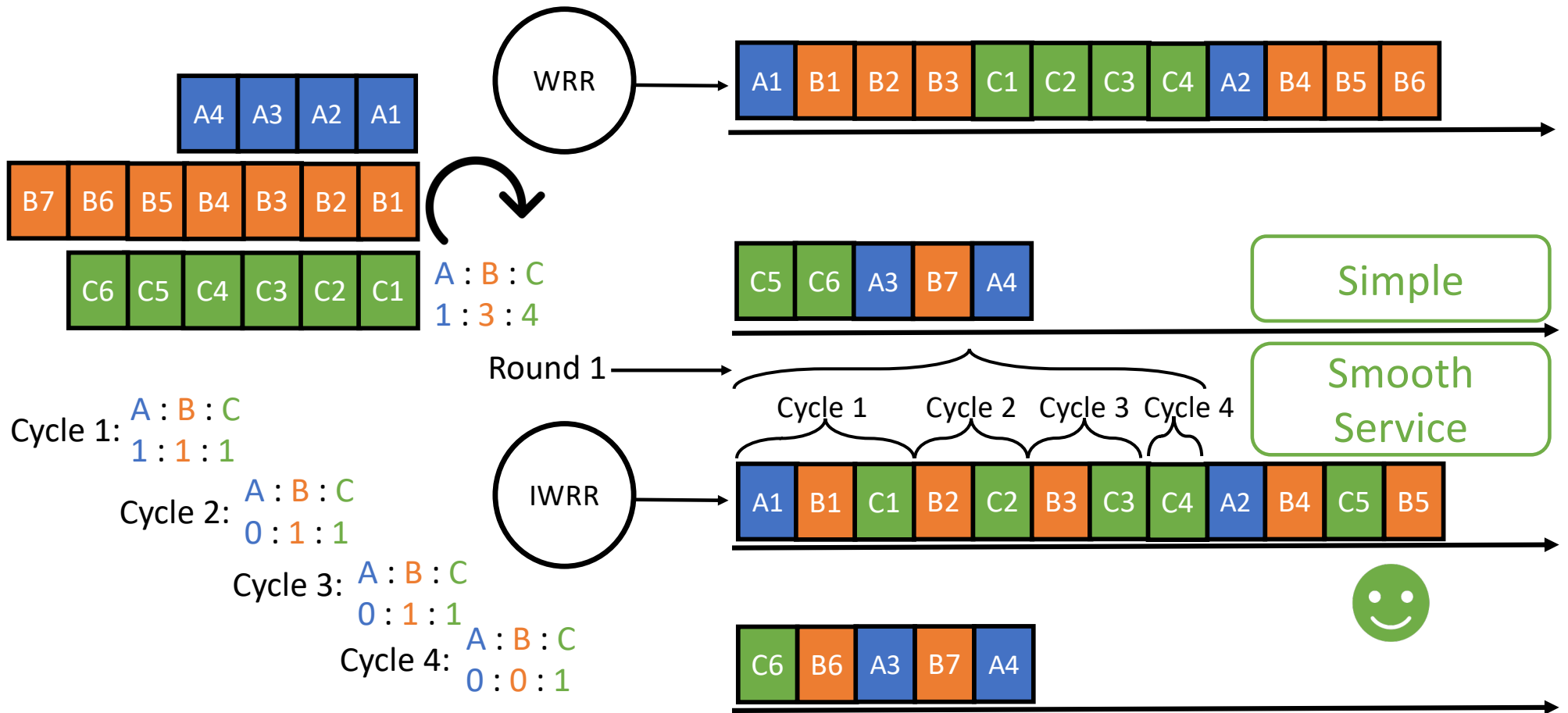
A queue with weight  $w$  is visited  $w$  times in each round.

It can send up to one packet in each visit.

M. Katevenis, S. Sidiropoulos and C. Courcoubetis,

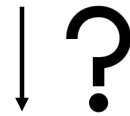
"Weighted round-robin cell multiplexing in a general-purpose ATM switch chip,"  
in *IEEE Journal on Selected Areas in Communications*

# IWRR Offers a Smoother Service.



# Does IWRR Reduce Worst-case Delays?

We expect that IWRR would reduce the worst-case delays.



How can we capture that?



Using the *Network Calculus* framework.



Finding a service curve

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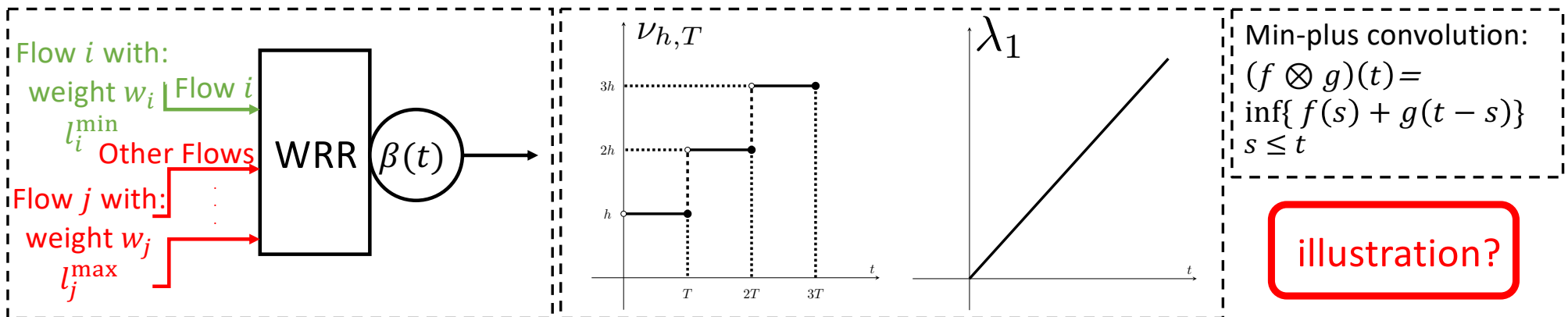
1. Strict Service Curve for IWRR.
2. Comparison to WRR.
3. Tightness.

# State-of-the-art: WRR Strict Service Curve

**Theorem**[Bouillard, Boyer, Le Corronc 2018, Section 8.2.4]:  
The strict service curve guaranteed to flow  $i$  is

$$\beta'_i(t) = (\lambda_1 \otimes \nu_{q_i, L_{\text{tot}}}) \left( [\beta(t) - Q_i]^+ \right)$$

$$q_i = w_i l_i^{\min}, \quad Q_i = \sum_{j, j \neq i} w_j l_j^{\max}, \quad L_{\text{tot}} = q_i + Q_i$$



