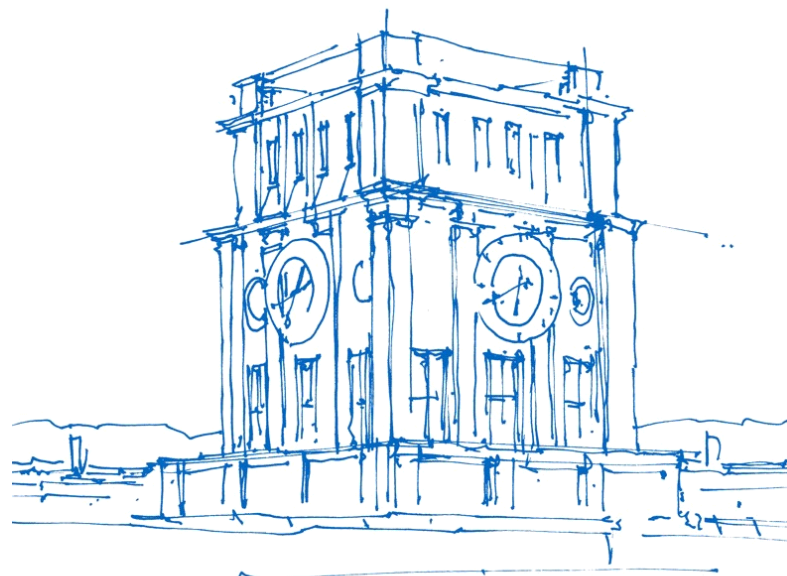


DetServ: Network Models for Real-Time QoS Provisioning in SDN-based Industrial Environments

Amaury Van Bempten
amaury.van-bempten@tum.de

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Based on:
J. W. Guck, A. Van Bempten and W. Kellerer, "DetServ: Network Models for Real-Time QoS Provisioning in SDN-Based Industrial Environments," in IEEE Transactions on Network and Service Management, Dec. 2017.



Uhrenturm der TUM

Wind power

Wind power: what really happened when the Ayrshire turbine caught fire?

Dramatic picture was seized upon by opponents of wind energy but the same gales caused a much bigger nuclear power outage

Michael MacLeod

Tue 28 Feb 2012 10.00 GMT



🕒 This article is 6 years old

18



▲ A wind turbine bursts into flames as storms tear across Scotland. Photograph: Stuart McMahon/Universal News and Sport

As Scots surveyed the damage after the fierce winds of 8 December last year, many newspapers carried a striking picture of a wind turbine **in flames**.

The drama at Ardrossan windfarm in North Ayrshire - **which was caught on film - became a defining image of hurricane-force winds that peaked at 165mph, bringing down power lines and leaving about 60,000 people without electricity.**

For some, the fire symbolised all that is wrong with wind turbines. Sir Bernard Ingham, secretary of the **Supporters of Nuclear Energy** group, said: "They are no good when the wind doesn't blow and they are no good when the wind does blow."

£2.000.000 turbine destroyed

Turbine stopped **when** wind too strong

60.000 people without electricity

Turbine disconnected from the grid **when** it fails

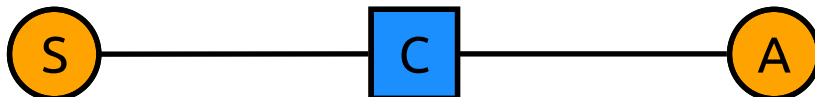
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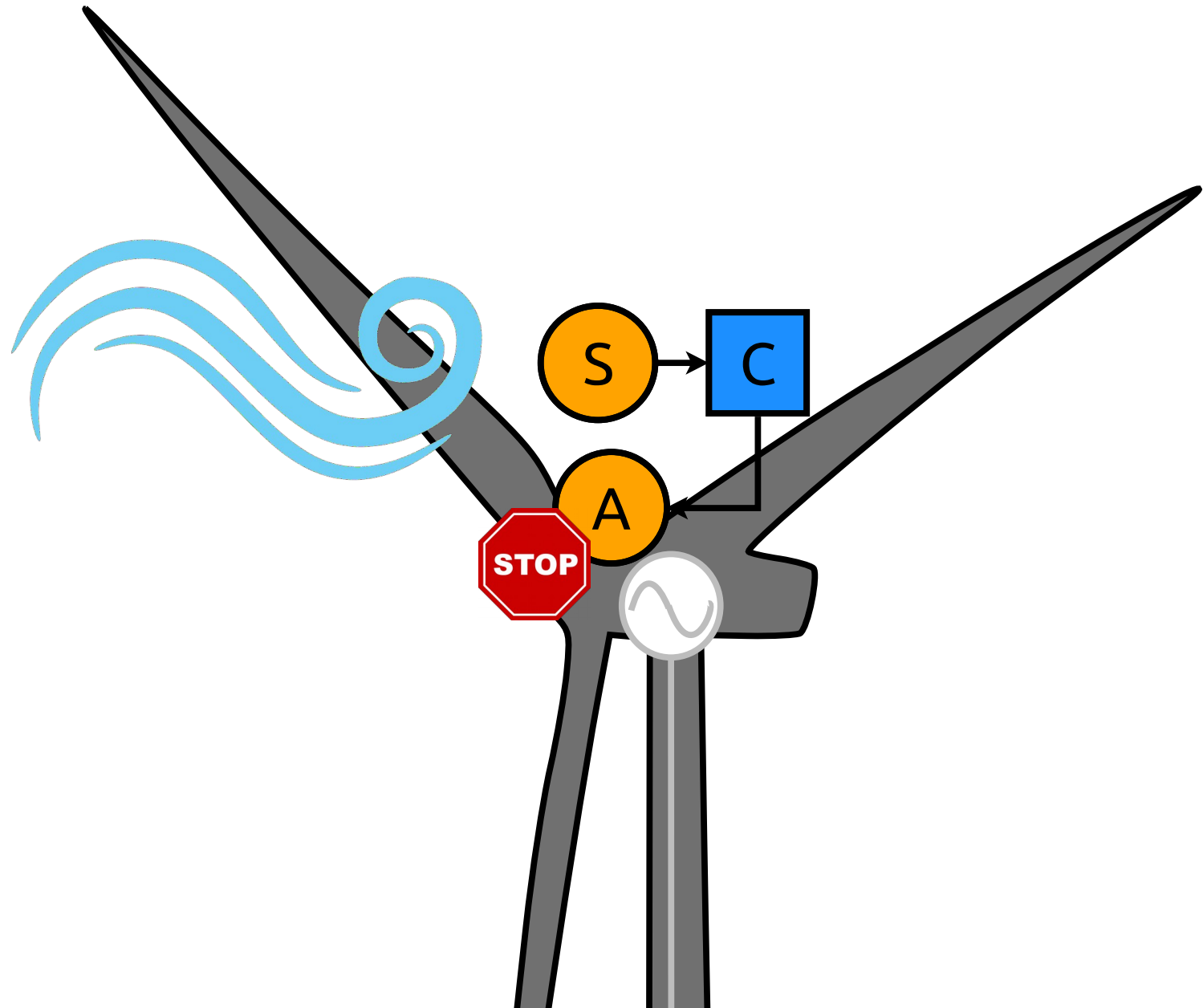
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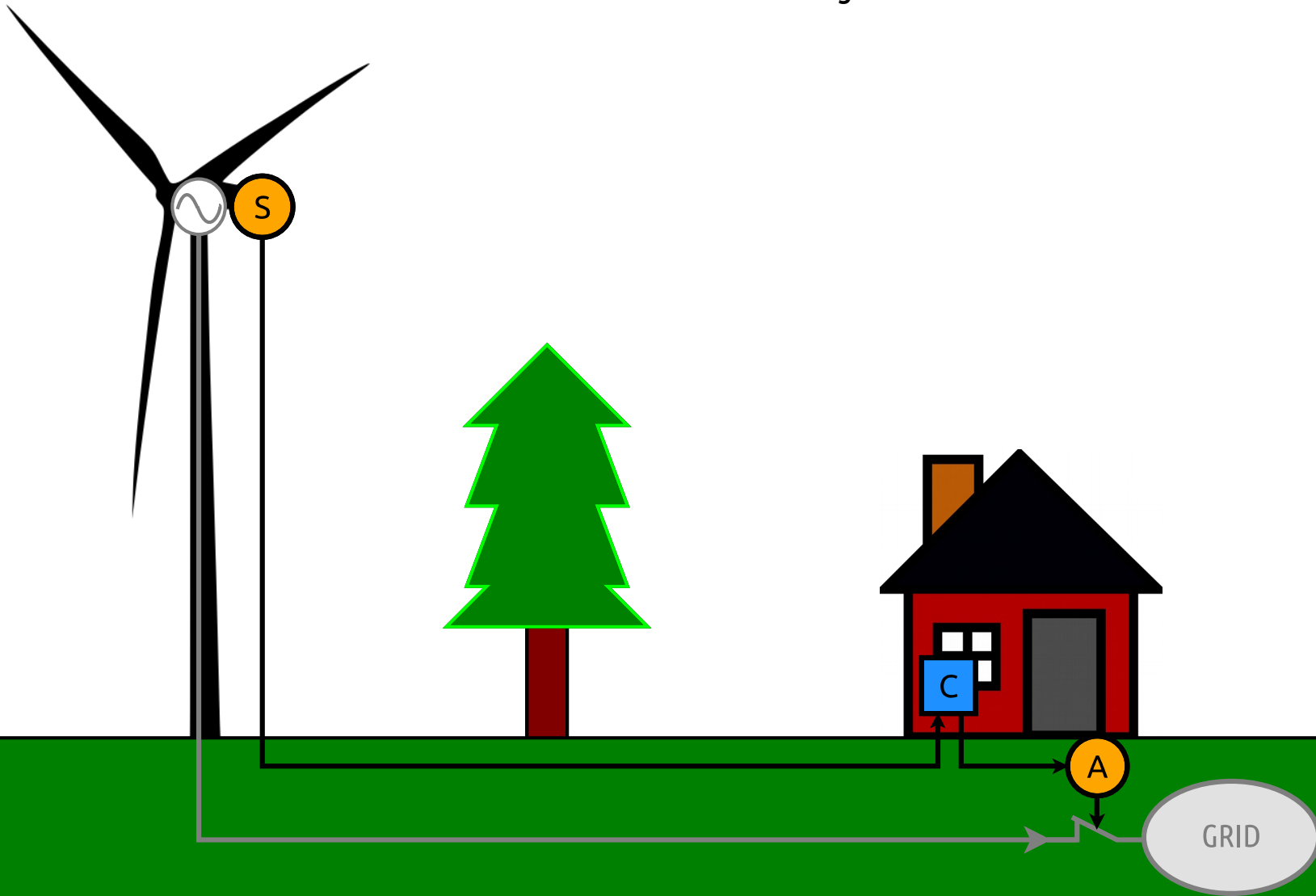
sensor – controller – actuator communication



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£2.000.000 turbine destroyed

60.000 people without electricity

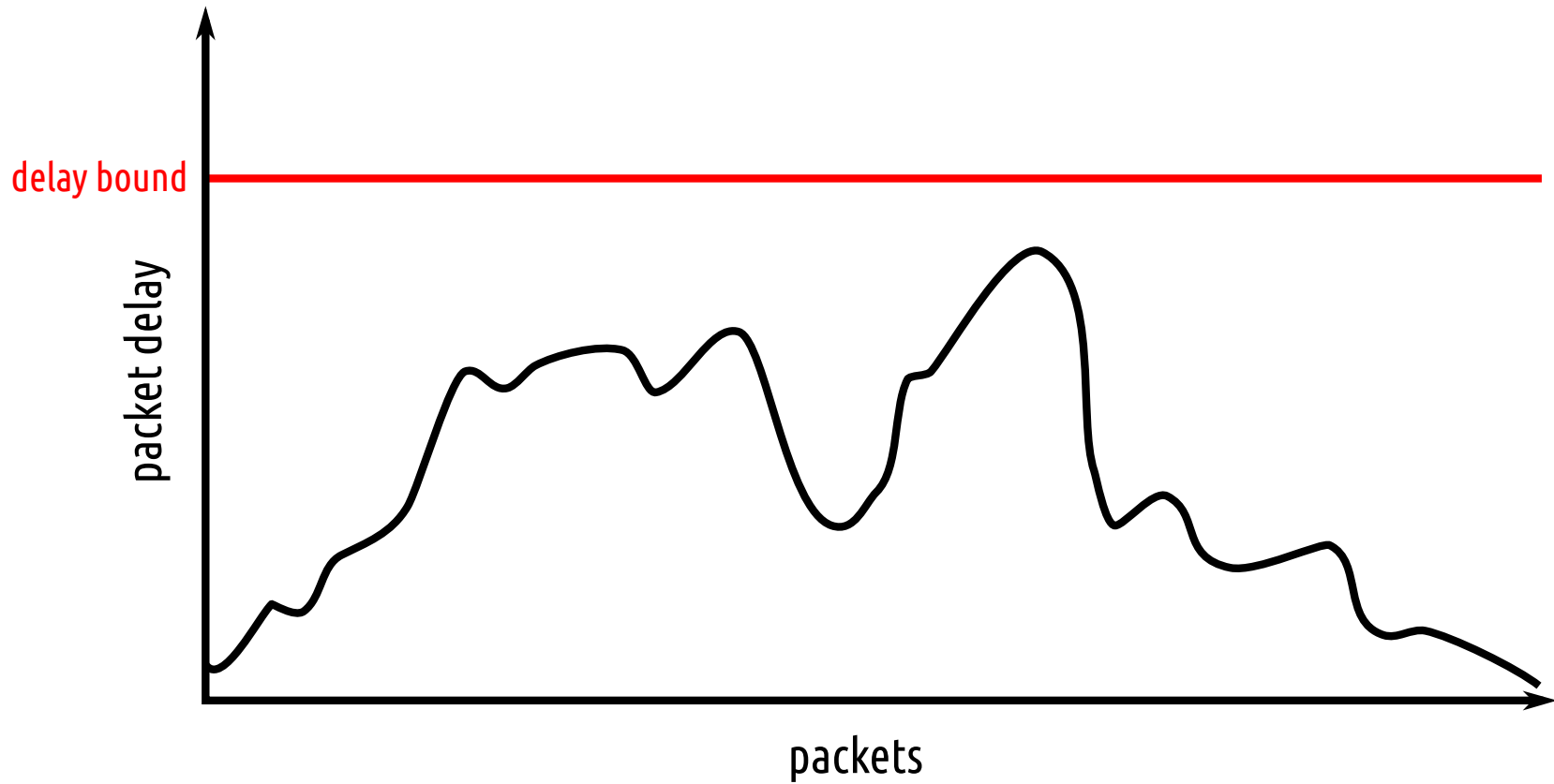
In order to avoid such losses and damages