# Example WRR Strict Service Curve

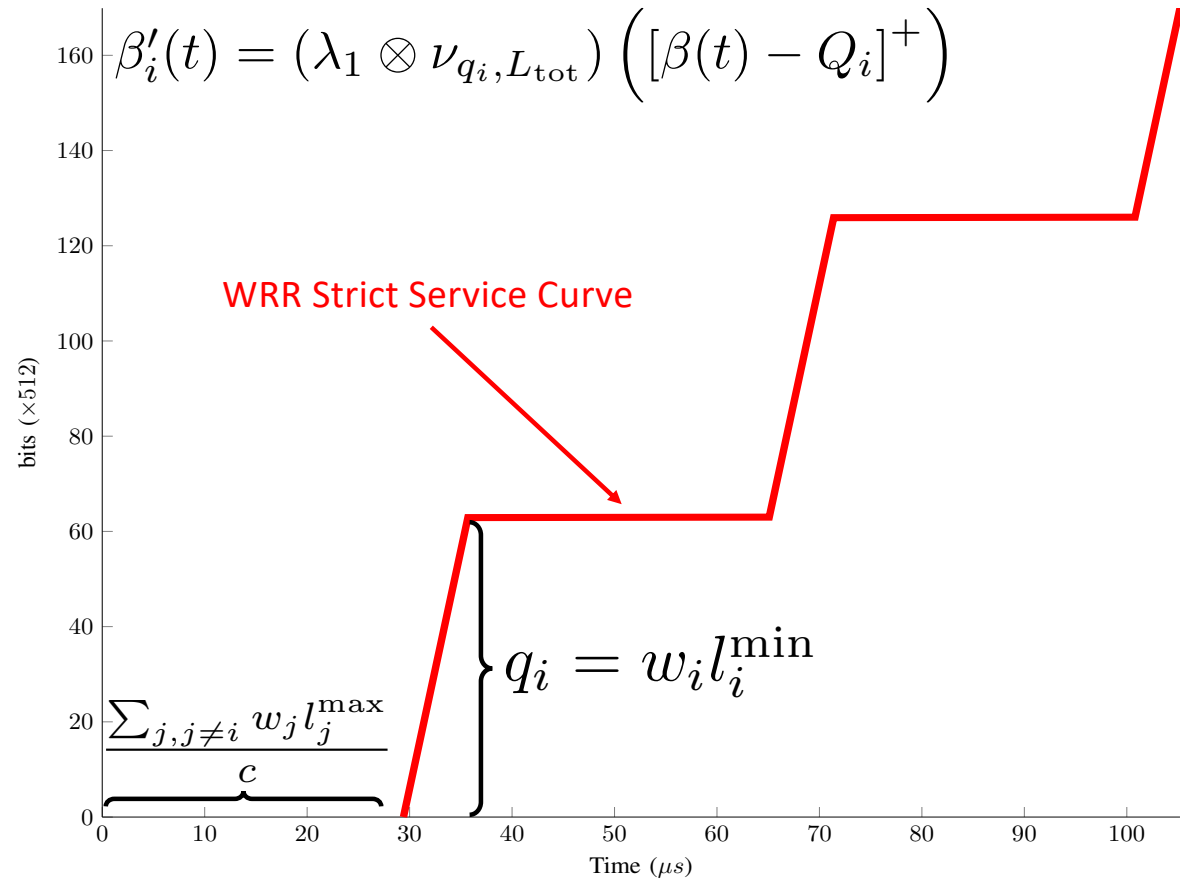
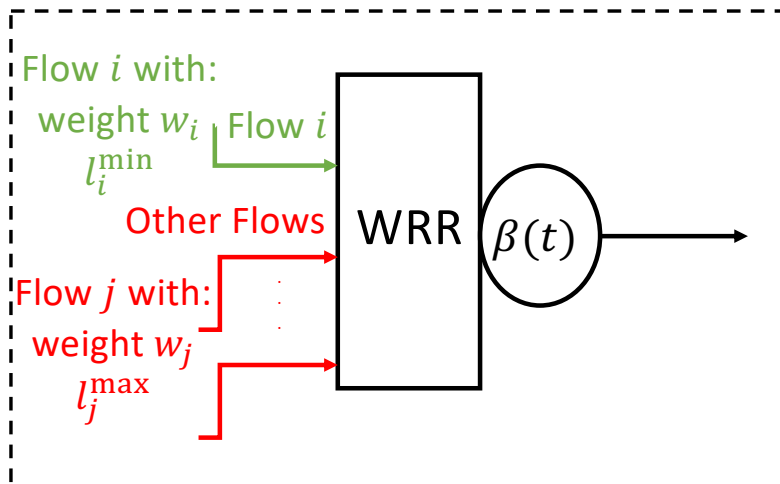
weight  $w_i = 7$

$l_i^{\min} = 9 * 512$  bit

weights  $w_j = \{4, 6, 10\}$

$l_j^{\max} = \{17, 11, 16\} * 512$  bit

$\beta(t) = ct$  with  $c = 10Mbps$





# New Result: IWRR Strict Service Curve

**Theorem 1:** The strict service curve guaranteed to flow  $i$  is

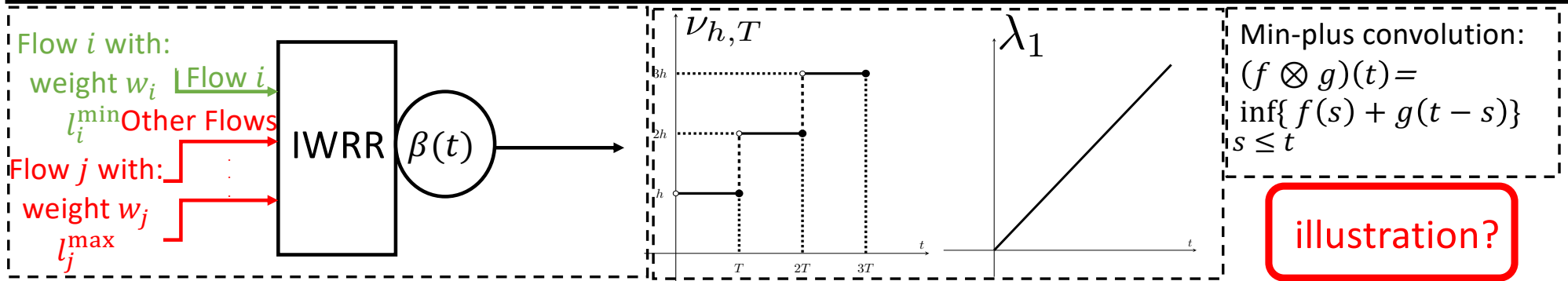
$$\beta_i(t) = (\lambda_1 \otimes U_i)(\beta(t))$$

$$U_i(x) \stackrel{\text{def}}{=} \sum_{k=0}^{w_i-1} \nu_{l_i^{\min}, L_{\text{tot}}} \left( [x - \psi_i(kl_i^{\min})]^+ \right)$$

$$L_{\text{tot}} = w_i l_i^{\min} + \sum_{j, j \neq i} w_j l_j^{\max}$$

$$\psi_i(x) \stackrel{\text{def}}{=} x + \sum_{j, j \neq i} \phi_{i,j} \left( \left\lfloor \frac{x}{l_i^{\min}} \right\rfloor \right) l_j^{\max}$$

$$\phi_{i,j}(x) \stackrel{\text{def}}{=} \left\lfloor \frac{x}{w_i} \right\rfloor w_j + [w_j - w_i]^+ + \min(x \bmod w_i + 1, w_j)$$



# Example IWRR Strict Service Curve

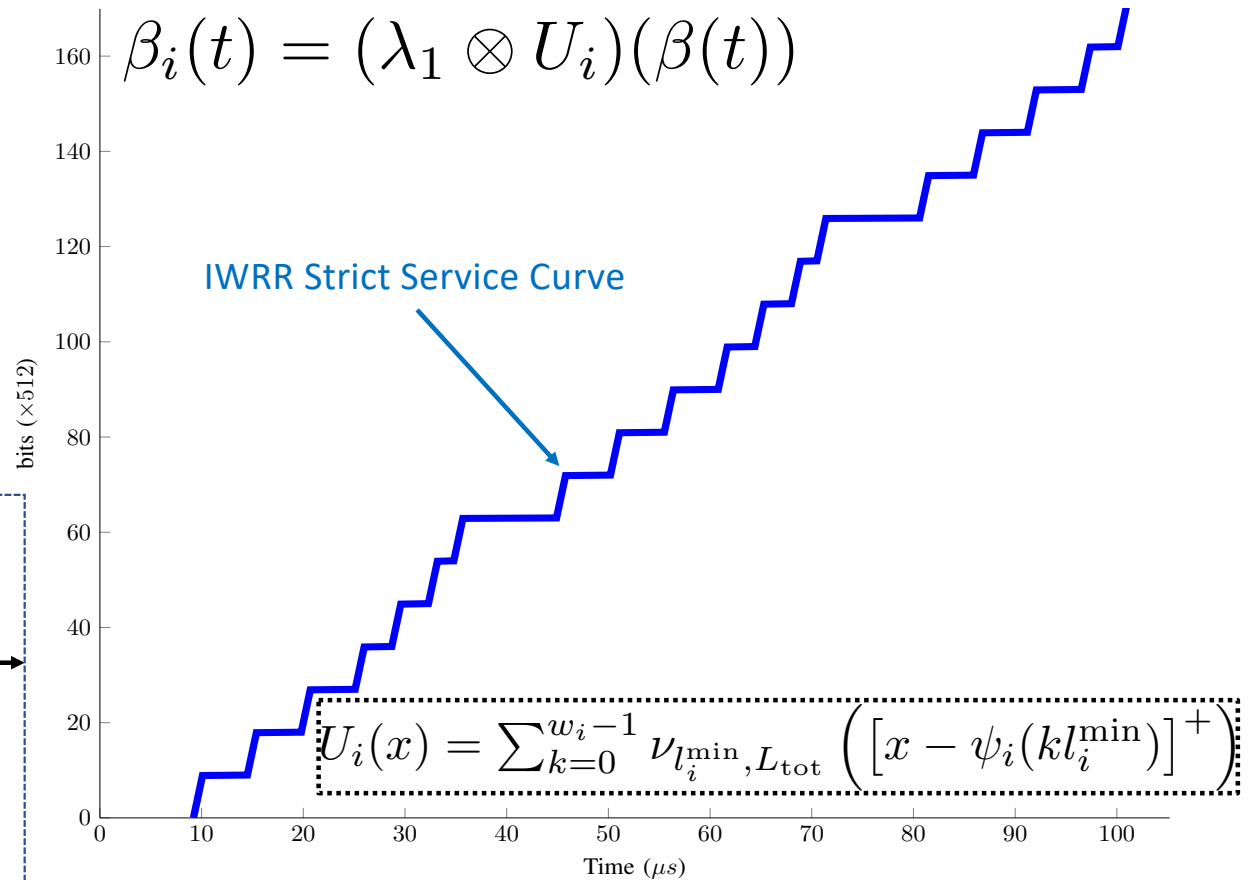
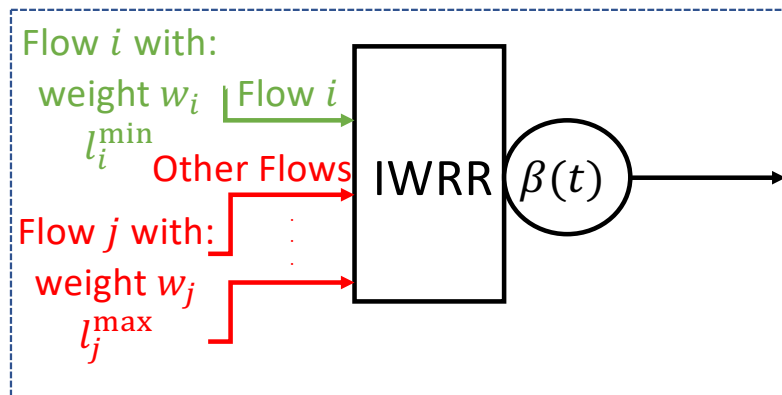
weight  $w_i = 7$

$$l_i^{\min} = 9 * 512 \text{ bit}$$

weights  $w_j = \{4, 6, 10\}$

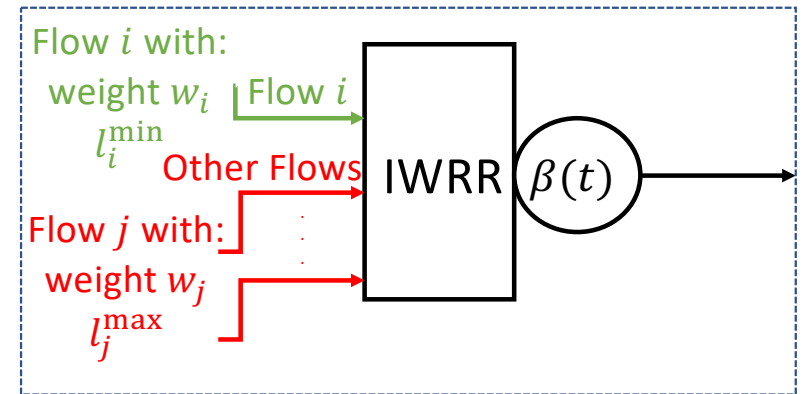
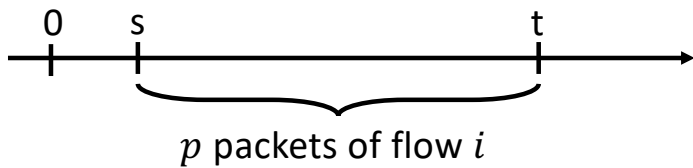
$$l_j^{\max} = \{17, 11, 16\} * 512 \text{ bit}$$

$$\beta(t) = ct \text{ with } c = 10Mbps$$



# Sketch of Proof of IWRR Strict Service Curve

- $(s, t]$ : flow of interest  $i$  is backlogged.
- $p$ : number of complete services of flow  $i$ .
- number of services for other flow  $j \leq \phi_{i,j}(p)$