sensor – controller – actuator communication

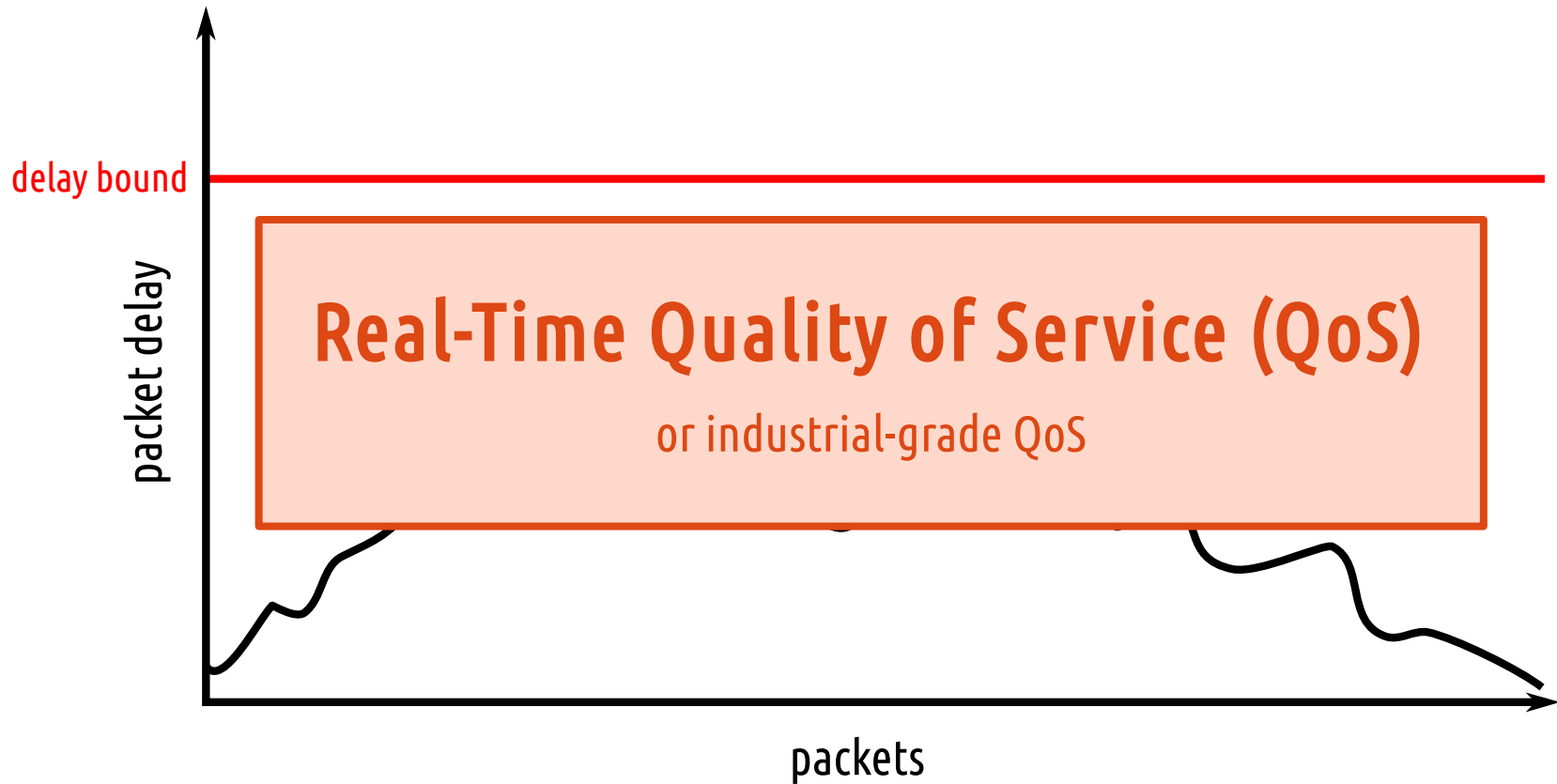
must be

deterministically delay bounded

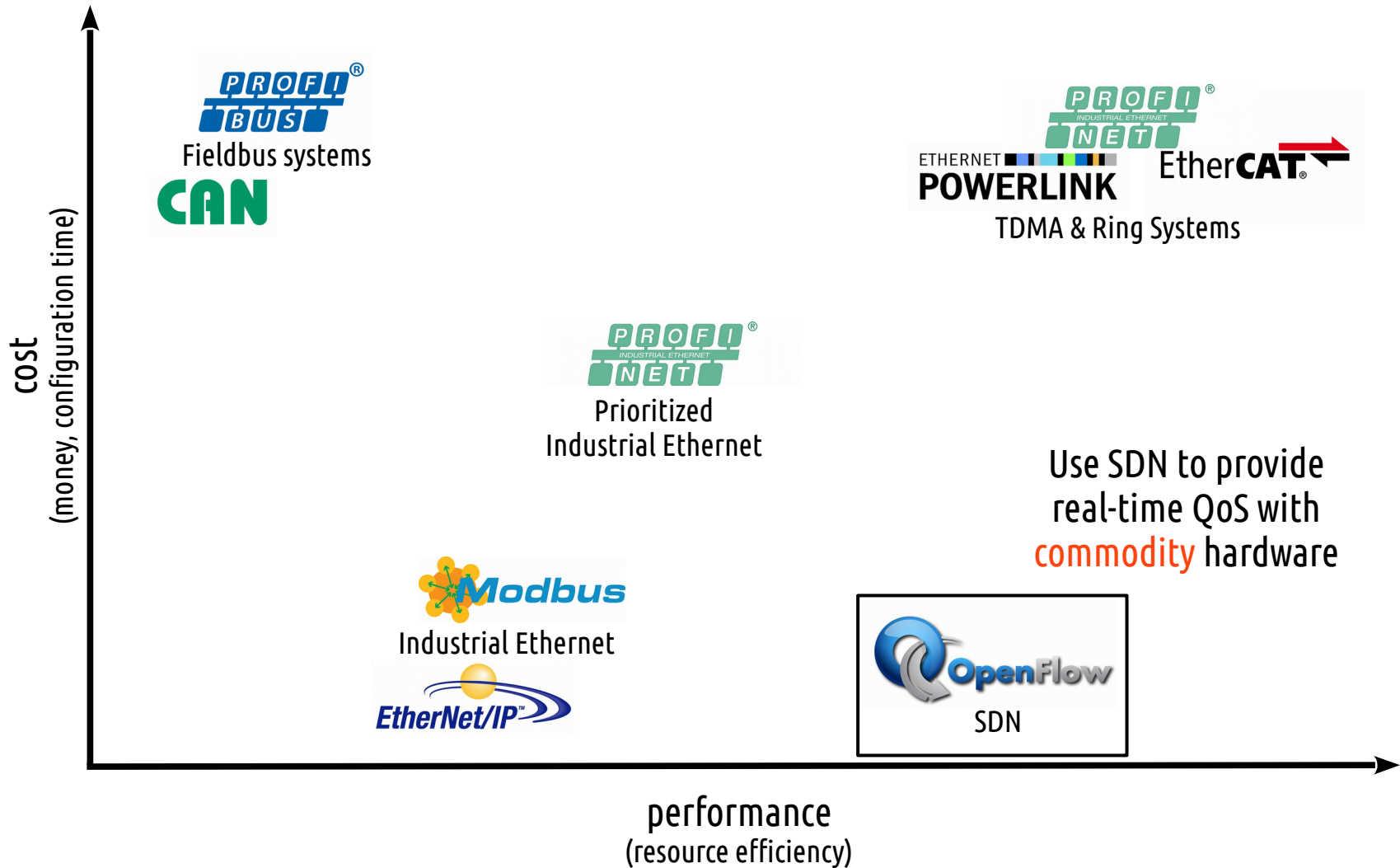
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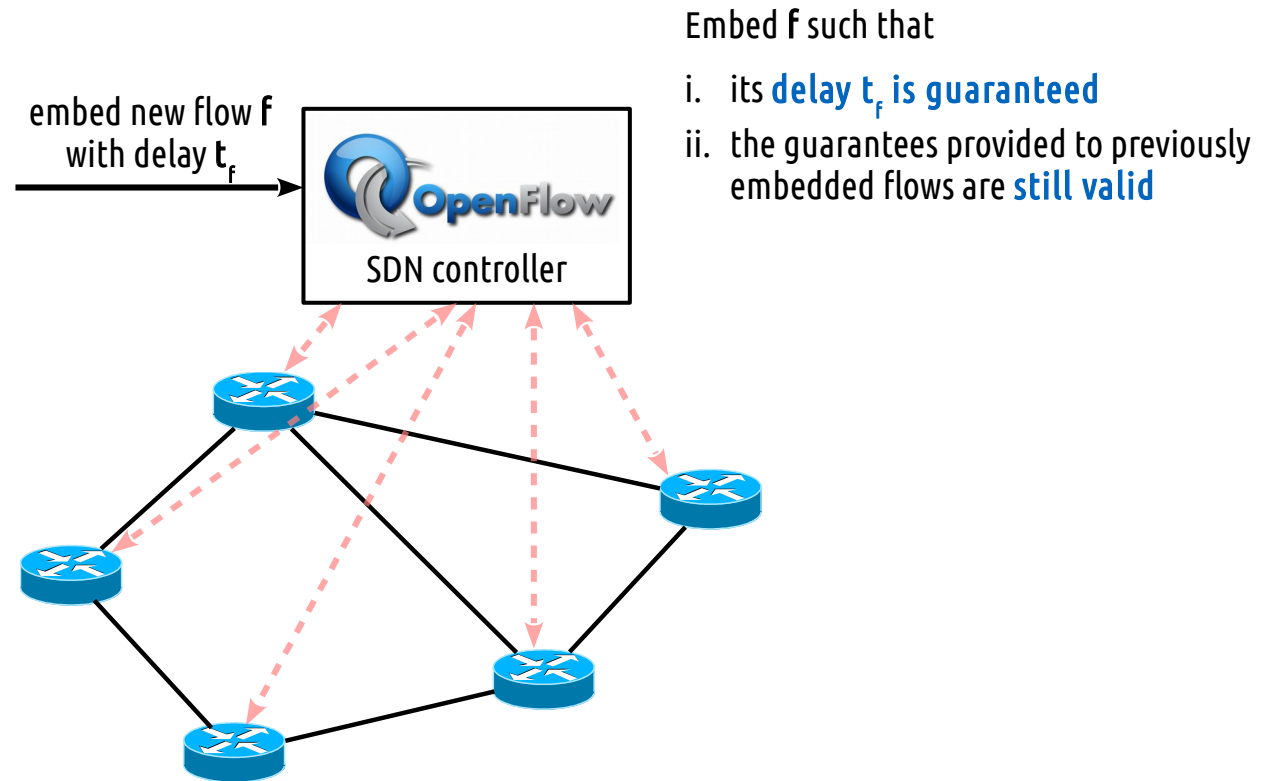


deterministically delay bounded



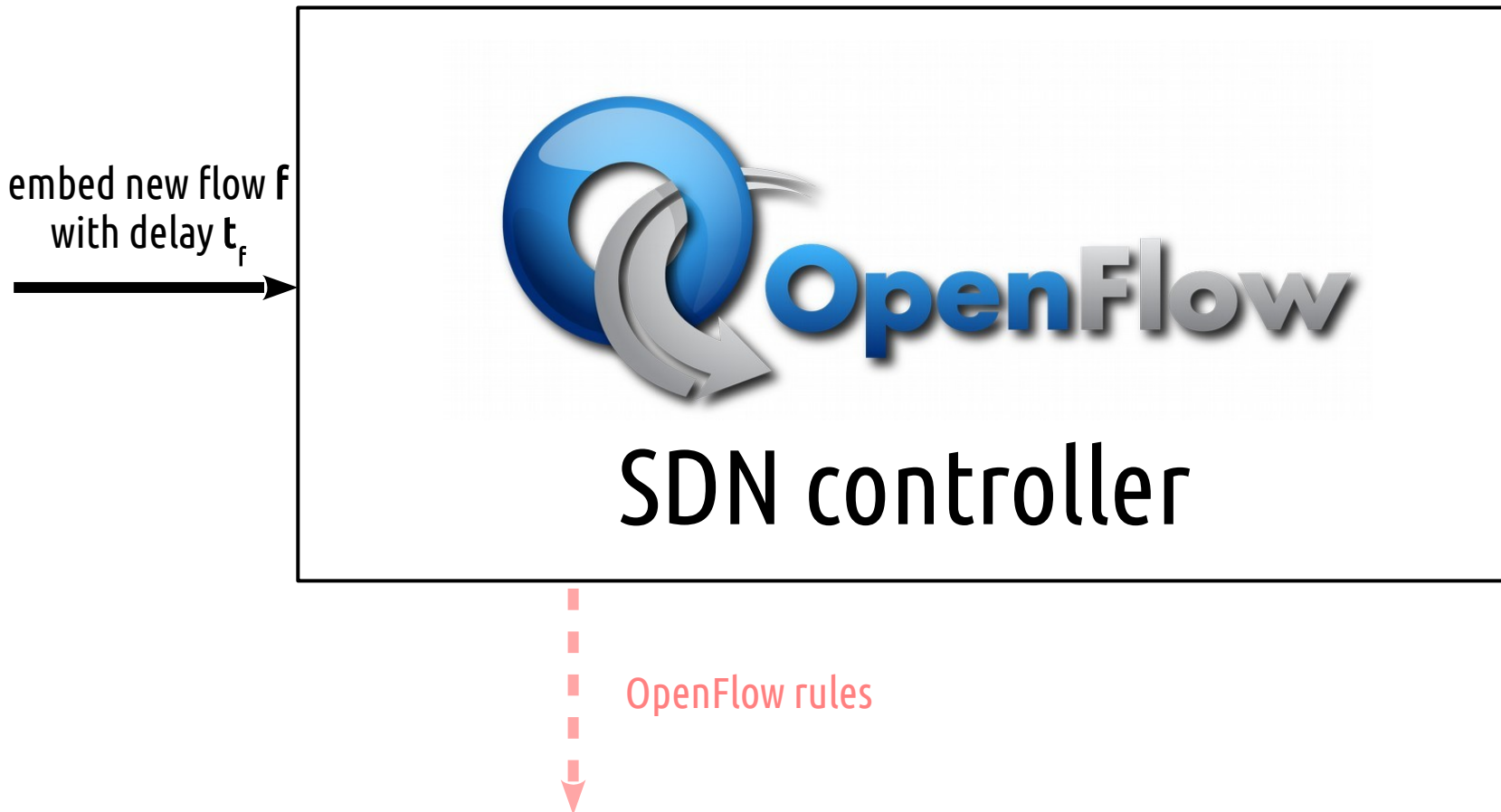
SoA proprietary technologies are typically **costly** and not **interoperable**





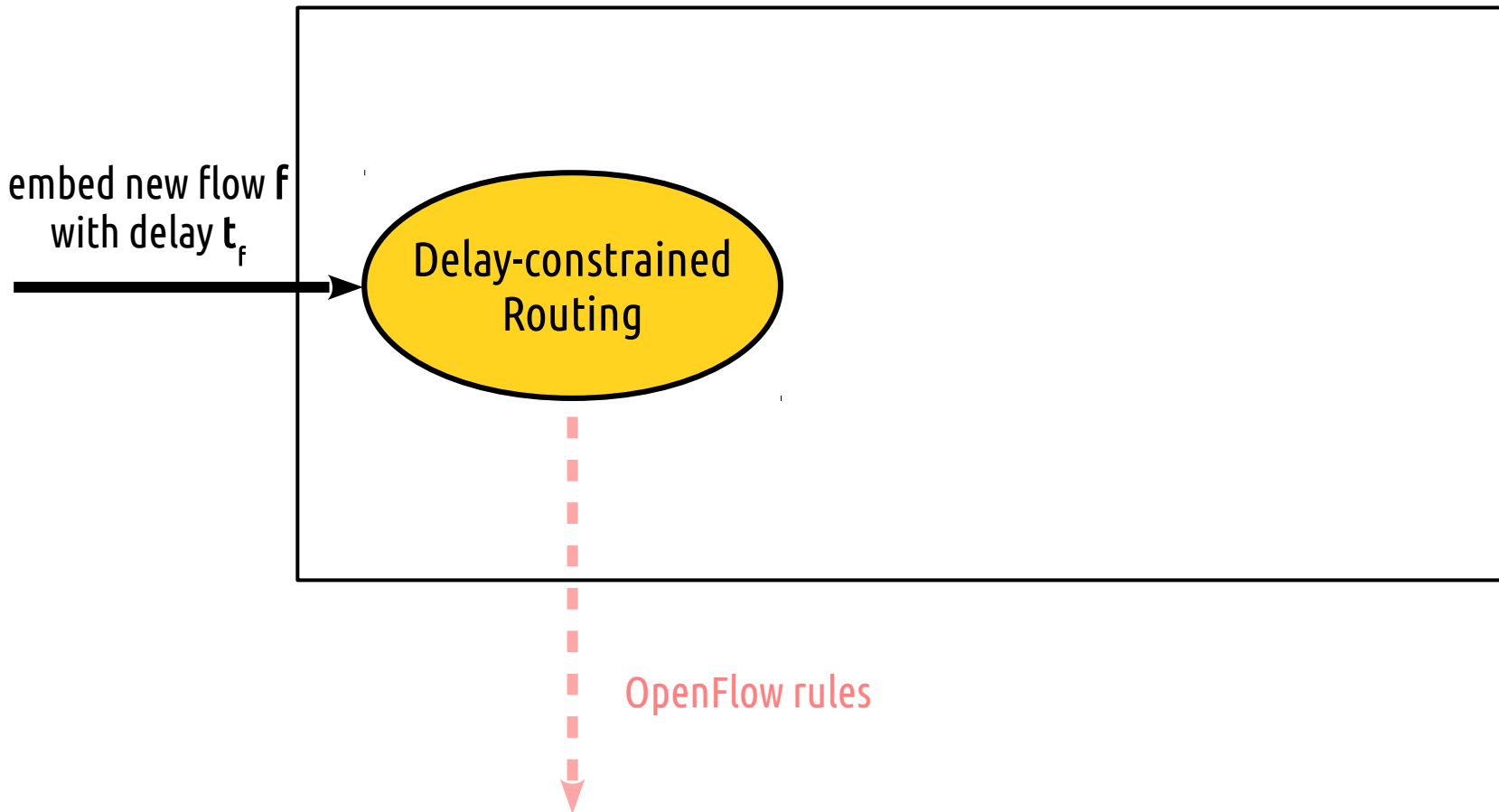
Embed f such that

- i. its **delay t_f is guaranteed**
- ii. the guarantees provided to previously embedded flows are **still valid**