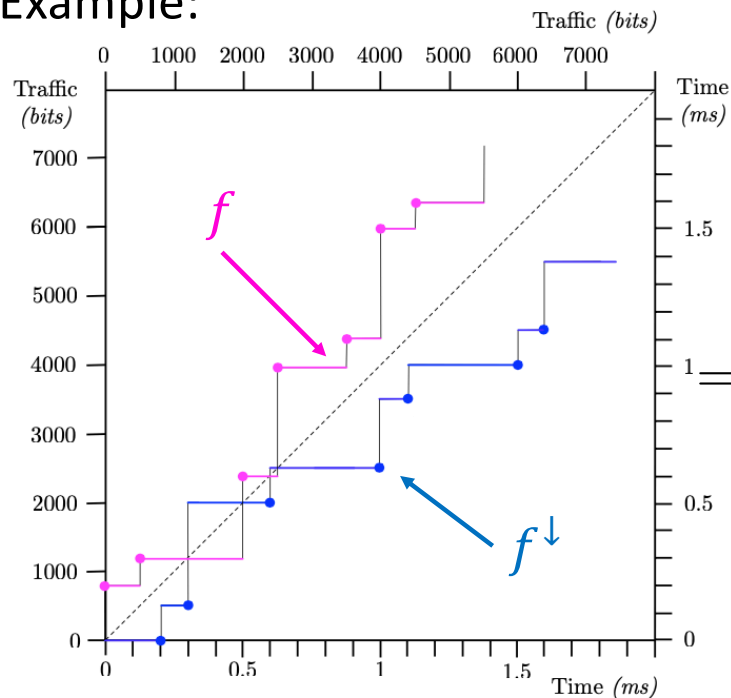


$$\begin{aligned}
 \beta(t - s) &\leq (R_i^*(t) - R_i^*(s)) + \sum_{j, j \neq i} R_j^*(t) - R_j^*(s) \quad (\beta \text{ is the strict service curve of server}) \\
 &\leq (R_i^*(t) - R_i^*(s)) + \sum_{j, j \neq i} \phi_{i,j}(p) l_j^{\max} \\
 &\leq (R_i^*(t) - R_i^*(s)) + \underbrace{\sum_{j, j \neq i} \phi_{i,j} \left( \left\lceil \frac{R_i^*(t) - R_i^*(s)}{l_i^{\min}} \right\rceil \right) l_j^{\max}}_{\psi_i(R_i^*(t) - R_i^*(s))}
 \end{aligned}$$

# Lower Pseudo Inverse Technique

**Definition**[Jörg Liebeherr 2017, Section 10.1] :  $f^\downarrow(y) = \inf\{x|f(x) \geq y\} = \sup\{x|f(x) < y\}$

Example:



[Jörg Liebeherr 2017, Section 10.1]

- Sketch of Proof of IWRR Strict Service Curve (cont.)

**Property:**  $y \leq f(x) \implies x \geq f^\downarrow(y)$

$$\beta(t - s) \leq \psi_i(R_i^*(t) - R_i^*(s)) \text{ (Last step of last slide)}$$

$$\implies R_i^*(t) - R_i^*(s) \geq \psi_i^\downarrow(\beta(t - s)) = \underbrace{(\lambda_1 \otimes U_i)}_{\text{IWRR strict service curve for flow } i}(\beta(t - s))$$

IWRR strict service curve for flow  $i$



## Re-Cap 1

### 1. Strict Service Curve for IWRR.

- We find a novel strict service curve for IWRR.
  - Using lower-pseudo inverse technique.

### 2. Comparison to WRR.

Strict Service Curves (IWRR Vs. WRR)?

### 3. Tightness.

## IWRR Strict Service Curve Always Improves Compared to WRR.

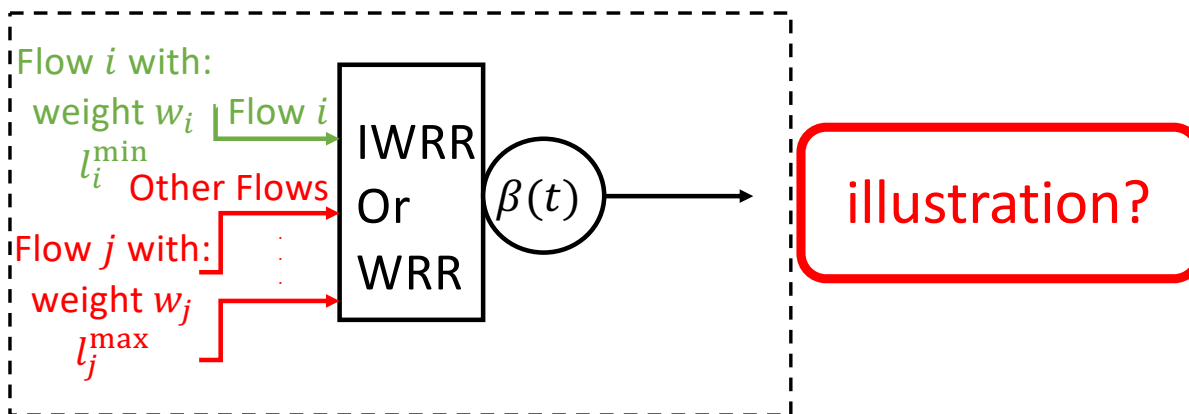
**Theorem 2:** The IWRR strict service curve is larger than or equal to the WRR strict service curve for each flow  $i$

$$\underbrace{\beta'_i(t) = (\lambda_1 \otimes \nu_{q_i, L_{\text{tot}}}) ([\beta(t) - Q_i]^+)}_{\text{WRR Strict Service curve}} \leq \underbrace{\beta_i(t) = (\lambda_1 \otimes U_i)(\beta(t))}_{\text{IWRR Strict Service curve}}$$

WRR Strict Service curve

IWRR Strict Service curve

⇒ Delay bounds for IWRR are less than or equal to delay bounds for WRR.



# Strict Service Curve of IWRR Is always Larger Than or Equal to WRR

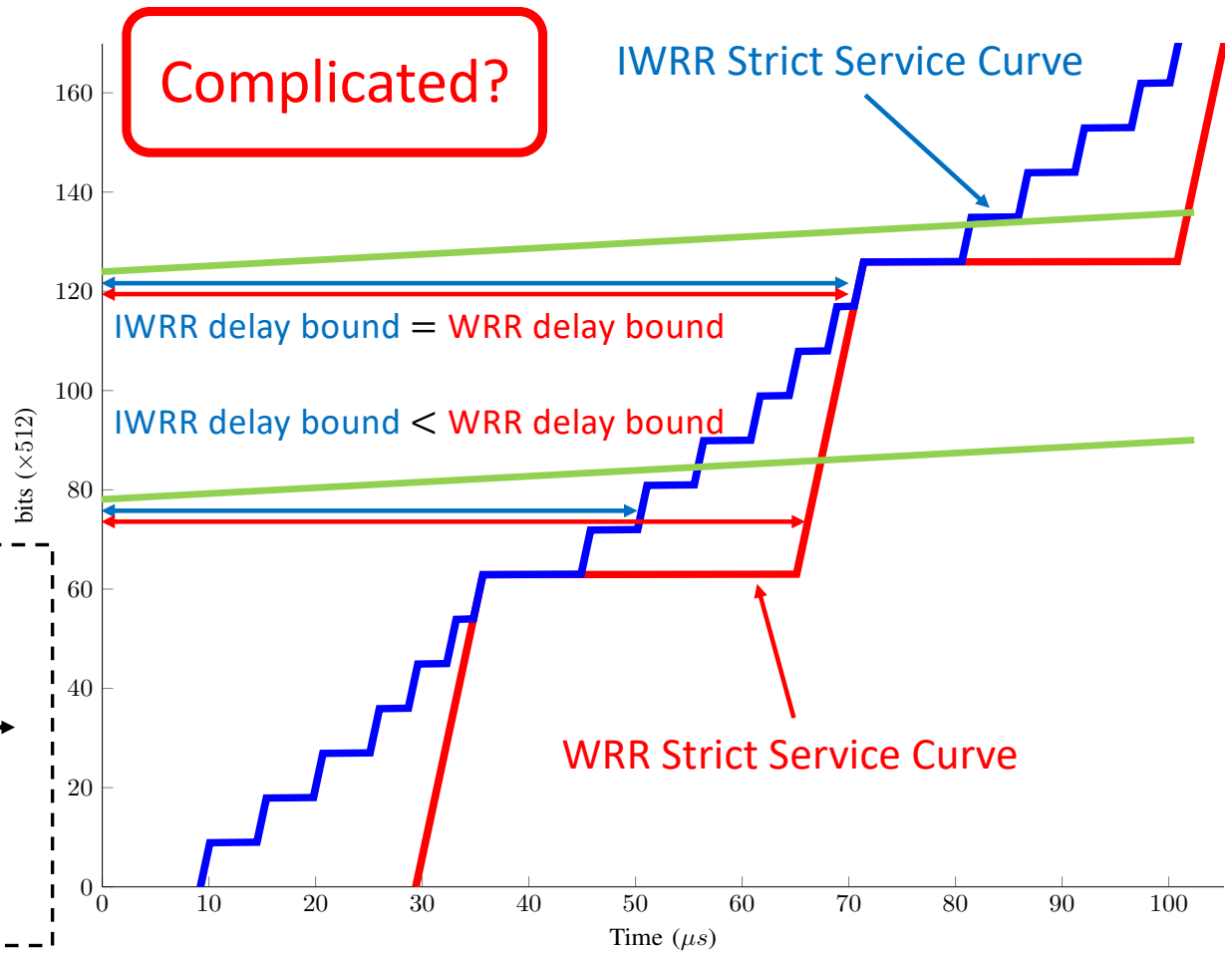
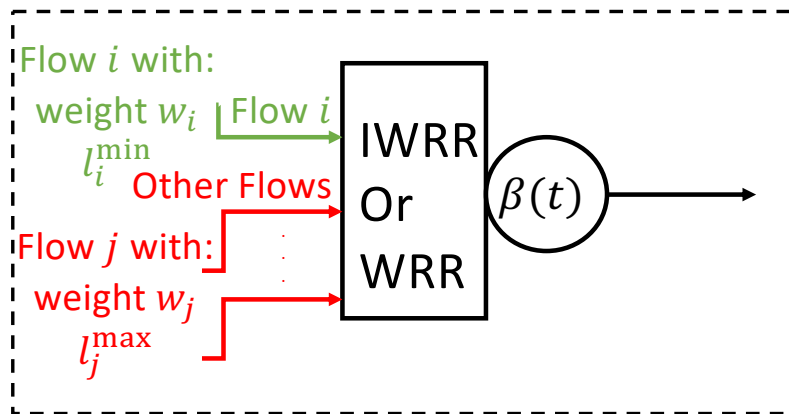
weight  $w_i = 7$

$$l_i^{\min} = 9 * 512 \text{ bit}$$

weights  $w_j = \{4, 6, 10\}$

$$l_j^{\max} = \{17, 11, 16\} * 512 \text{ bit}$$

$$\beta(t) = ct \text{ with } c = 10Mbps$$



## All Non-dominated Rate-latency Strict Service Curves for IWRR.

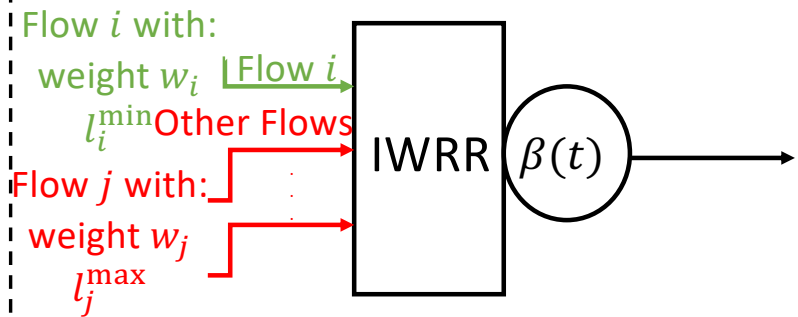
**Theorem 3:** All non-dominated rate-latency service curves guaranteed to flow  $i$ , among them  $\beta_{r_0^*, T_0^*}$  is the one with the **minimum latency** and  $\beta_{r_{k^*}^*, T_{k^*}^*}$  is the one with the **maximum rate**:

$$r_0^* = \frac{l_i^{\min}}{\psi_i(l_i^{\min}) - \psi_i(0)} \text{ and } T_0^* = \psi_i(0)$$

$$k^* = \min\{0 \leq k < w_i \mid \frac{l_i^{\min}}{\psi_i((k+1)l_i^{\min}) - \psi_i(kl_i^{\min})} \geq \frac{q_i}{L_{\text{tot}}}\}$$

$$r_{k^*}^* = \frac{q_i}{L_{\text{tot}}} \text{ and } T_{k^*}^* = \psi_i(k^*l_i^{\min}) - \frac{k^*l_i^{\min}}{r_{k^*}^*}$$

illustration?

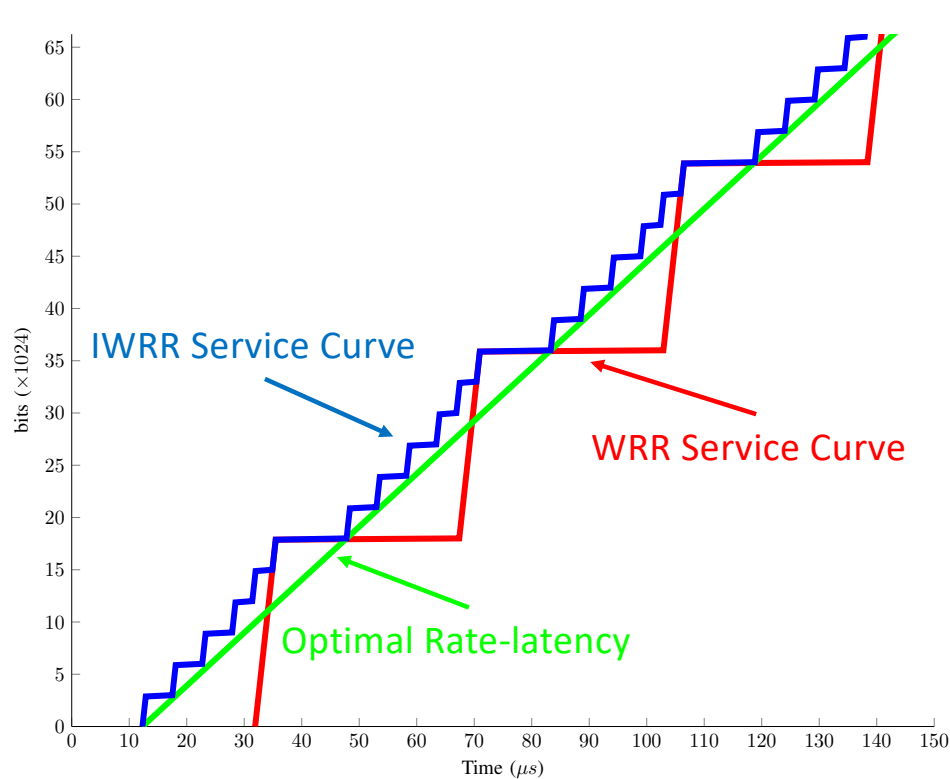


If the strict service curve of the aggregate is a rate-latency ( $\beta(t) = \beta_{c,T}$ ), then  $\beta_{r_0^*, T_0^*}(\beta(t))$  and  $\beta_{r_{k^*}^*, T_{k^*}^*}(\beta(t))$  are also rate-latency.