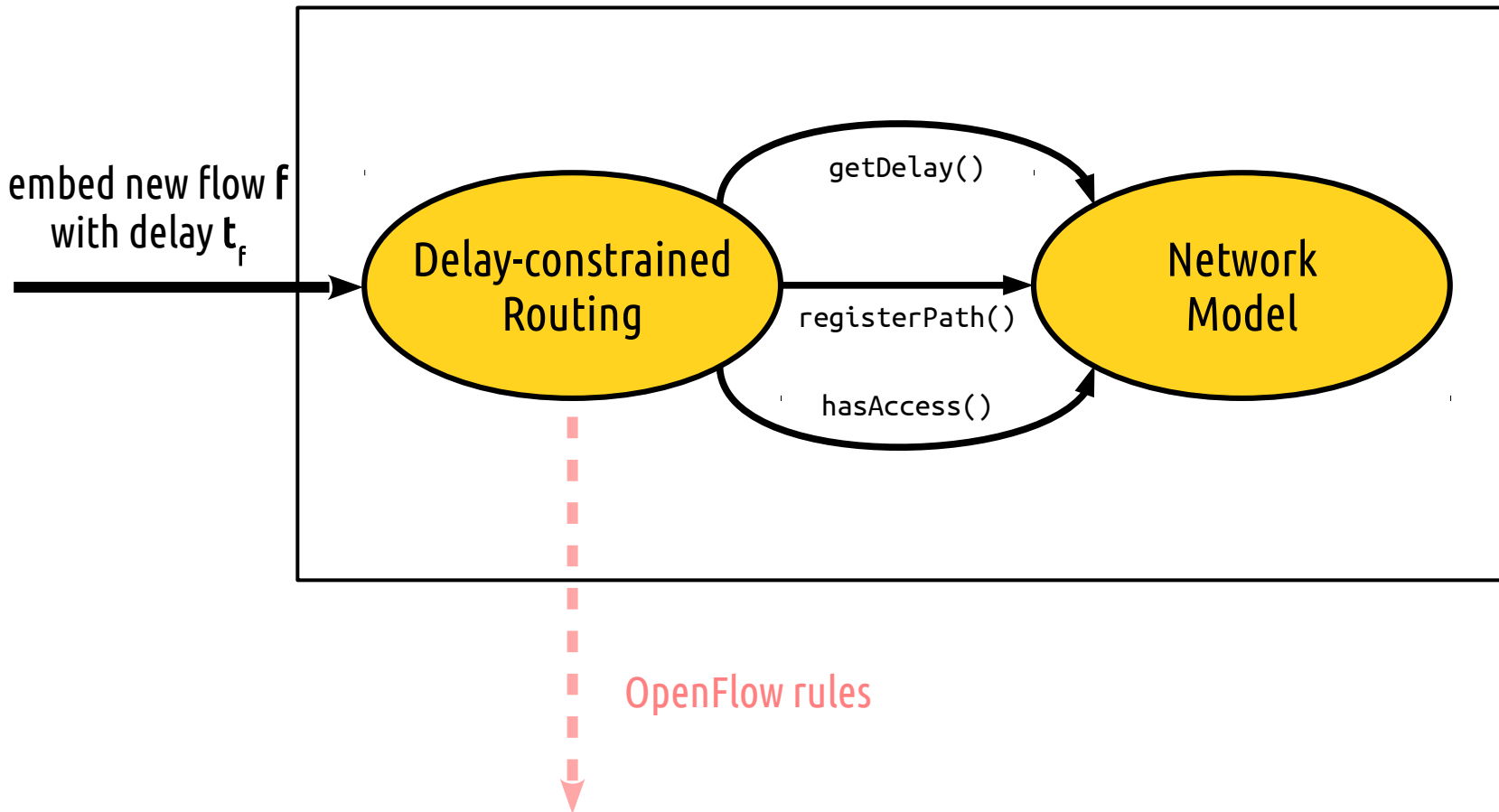
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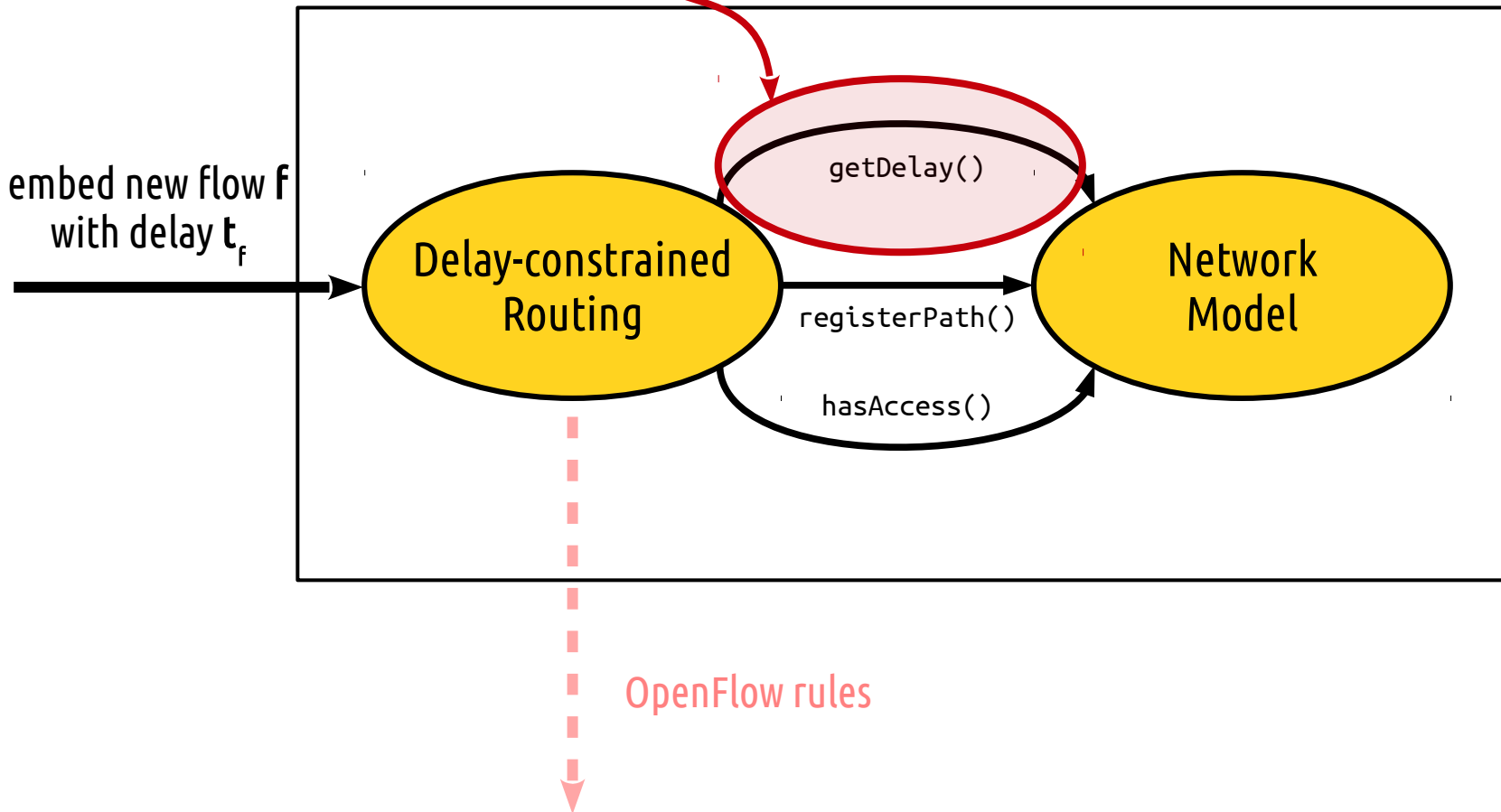
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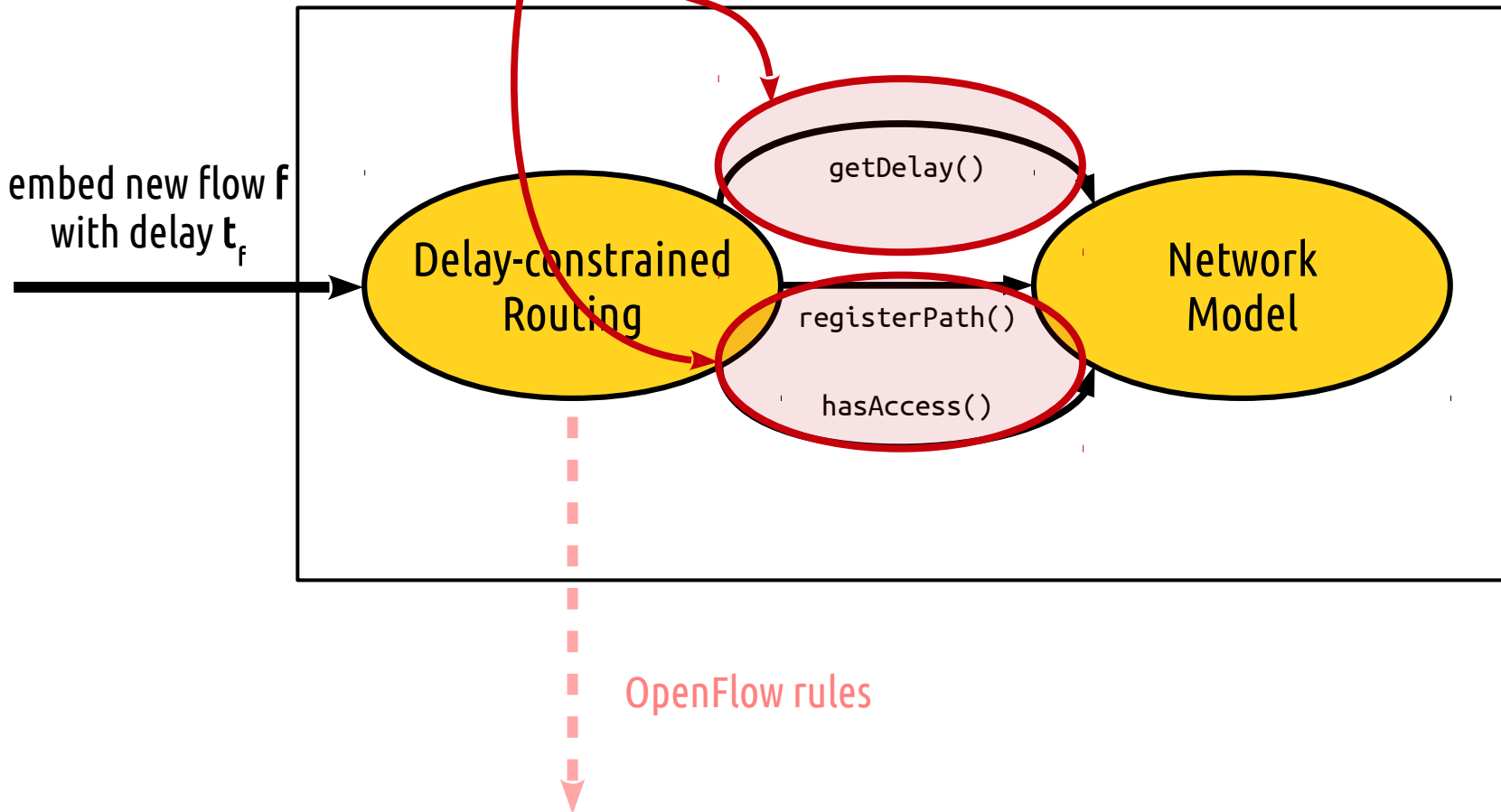
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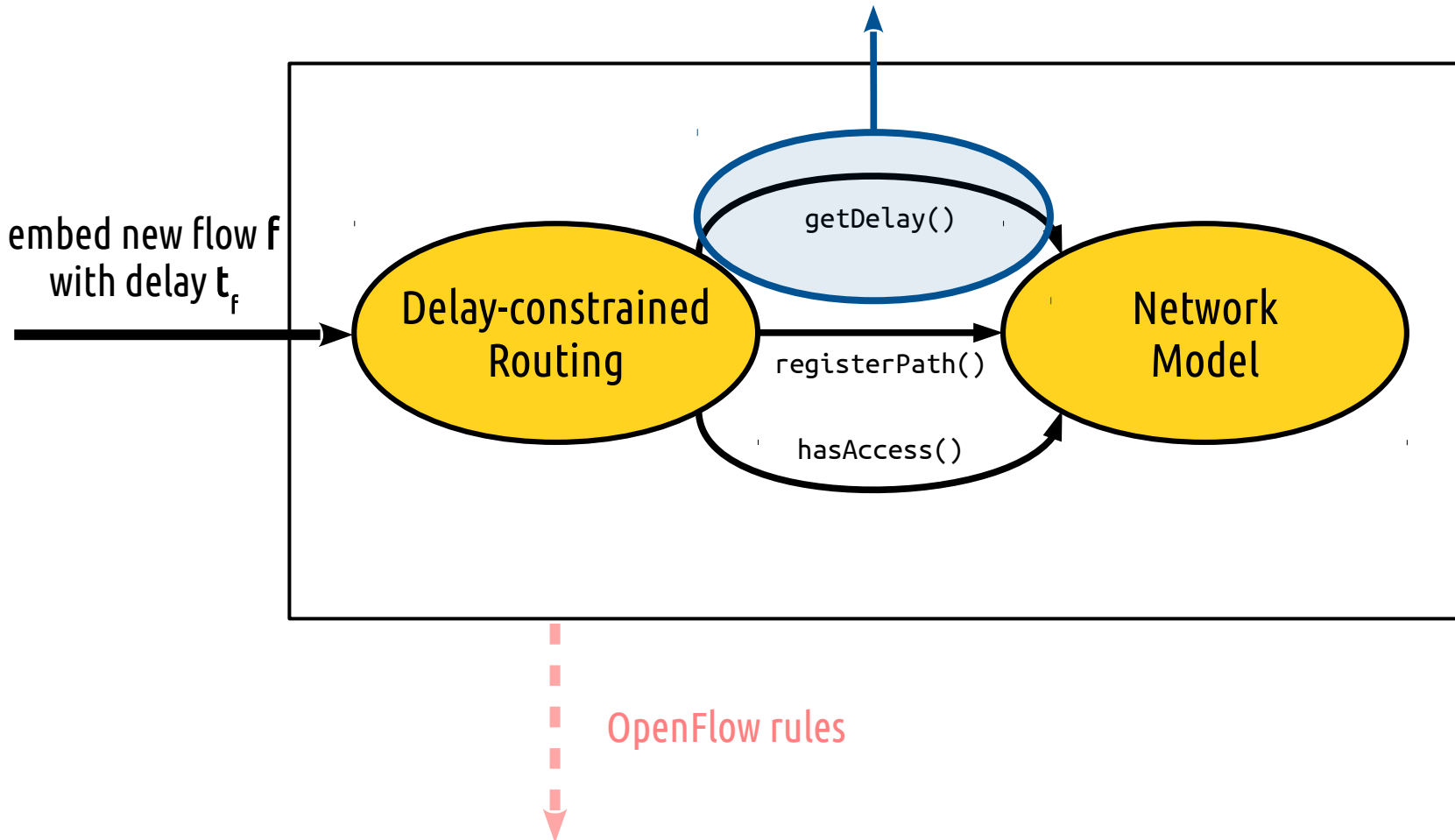
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The delay of a route depends on