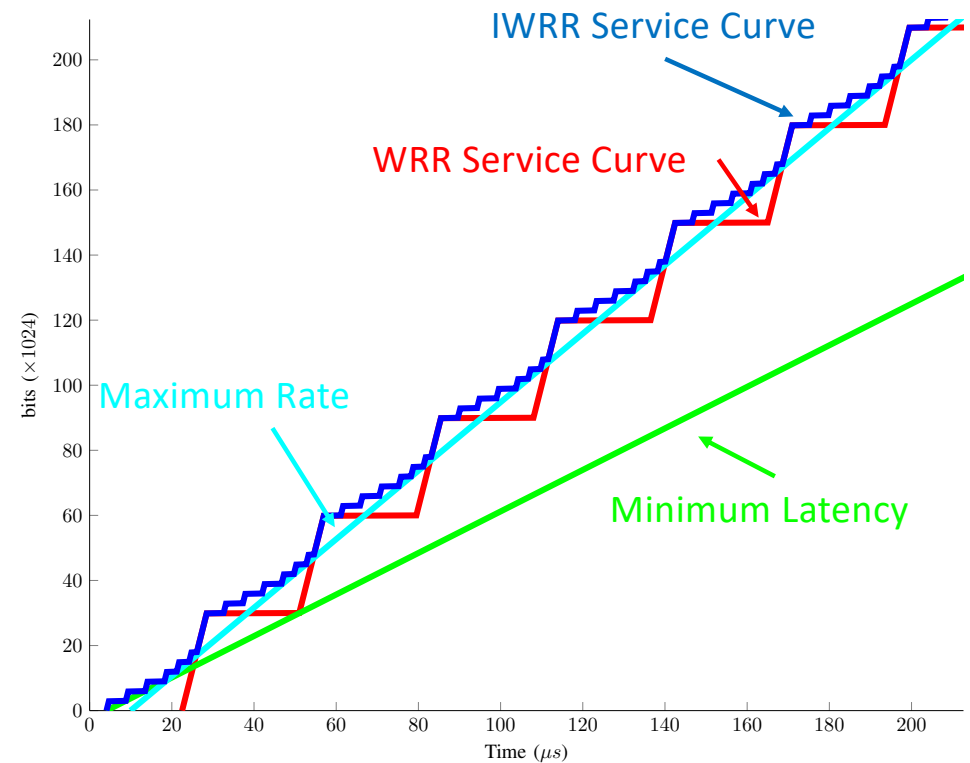


# Example of Non-dominated Rate-latency IWRR Strict Service Curve

**Possible case 1:** One optimal non-dominated rate-latency:



**Possible case 2:** Set of non-dominated rate-latency service curves:



## Re-Cap 2.1

### 1. Strict Service Curve for IWRR.

- We find a novel strict service curve for IWRR.
  - Using lower-pseudo invers technique.
- We find all non-dominated rate-latency service curves.

### 2. Comparison to WRR.

- IWRR Strict Service Curve always improves compared to WRR.

### 3. Tightness.

Better Strict Service Curve?

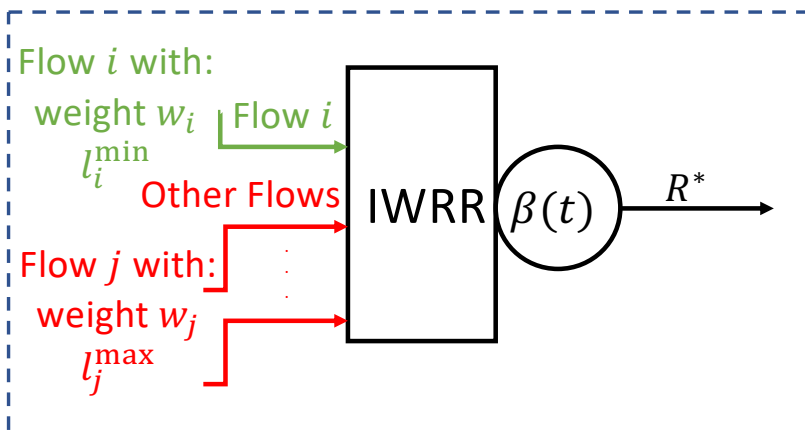
## Our Strict Service Curve Is the Best Possible.

**Theorem 4:**  $\beta_i$  is the **largest** strict service curve that can be given for flow  $i$ .

Specifically, we show for all flows  $i$ , there exists a trajectory scenario such that:

$\exists s \geq 0, (s, s + \tau]$  is backlogged for flow  $i$

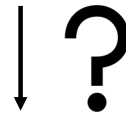
and  $R_i^*(s + \tau) - R_i^*(s) = \beta_i(\tau)$



The same is also valid for the WRR strict service curve.  
(Theorem 5)

## Re-Cap 2.2

We have found the largest possible strict service curve. 😊



Automatically implies best delay bounds?



No! 😞

← Service curve is only an abstraction of the service. The true thing is IWRR.

→ There might be a better service curve that is not strict.