- # the physical **links**
- # how the flow is **scheduled** at each node



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the physical **links**

how the flow is **scheduled** at each node

the **queue** at which the flow is schedule at each node

assuming priority scheduling
(cheap and ubiquitous)



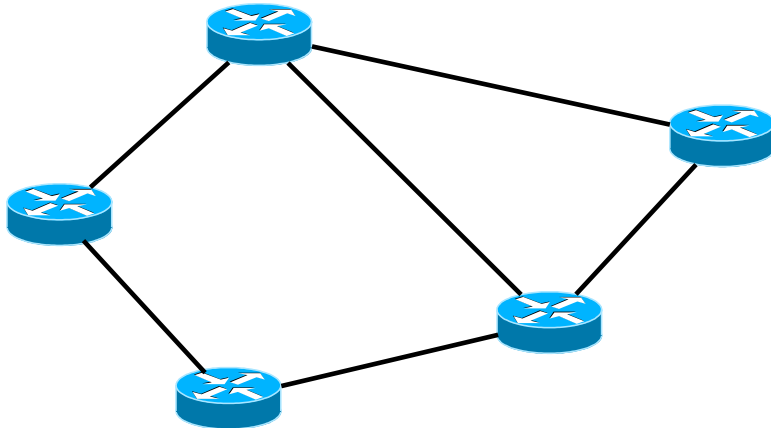
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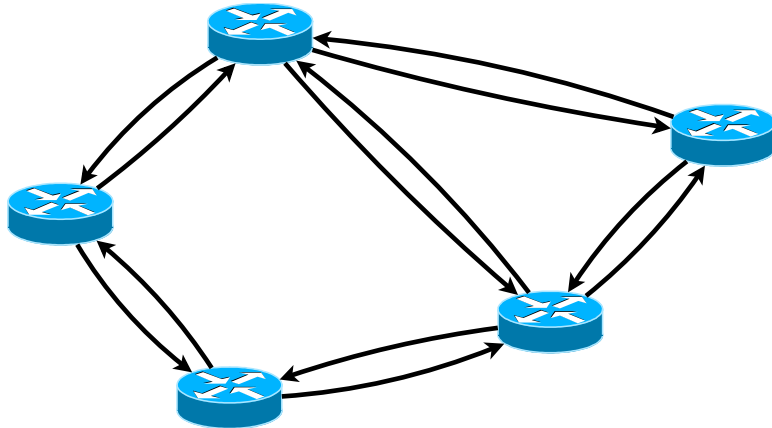
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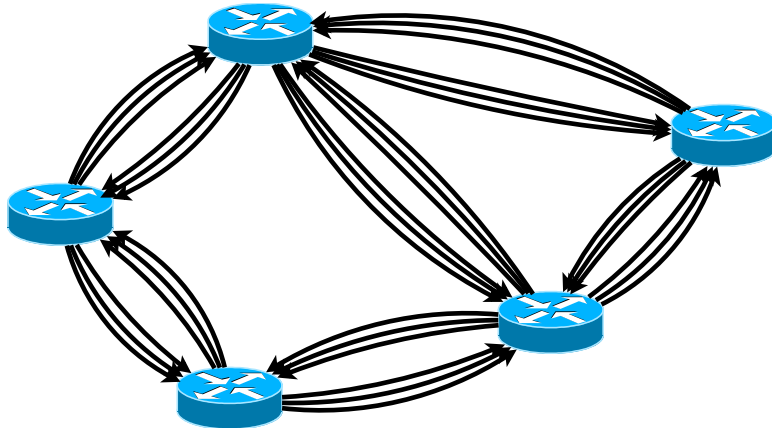
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with, e.g., 3 priority queues
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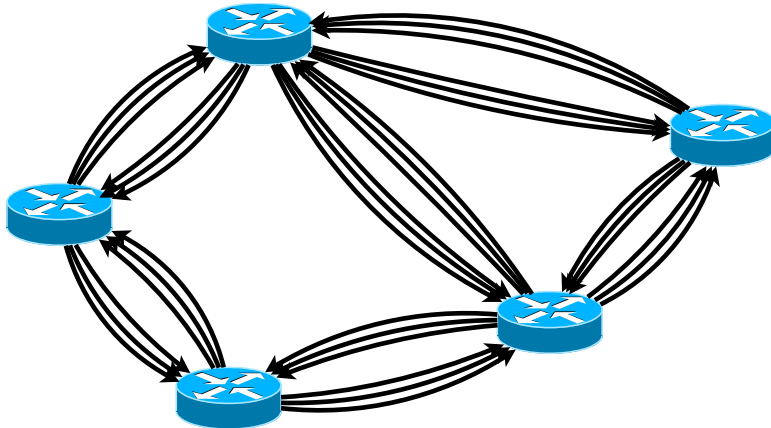
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QUEUE LINK TOPOLOGY

with, e.g., 3 priority queues
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Performing route selection on this topology defines both



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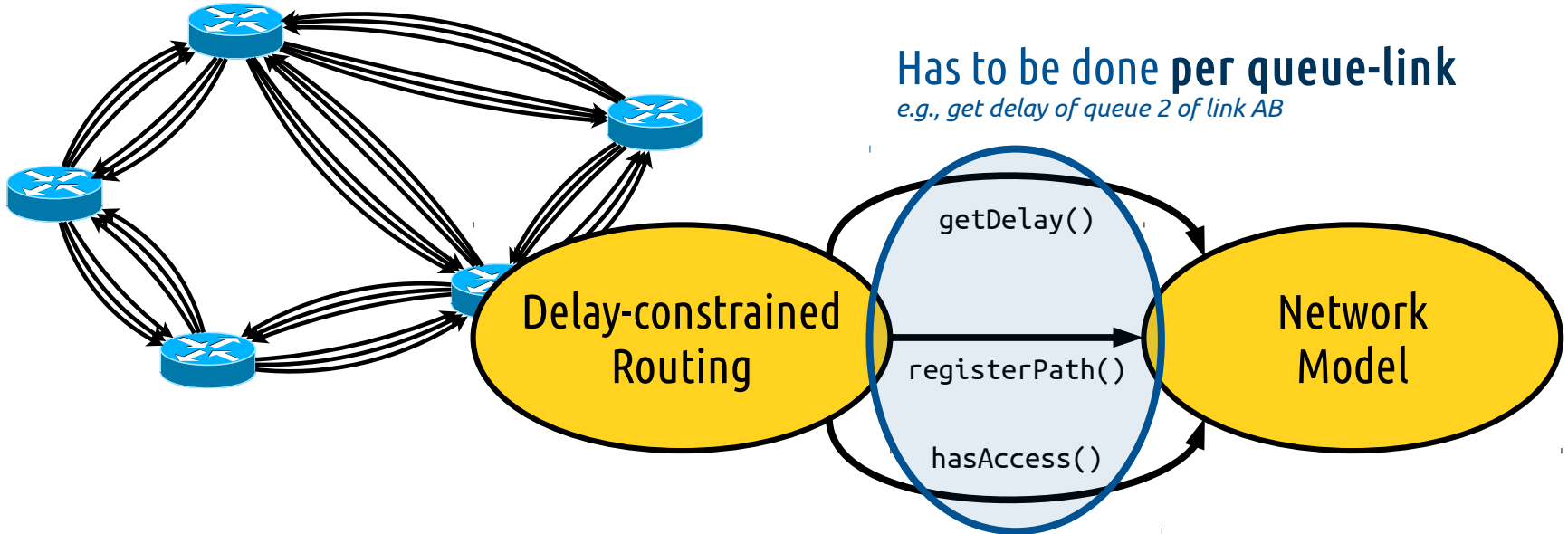
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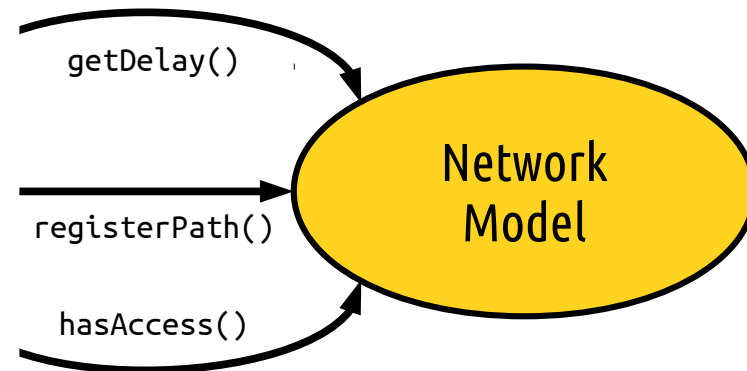
with, e.g., 3 priority queues
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Performing route selection on this topology defines both

Has to be done **per queue-link**

e.g., get delay of queue 2 of link AB





As we need **deterministic** delay guarantees,

deterministic network calculus

is a perfect candidate modeling tool!

assuming priority scheduling
(cheap and ubiquitous)

$R_{u,v}$ capacity of link (u, v)

$p \in [1, Q_{u,v}]$ queue priorities (1 being highest)

(u, v, p) queue with priority p at link (u, v)

$U_R[u, v, p]$ rate of flow through queue (u, v, p)

$U_B[u, v, p]$ burst of flow through queue (u, v, p)

$l_{u,v,p}^{max}$ maximum packet size through queue (u, v, p)

We assume token bucket flows through each queue

The service curve for priority queue (u, v, p) is given by

$$\left(R_{u,v}t - t \sum_{j=1}^{p-1} U_R[u, v, j] - \sum_{j=1}^{p-1} U_B[u, v, j] - \max_{p+1 \leq j \leq Q_{u,v}} \{l_{u,v,j}^{max}\} - l_{u,v,p}^{max} \right)^+$$

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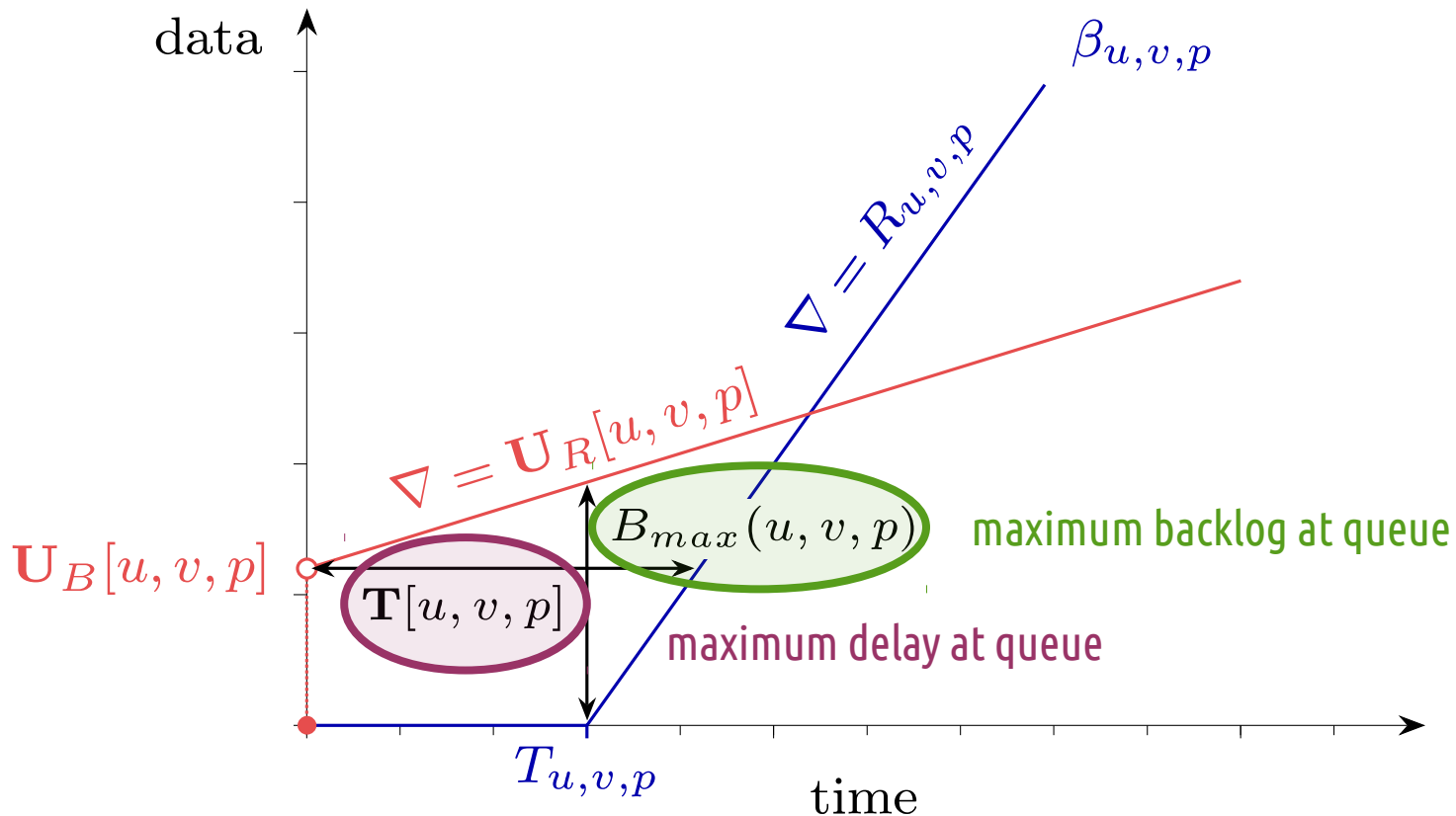
whole link service

service used by higher priority queues

one packet from a lower priority queue per packet delay (non-preemptive scheduling)

The service curve for priority queue (u, v, p) is given by

$$\beta_{u,v,p} = \left(R_{u,v}t - t \sum_{j=1}^{p-1} \mathbf{U}_R[u, v, j] - \sum_{j=1}^{p-1} \mathbf{U}_B[u, v, j] - \max_{p+1 \leq j \leq Q_{u,v}} \{l_{u,v,j}^{max}\} - l_{u,v,p}^{max} \right)^+$$



In order to respect the **QoS requirements** of the flows,

The path P_f of a flow f must be chosen such that it **fulfills the delay requirement** t_f of the flow,

$$\sum_{(u,v,p) \in P_f} \mathbf{T}[u, v, p] \leq t_f$$

and we must ensure that **no buffer overflow** occurs

$$B_{max}(u, v, p) \leq \mathbf{A}_B[u, v, p] \quad \forall (u, v, p)$$


Buffer capacity of a queue

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We have...

$$\mathbf{T}[u, v, p] = \frac{\sum_{j=1}^p \mathbf{U}_B[u, v, j] + \max_{p+1 \leq j \leq Q_{u,v}} \{l_{u,v,j}^{max}\} + l_{u,v,p}^{max}}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{U}_R[u, v, j]}$$

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Buffer capacity of a queue

We have...