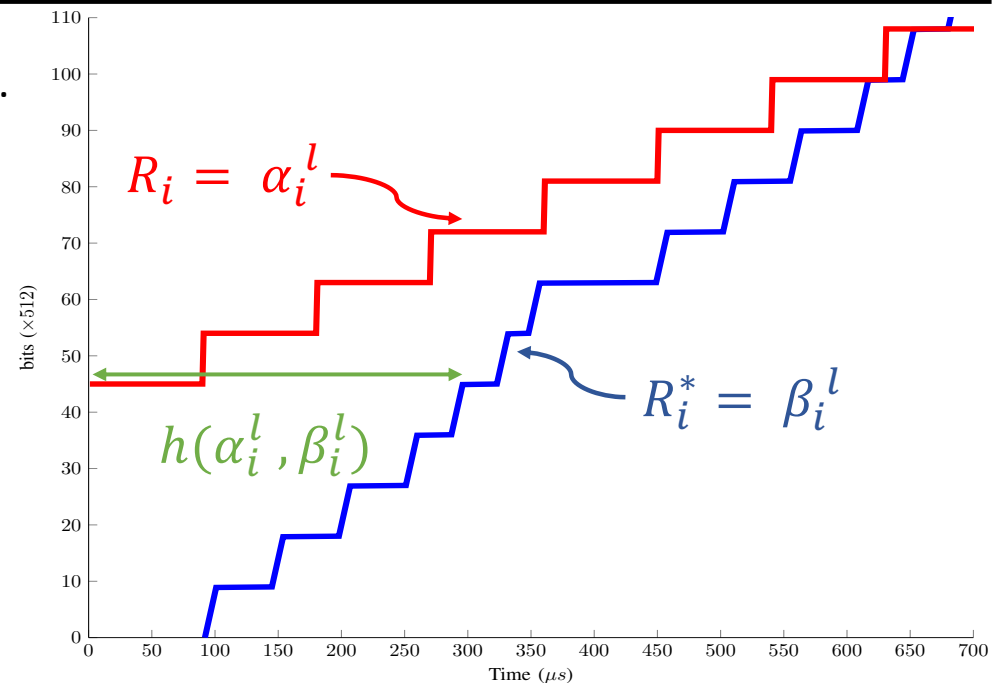
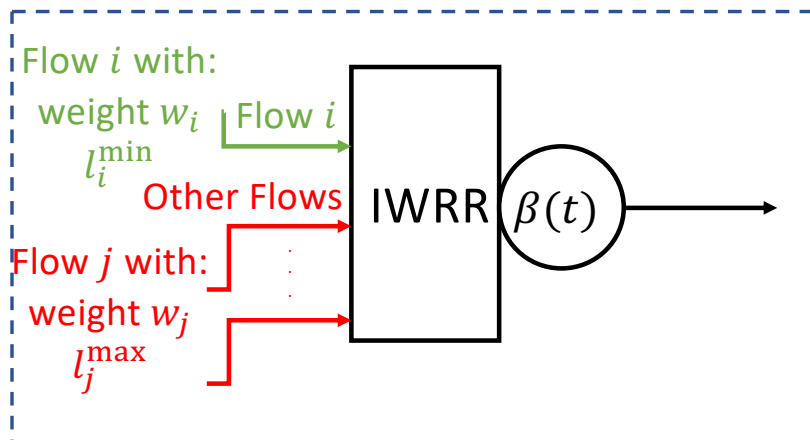
↘ Tight delay bounds for constant packet size. 😊

# Obtained Delay Bound Is Tight, for Constant Packet Size.

## Theorem 6:

Flow  $i$  only generates packets of size  $l$  ( $l_i^{\min} = l_i^{\max}$ ). Then, for every integer (multiple of  $l$ ) arrival curve  $\alpha_i^l$ , the network calculus delay bound is **tight** (i.e., worst case).

The same is also valid for the WRR strict service curve. (Theorem 7)



## Re-Cap 3

### 1. Strict Service Curve for IWRR.

- We find a novel strict service curve for IWRR.
- We find all non-dominated rate-latency service curves.

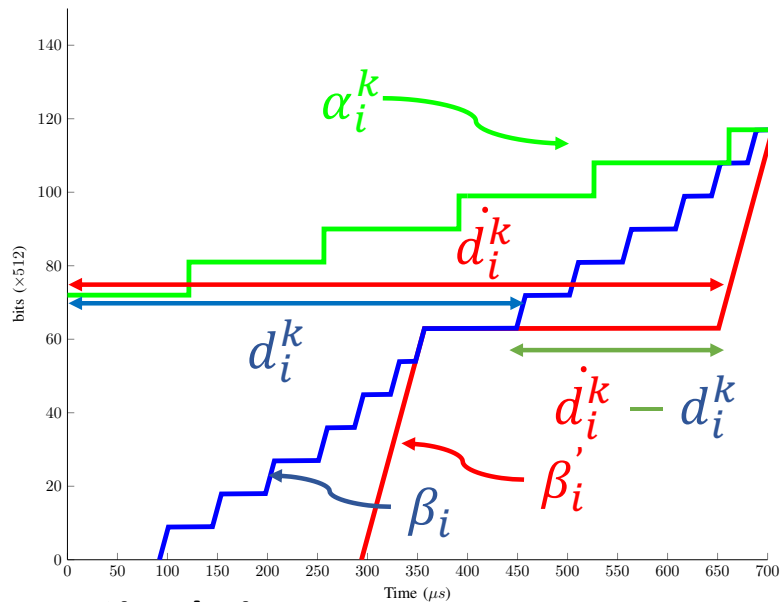
### 2. Comparison to WRR. Numerical Example?

- IWRR Strict Service Curve always improves compared to WRR.

### 3. Tightness.

- Our Strict Service Curve is the best possible one.
- For a flow with constant packet size, we show that:
  - Obtained delay bound is **tight**.

# Improvement of Delay Bounds with IWRR.



## Simulation Parameters:

8 input flows.

Weights = {22,27,28,30,34,41,45}

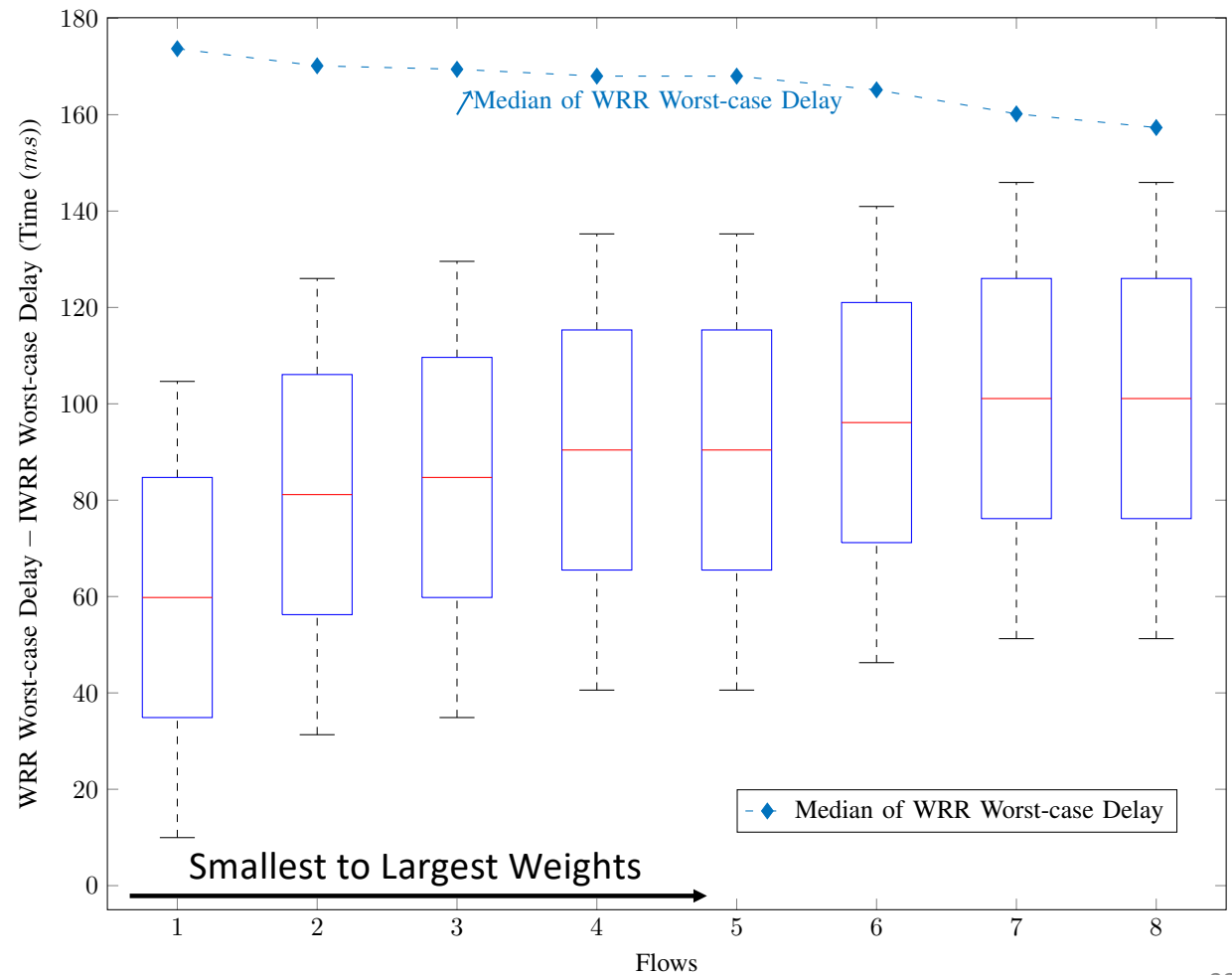
$l^{\max} = l^{\min} = 7119$  bit.