Dependence on other flows embedded at the same link

$$\mathbf{T}[u, v, p] = \frac{\sum_{j=1}^p \mathbf{U}_B[u, v, j] + \max_{p+1 \leq j \leq Q_{u,v}} \{l_{u,v,j}^{max}\} + l_{u,v,p}^{max}}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{U}_R[u, v, j]}$$

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$$B_{max}(u, v, p) \leq \mathbf{A}_B[u, v, p] \quad \forall (u, v, p)$$

Should we re-check all the previously embedded flows?

No, it does not scale!

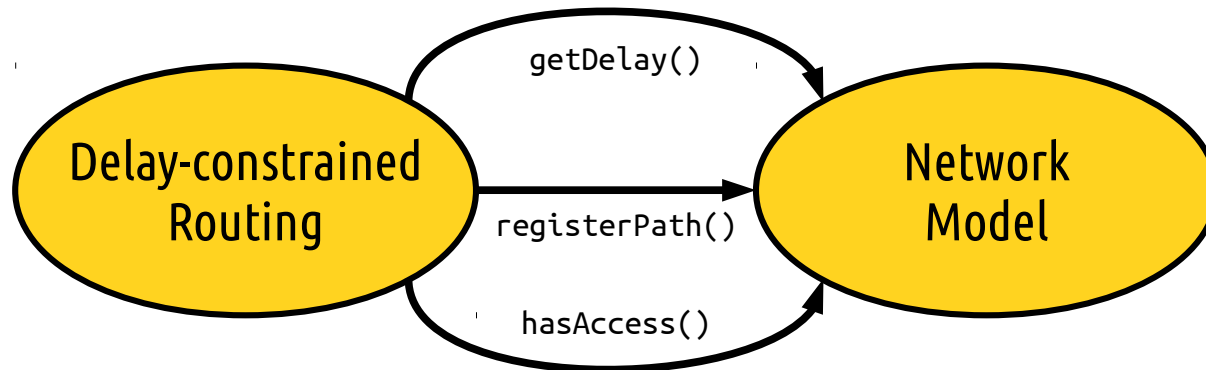
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→ Define **upper bounds** which are **independent of the state of the network!**



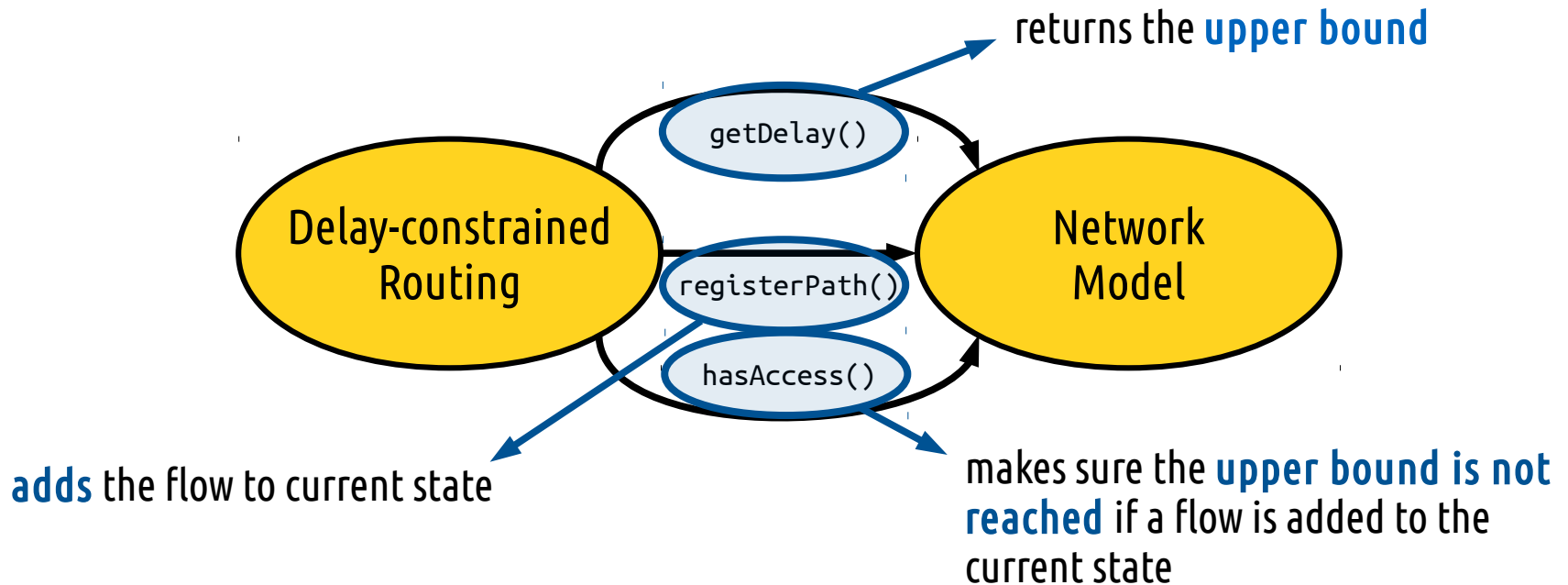
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Let's find an upper bound **independent of the network state**...

$$\mathbf{T}[u, v, p] = \frac{\sum_{j=1}^p \mathbf{U}_B[u, v, j] + \max_{p+1 \leq j \leq Q_{u,v}} \{l_{u,v,j}^{max}\} + l_{u,v,p}^{max}}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{U}_R[u, v, j]}$$

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Let's find an upper bound **independent of the network state**...

Packets cannot be bigger than the biggest Ethernet frame size

$$\mathbf{T}[u, v, p] = \frac{\sum_{j=1}^p \mathbf{U}_B[u, v, j] + 1542 + 1542}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{U}_R[u, v, j]}$$

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Let's find an upper bound **independent of the network state**...

$\mathbf{A}_R[u, v, p]$ defined as the maximum rate that can be accepted at a queue

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Limit bursts such that no buffer overflow occurs

$$\mathbf{T}[u, v, p] = \frac{\sum_{j=1}^p \mathbf{U}_B[u, v, j] + 1542 + 1542}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{A}_R[u, v, p]}$$

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Let's find an upper bound **independent of the network state**...

Limit bursts such that no buffer overflow occurs

$$\mathbf{T}[u, v, p] = \frac{\sum_{j=1}^p \mathbf{M}_B[u, v, p] + 1542 + 1542}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{A}_R[u, v, p]}$$

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The maximum bursts $\mathbf{M}_B[u, v, p]$ can be computed recursively

$$\mathbf{M}_B[u, v, 1] + \mathbf{A}_R[u, v, 1] \frac{3084}{R_{u,v}} = \mathbf{A}_B[u, v, 1]$$

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$$\mathbf{M}_B[u, v, 2] + \mathbf{A}_R[u, v, 2] \frac{\mathbf{M}_B[u, v, 1] + 3084}{R_{u,v} - \mathbf{A}_R[u, v, 1]} = \mathbf{A}_B[u, v, 1]$$

etc.

We have the following expression, independent of the state of the network,

$$\mathbf{T}[u, v, p] \leq \frac{\sum_{j=1}^p \mathbf{M}_B[u, v, j] + 3084}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{A}_R[u, v, j]} \triangleq \mathbf{T}^{MHM}[u, v, p]$$

computed recursively

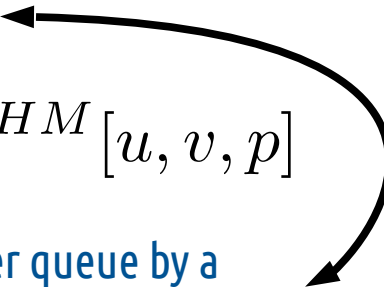
defined per queue by a resource allocation algorithm

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computed recursively defined per queue by a
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The opposite can actually also be done...



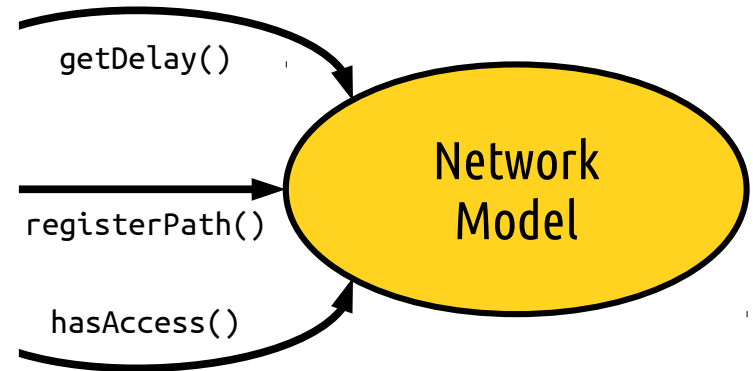
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The Multi-Hop Model (MHM)

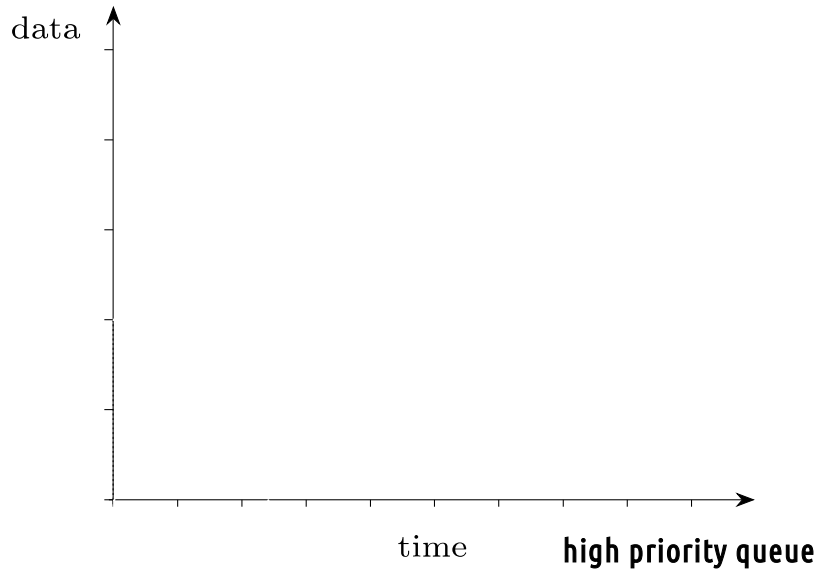
return $\mathbf{T}^{MHM}[u, v, p]$

update $\mathbf{U}_R[u, v, p], \mathbf{U}_B[u, v, p]$

check $\mathbf{M}_B[u, v, p], \mathbf{A}_R[u, v, p]$ are not exceeded



Let's see how this looks like graphically... at a link with 3 priority queues

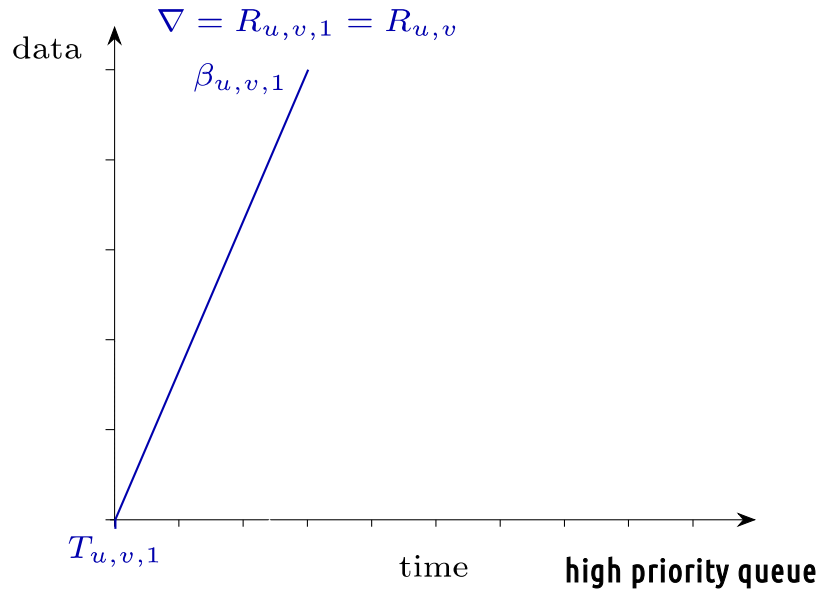


$$\mathbf{M}_B[u, v, p] + \mathbf{A}_R[u, v, p] \frac{\sum_{j=1}^{p-1} \mathbf{M}_B[u, v, j] + 3084}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{A}_R[u, v, j]} = \mathbf{A}_B[u, v, p]$$

$$\beta_{u,v,p} = \left(R_{u,v}t - t \sum_{j=1}^{p-1} \mathbf{A}_R[u, v, j] - \sum_{j=1}^{p-1} \mathbf{M}_B[u, v, j] - 3084 \right)^+$$

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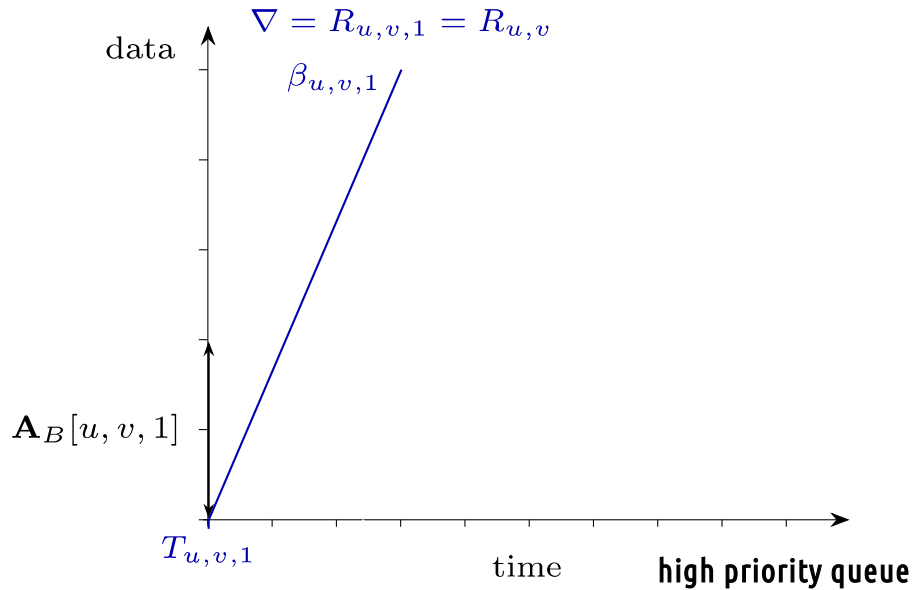


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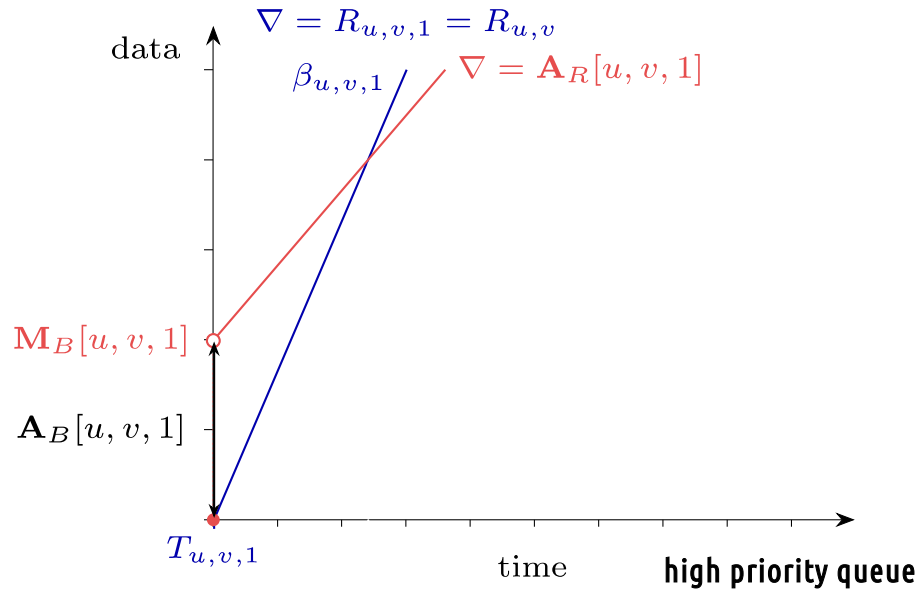


$$\mathbf{M}_B[u, v, p] + \mathbf{A}_R[u, v, p] \frac{\sum_{j=1}^{p-1} \mathbf{M}_B[u, v, j] + 3084}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{A}_R[u, v, j]} = \mathbf{A}_B[u, v, p]$$

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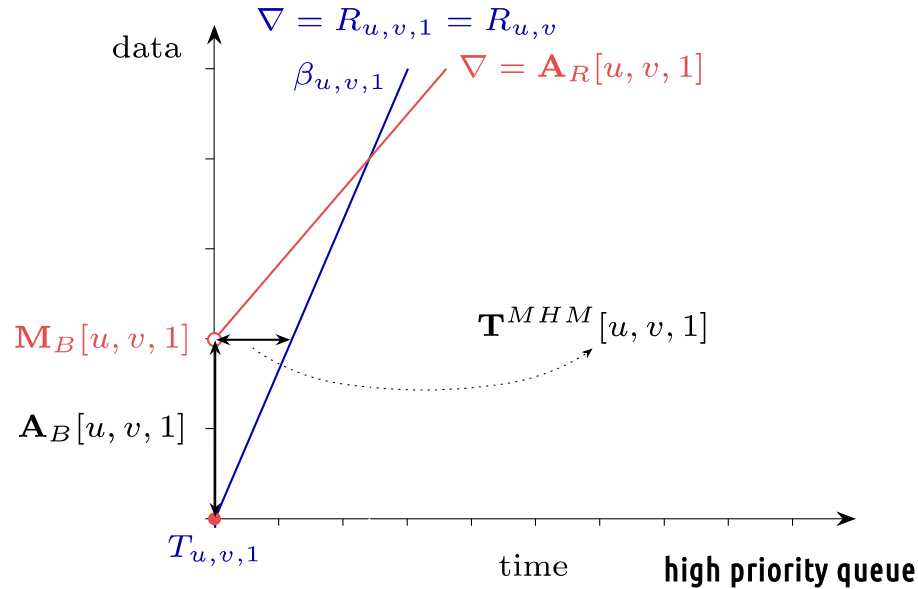


$$\mathbf{M}_B[u, v, p] + \mathbf{A}_R[u, v, p] \frac{\sum_{j=1}^{p-1} \mathbf{M}_B[u, v, j] + 3084}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{A}_R[u, v, j]} = \mathbf{A}_B[u, v, p]$$

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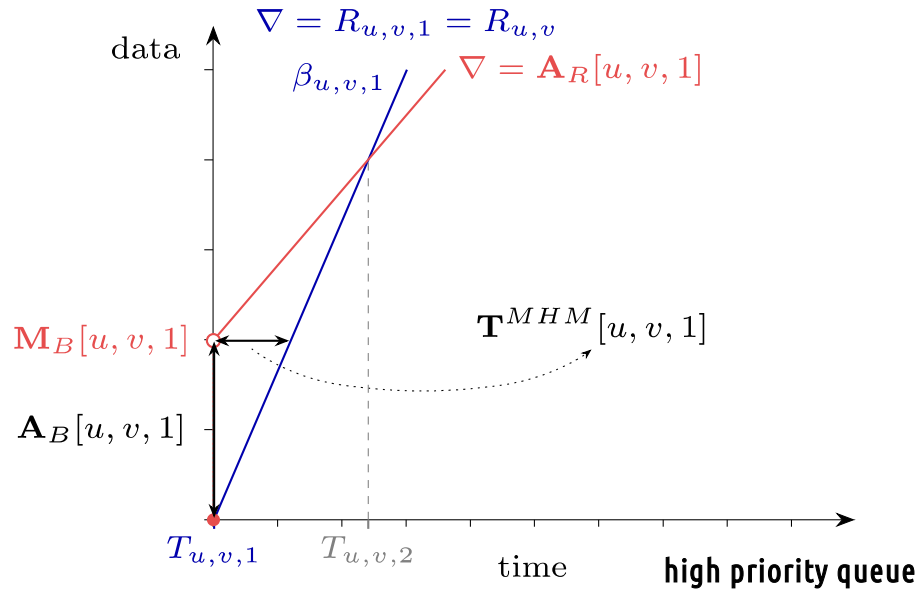


$$\mathbf{M}_B[u, v, p] + \mathbf{A}_R[u, v, p] \frac{\sum_{j=1}^{p-1} \mathbf{M}_B[u, v, j] + 3084}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{A}_R[u, v, j]} = \mathbf{A}_B[u, v, p]$$

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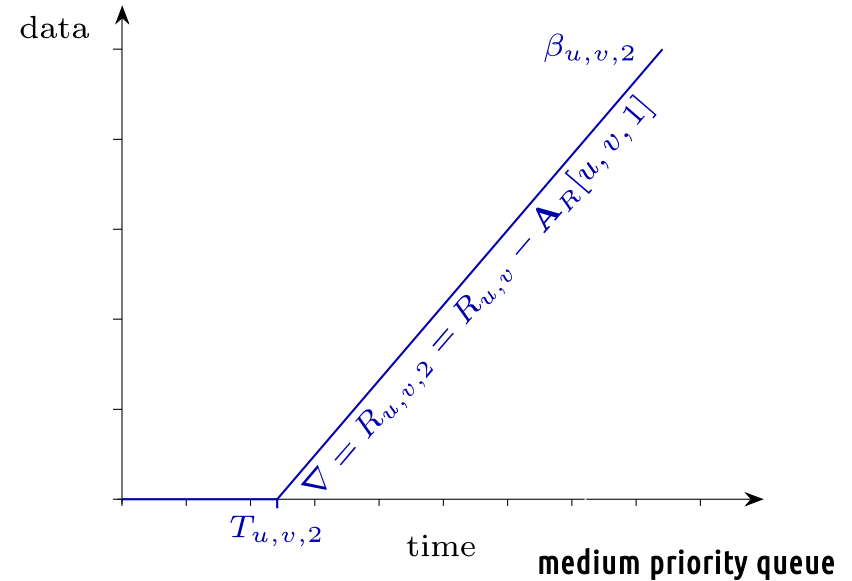
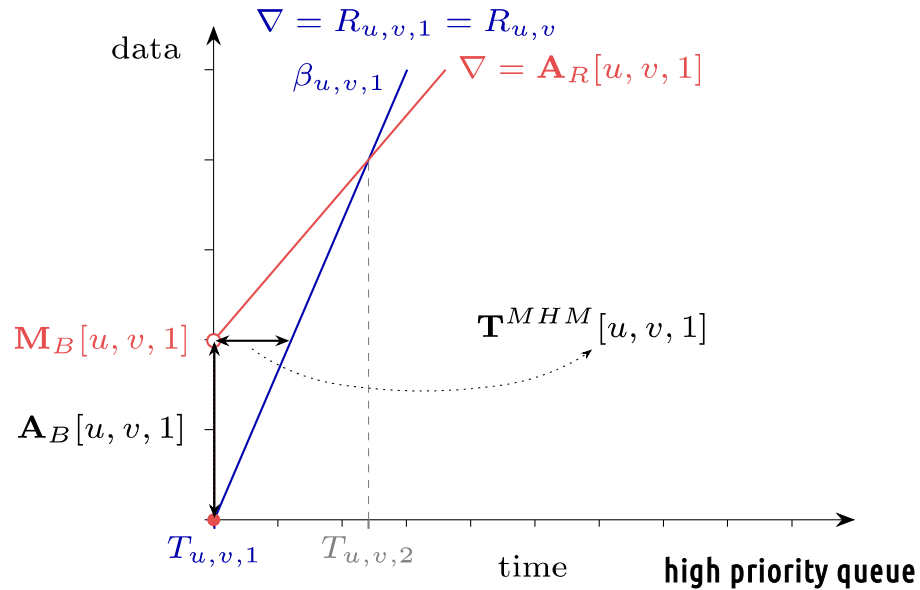


$$\mathbf{M}_B[u, v, p] + \mathbf{A}_R[u, v, p] \frac{\sum_{j=1}^{p-1} \mathbf{M}_B[u, v, j] + 3084}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{A}_R[u, v, j]} = \mathbf{A}_B[u, v, p]$$

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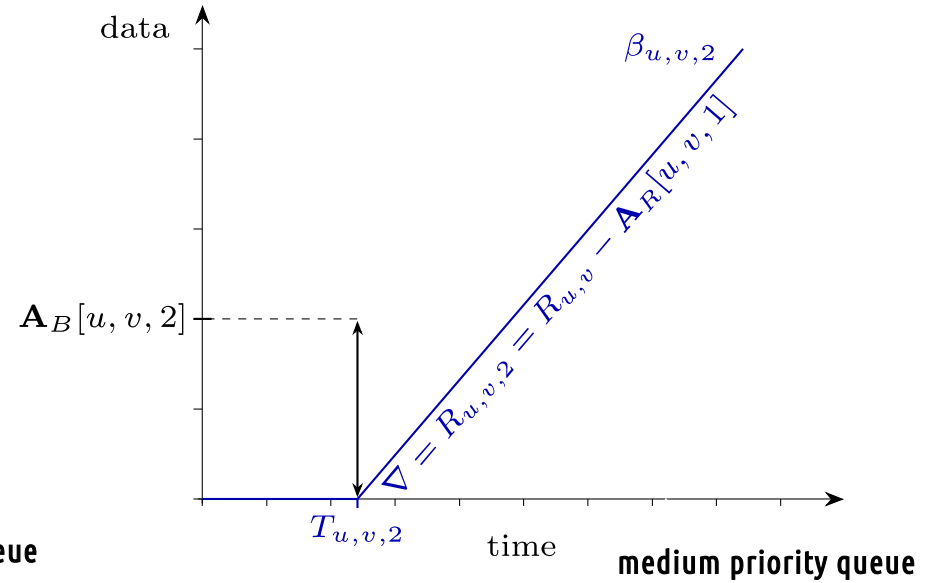
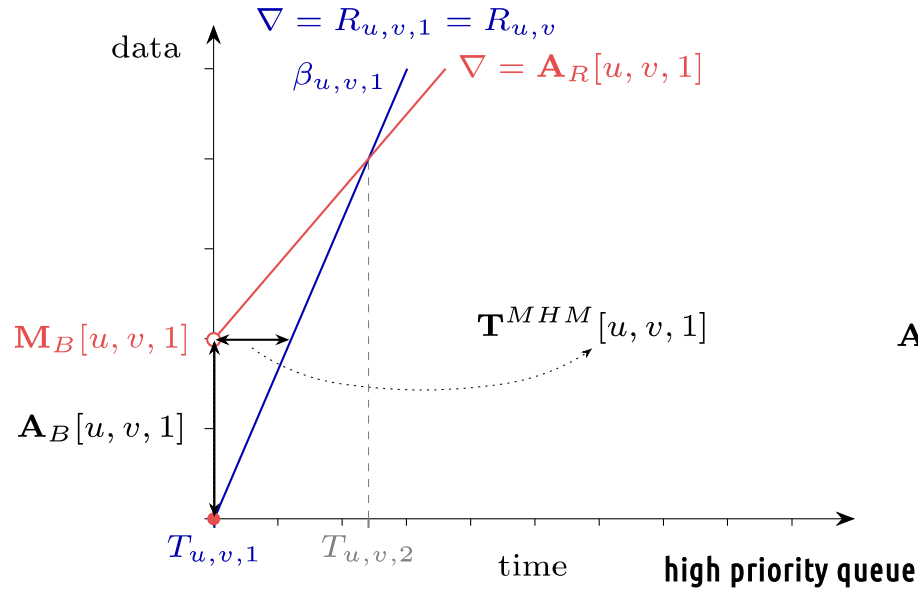


$$\mathbf{M}_B[u, v, p] + \mathbf{A}_R[u, v, p] \frac{\sum_{j=1}^{p-1} \mathbf{M}_B[u, v, j] + 3084}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{A}_R[u, v, j]} = \mathbf{A}_B[u, v, p]$$

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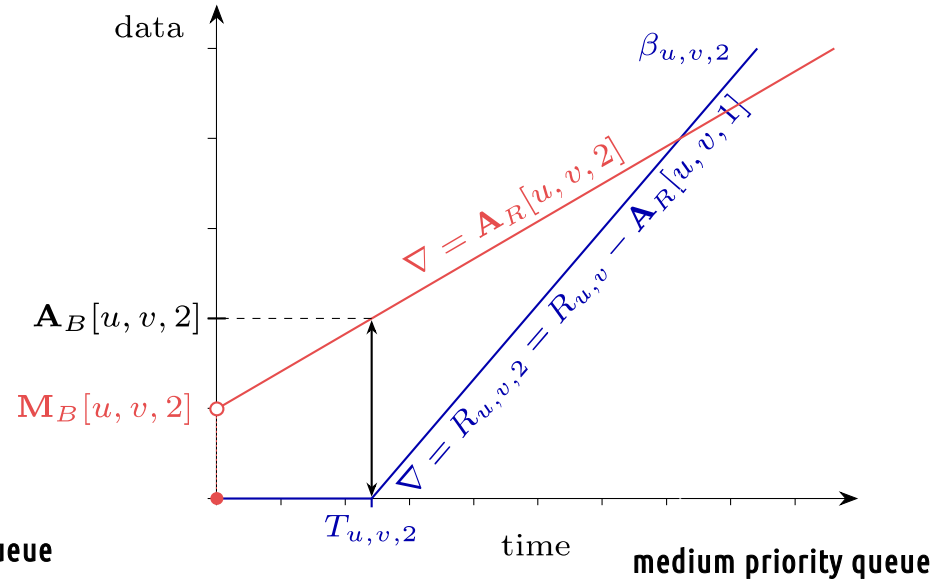
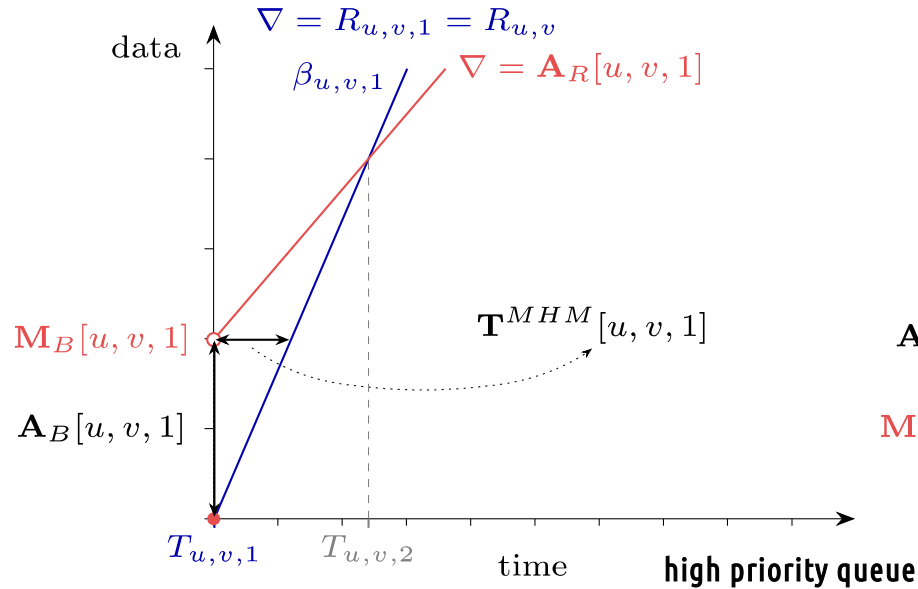