Constant bit rate server, 10 Mbps.

## Token-bucket Arrival Curves:

Initial bursts: uniformly [1,20] packets.

A rate of 0.5 Mbps.



# Better Improvement for Flows with Larger Weights.

$$\text{Improvement Ratio} = \frac{\text{Improvement}}{\text{Median of WRR worst\_case delay}}$$

## Simulation Parameters:

8 input flows.

Weights  $\in [10, 50]$ .

$l^{\max} = l^{\min} \in [64, 1522]$  byte.

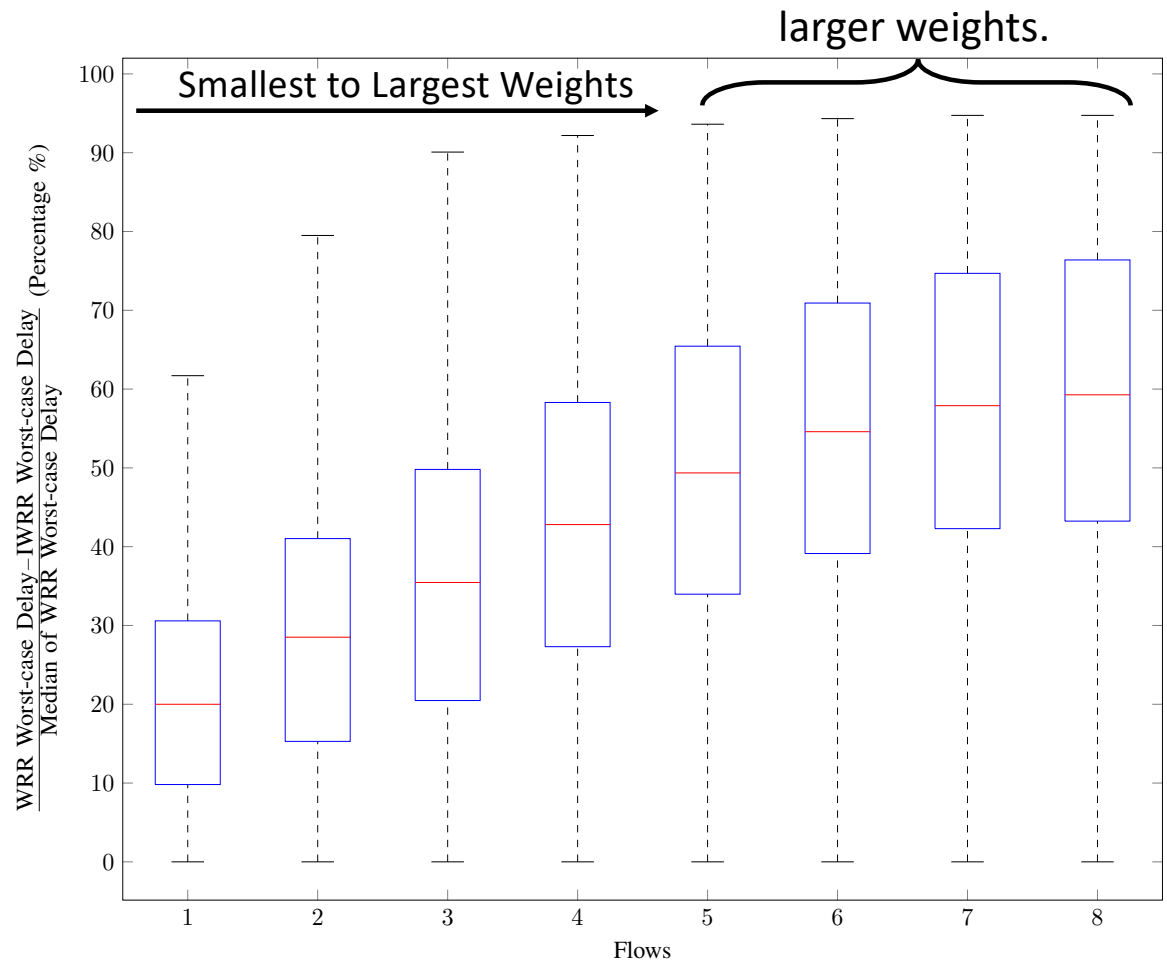
Uniformly random.

Constant bit rate server, 10 Mbps.

## Token-bucket Arrival Curves:

Initial bursts: uniformly  $[1, 20]$  packets.

A rate of 0.5 Mbps.





## Conclusion

- We find a novel strict service curve for IWRR.
  - Using lower-pseudo inverse technique.
- We show that:
  - It is the best possible one.
  - It always improves compared to WRR.
- We also find all non-dominated rate-latency service curves.
- We show that obtained delay bound is **tight**, for a flow with constant packet size.

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## References

- M. Katevenis, S. Sidiropoulos and C. Courcoubetis, "Weighted round-robin cell multiplexing in a general-purpose ATM switch chip," in *IEEE Journal on Selected Areas in Communications*, vol. 9, no. 8, pp. 1265-1279, Oct. 1991, doi: 10.1109/49.105173.
- A. Bouillard, M. Boyer, and E. Le Corronc, *Deterministic Network Calculus: From Theory to Practical Implementation*. Wiley-ISTE.
- Jörg Liebeherr (2017), "Duality of the Max-Plus and Min-Plus Network Calculus", *Foundations and Trends® in Networking*: Vol. 11: No. 3-4, pp 139-282.  
<http://dx.doi.org/10.1561/13000000059>.
- S. M. Tabatabaee, J.-Y. L. Boudec, and M. Boyer, "Interleaved weighted round-robin: A network calculus analysis," <https://arxiv.org/pdf/2003.08372.pdf>