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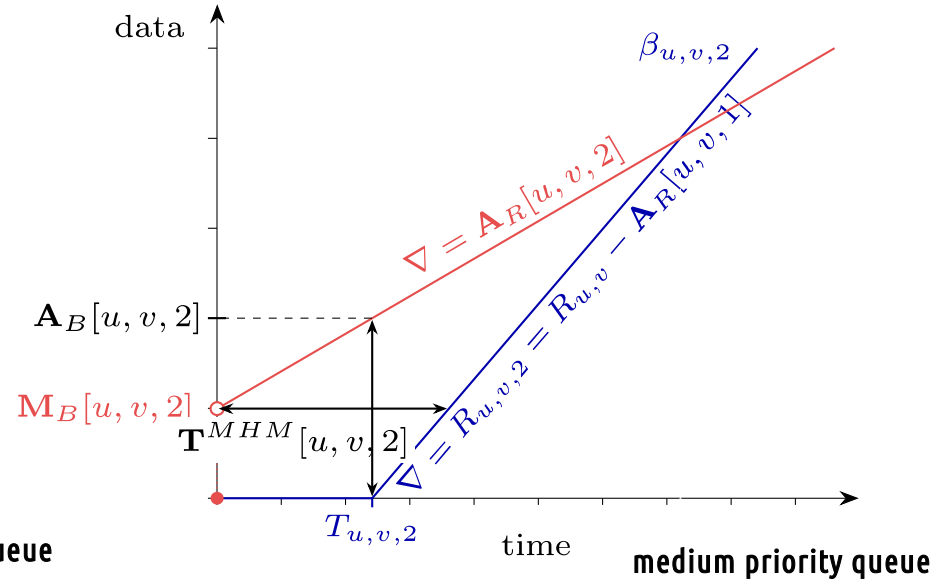
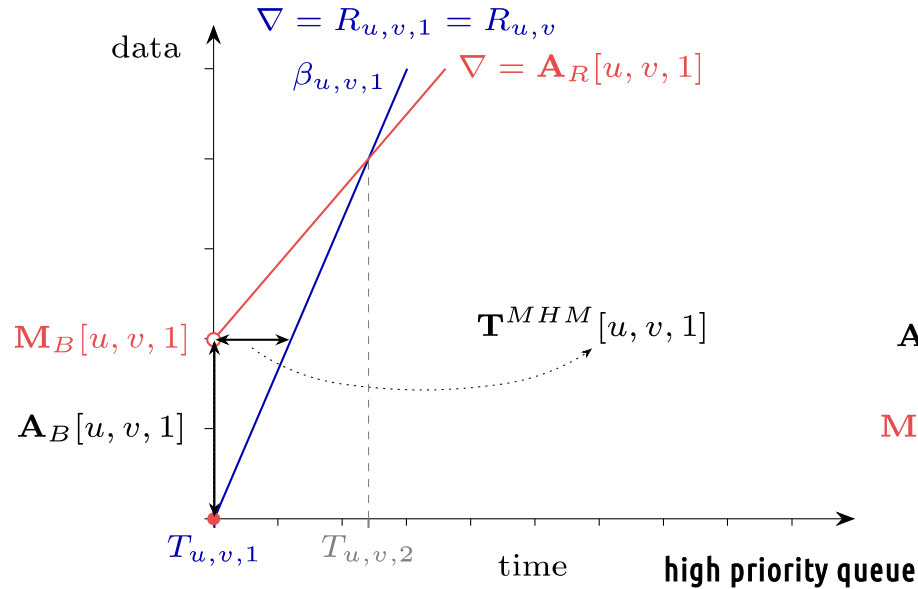


$$\mathbf{M}_B[u, v, p] + \mathbf{A}_R[u, v, p] \frac{\sum_{j=1}^{p-1} \mathbf{M}_B[u, v, j] + 3084}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{A}_R[u, v, j]} = \mathbf{A}_B[u, v, p]$$

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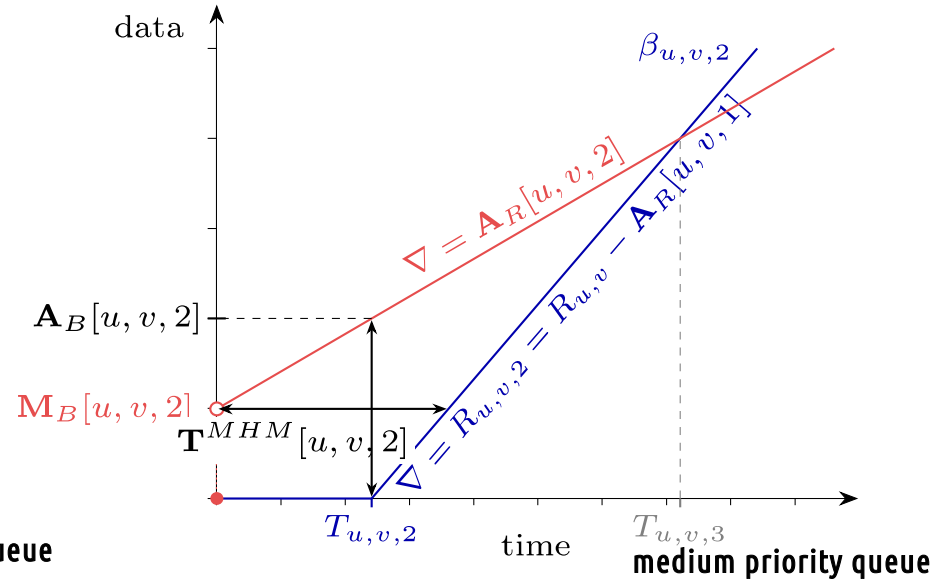
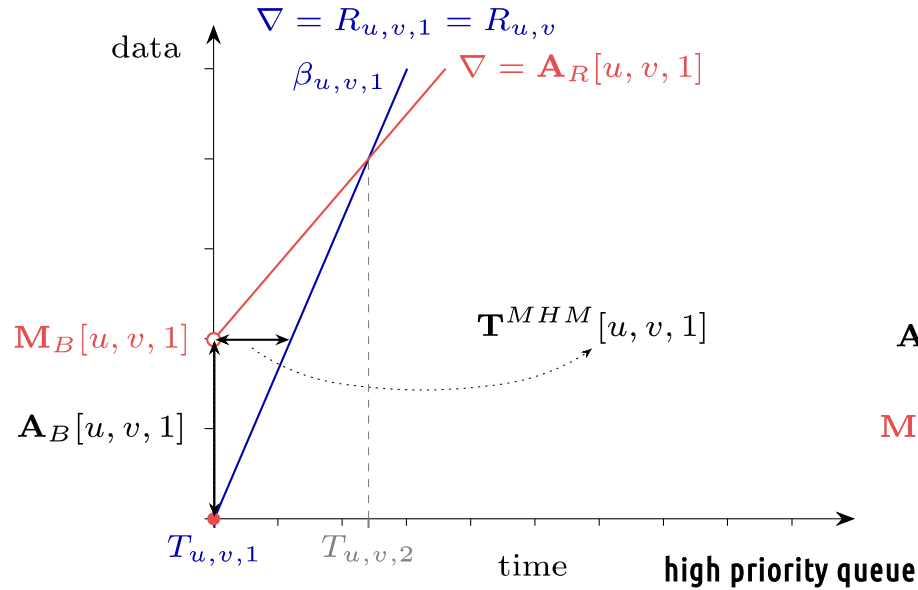


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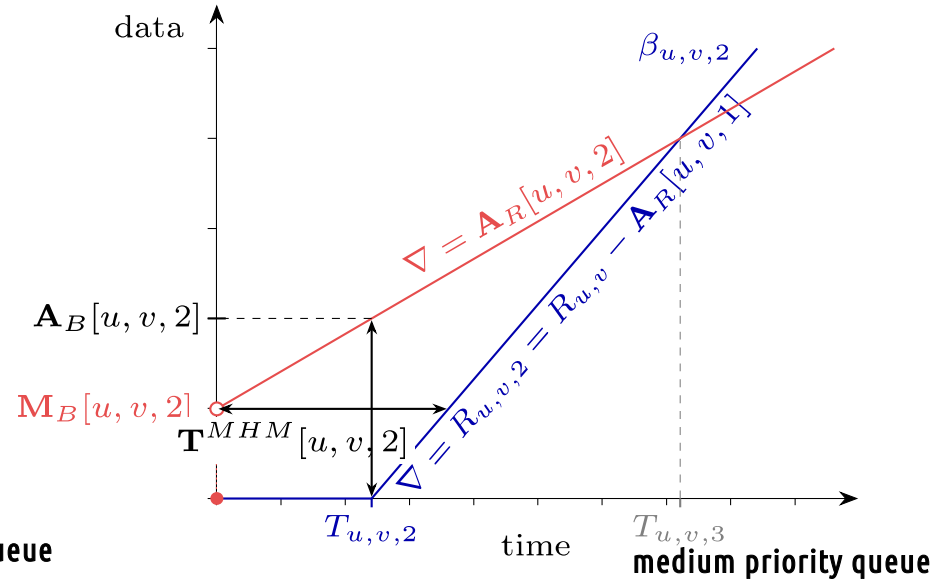
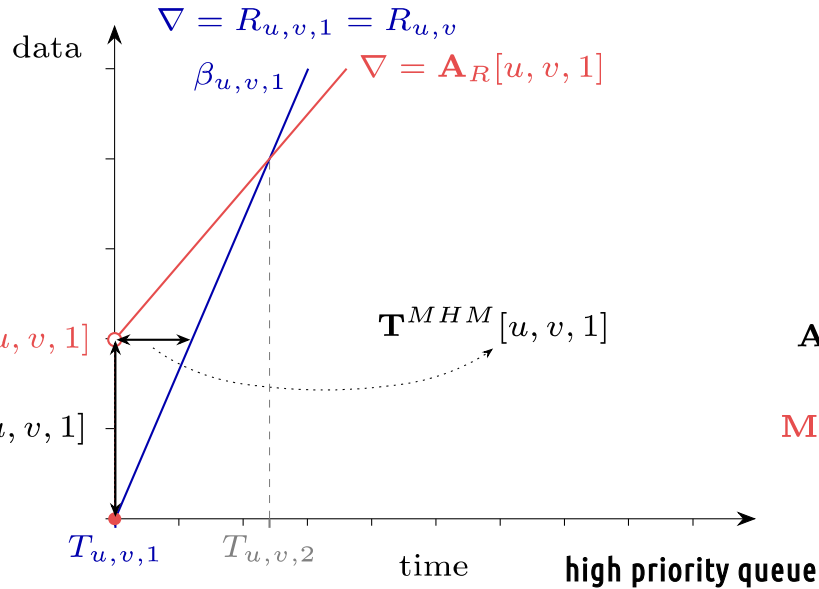


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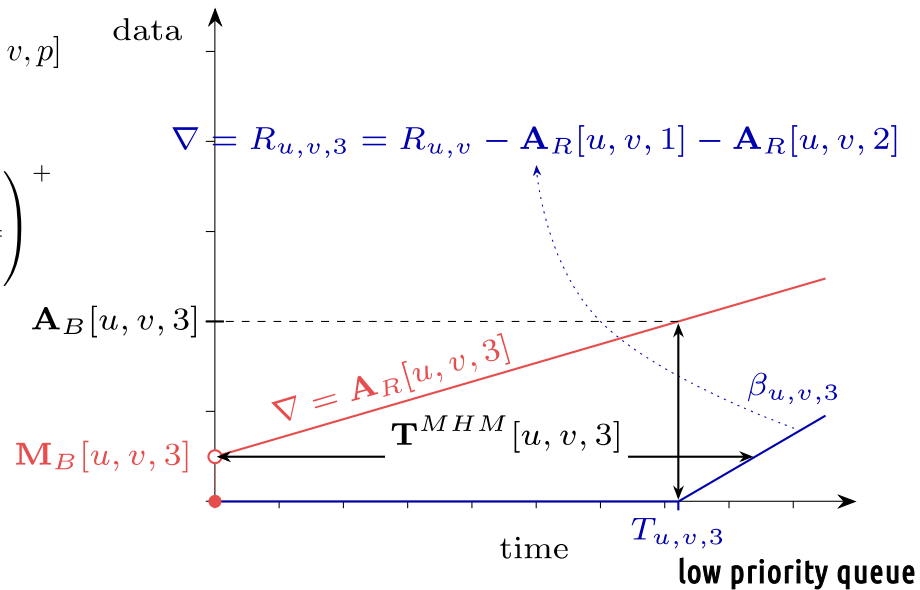
Let's see how this looks like graphically... at a link with 3 priority queues



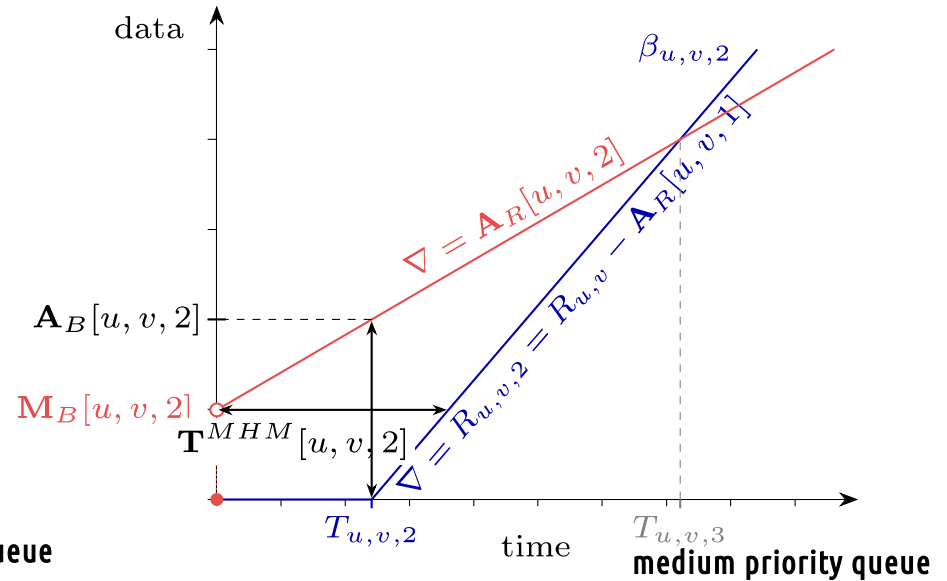
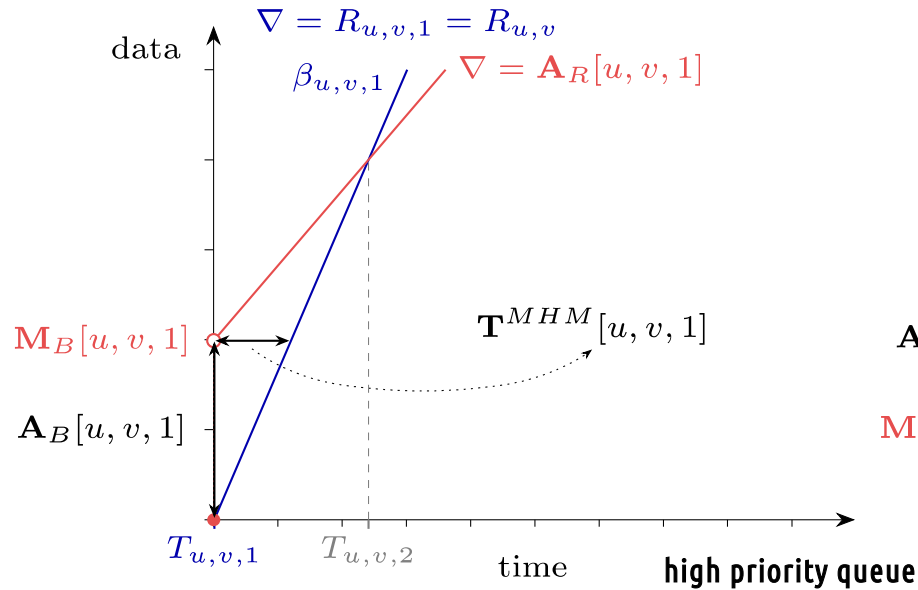
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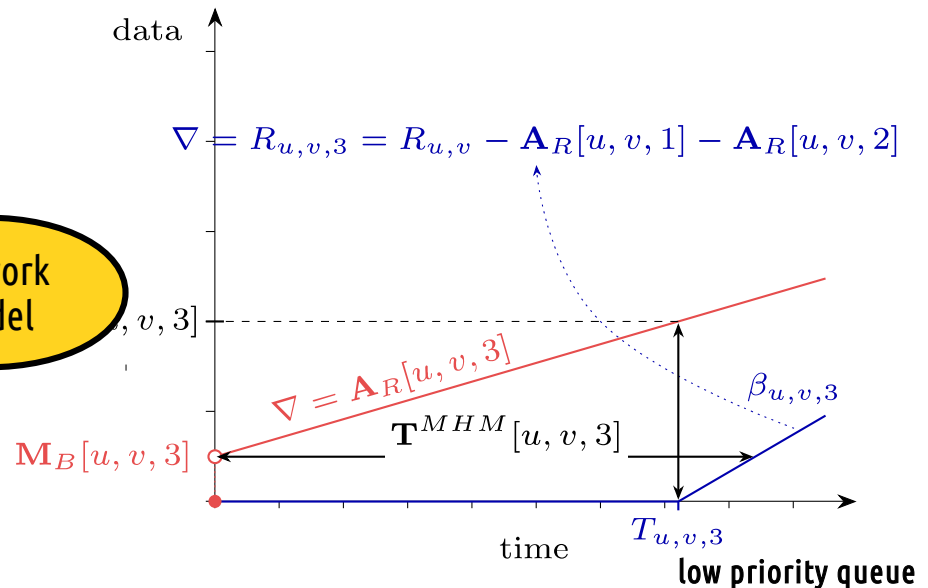
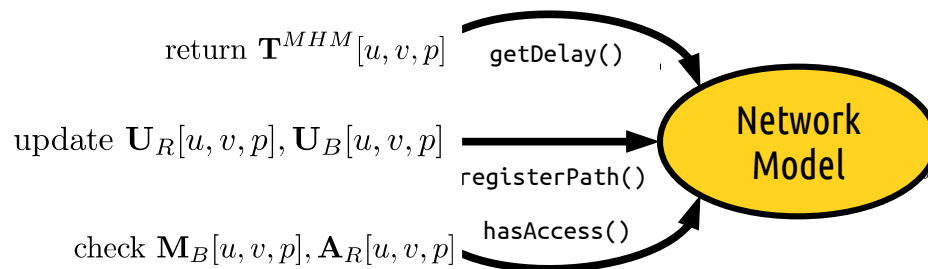
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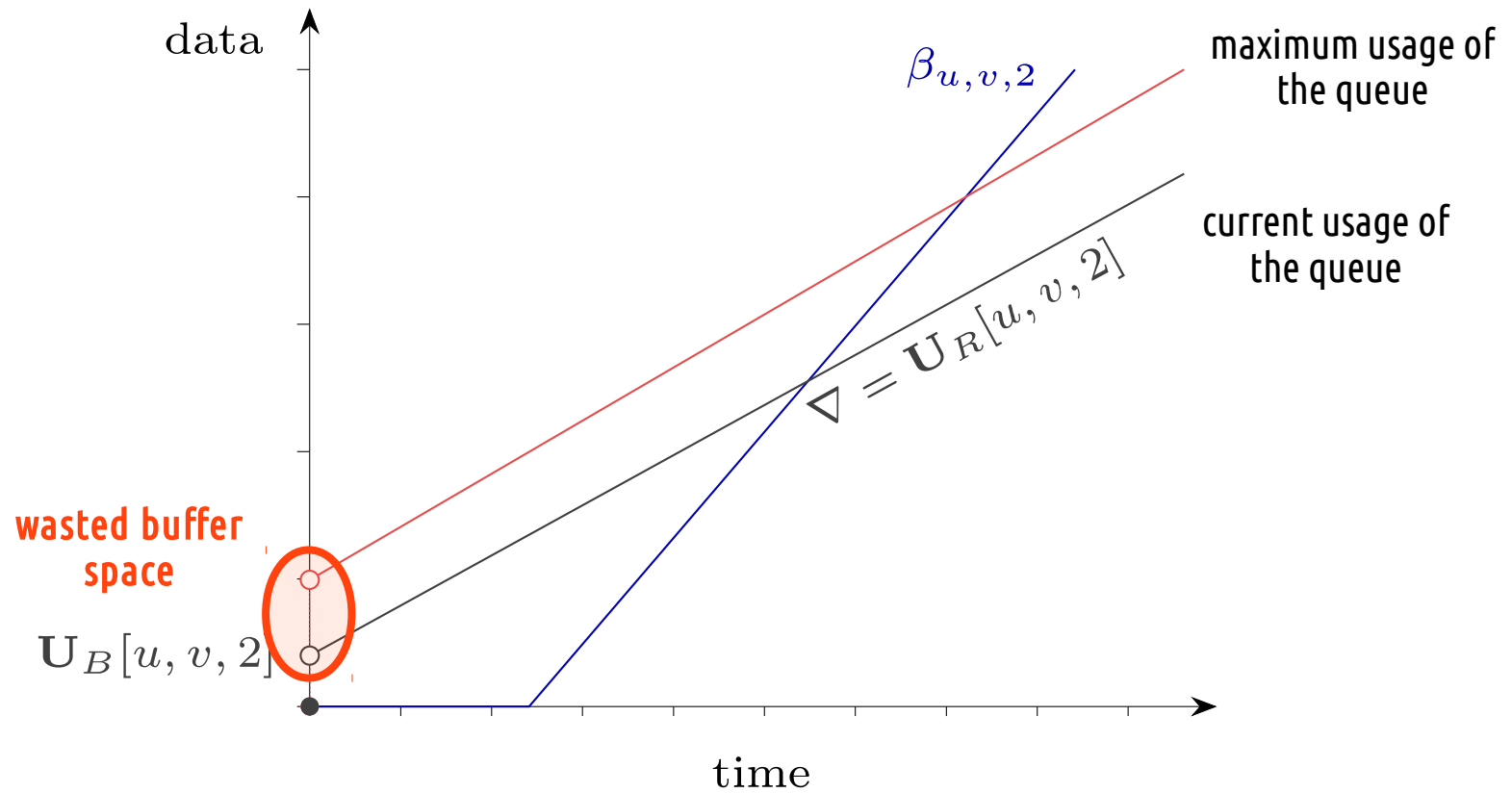


Let's see how this looks like graphically... at a link with 3 priority queues



The Multi-Hop Model (MHM)

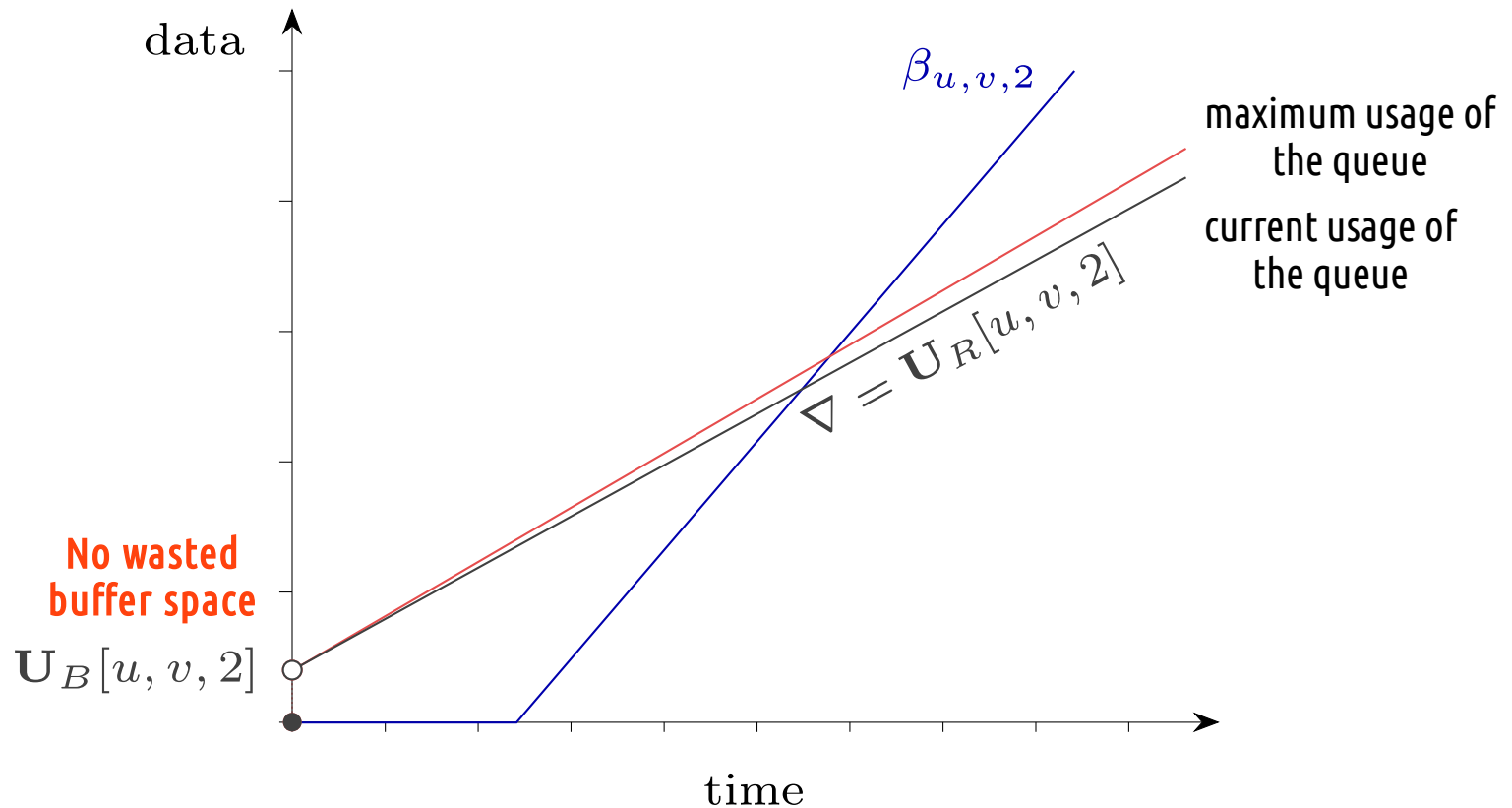




In such a situation, the MHM leads to a **waste of resources**
 The buffer budget will **never be used!**

because the rate blocks acceptance of other flows

A solution is to **artificially reduce the buffer budget!**



This also reduces the delay of the queue,
And hence the lower priority queues can have

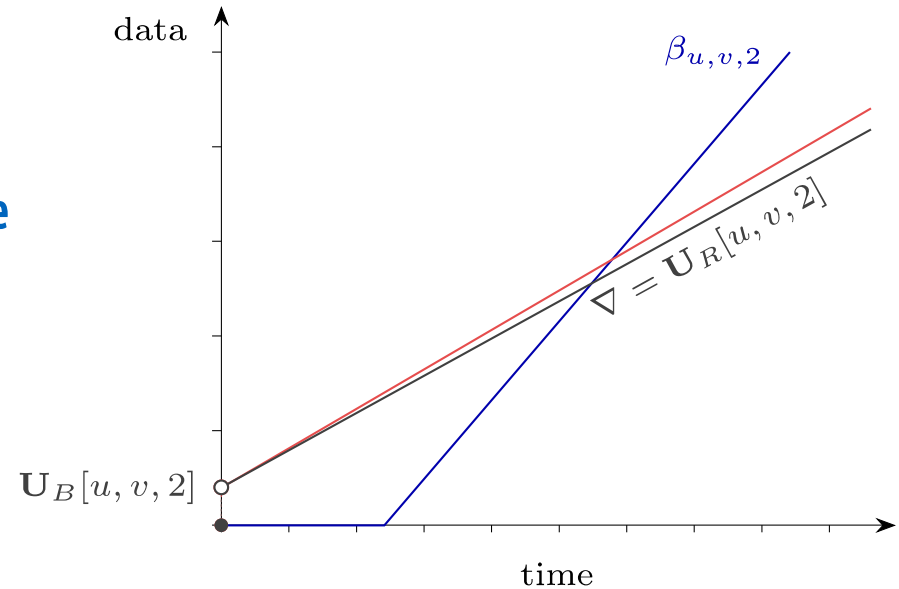
- a **lower delay**, or
- a **higher burst** budget, or
- a **higher data rate** budget

**delay/burst/data rate
budget trade-off**

The resource allocation hence has to **allocate**

- # $\mathbf{A}_R[u, v, p]$: a data rate
- # $\mathbf{M}_B[u, v, p]$: a buffer capacity

to each queue in the network.



The resource allocation algorithm is responsible for **adjusting a priori**, the **trade-off between resources**

The quality of this choice **depends on the type of flows**

→ bursty traffic? rate demanding traffic? low delay?

**delay/burst/data rate
budget trade-off**

Can we do this differently?

We have to find an upper bound **independent of the network state**...

$$\mathbf{T}[u, v, p] = \frac{\sum_{j=1}^p \mathbf{U}_B[u, v, j] + \max_{p+1 \leq j \leq Q_{u,v}} \{l_{u,v,j}^{max}\} + l_{u,v,p}^{max}}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{U}_R[u, v, j]}$$

The MHM does this by bounding $\mathbf{A}_R[u, v, p]$, $\mathbf{M}_B[u, v, p]$ and $l_{u,v,p}^{max}$

The resource allocation algorithm can rather bound the delay itself

$$\mathbf{T}[u, v, p] = \frac{\sum_{j=1}^p \mathbf{U}_B[u, v, j] + \max_{p+1 \leq j \leq Q_{u,v}} \{l_{u,v,j}^{max}\} + l_{u,v,p}^{max}}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{U}_R[u, v, j]} \leq \mathbf{T}^{TBM}[u, v, p]$$

and let everything vary as long as

$$\mathbf{T}[u, v, p] \leq \mathbf{T}^{TBM}[u, v, p] \quad \forall (u, v, p)$$

$$B_{max}(u, v, p) \leq \mathbf{A}_B[u, v, p] \quad \forall (u, v, p)$$

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$$\mathbf{T}[u, v, p] = \frac{\sum_{j=1}^p \mathbf{U}_B[u, v, j] + \max_{p+1 \leq j \leq Q_{u,v}} \{l_{u,v,j}^{max}\} + l_{u,v,p}^{max}}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{U}_R[u, v, j]} \leq \mathbf{T}^{TBM}[u, v, p]$$

set by the resource allocation algorithm

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$$B_{max}(u, v, p) = \mathbf{U}_B[u, v, p] + \mathbf{U}_R[u, v, p] \frac{\sum_{j=1}^{p-1} \mathbf{U}_B[u, v, j] + \max_{p+1 \leq j \leq Q_{u,v}} \{l_{u,v,j}^{max}\} + l_{u,v,p}^{max}}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{U}_R[u, v, j]}$$

$$\leq \mathbf{A}_B[u, v, p] \rightarrow \text{buffer capacity}$$

The resource allocation algorithm can rather bound the delay itself

$$\mathbf{T}[u, v, p] = \frac{\sum_{j=1}^p \mathbf{U}_B[u, v, j] + \max_{p+1 \leq j \leq Q_{u,v}} \{l_{u,v,j}^{max}\} + l_{u,v,p}^{max}}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{U}_R[u, v, j]} \leq \mathbf{T}^{TBM}[u, v, p]$$

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$$\leq \mathbf{A}_B[u, v, p] \rightarrow \text{buffer capacity}$$

Requires to check **lower priority queues** and **higher priority queues** before the addition of a new flow

The resource allocation algorithm can rather bound the delay itself

$$\mathbf{T}[u, v, p] = \frac{\sum_{j=1}^p \mathbf{U}_B[u, v, j] + 1542 + l_{u,v,p}^{max}}{R_{u,v} - \sum_{j=1}^{p-1} \mathbf{U}_R[u, v, j]} \leq \mathbf{T}^{TBM}[u, v, p]$$

set by the resource allocation algorithm

and let everything vary as long as

$$\mathbf{T}[u, v, p] \leq \mathbf{T}^{TBM}[u, v, p] \quad \forall (u, v, p)$$

$$B_{max}(u, v, p) \leq \mathbf{A}_B[u, v, p] \quad \forall (u, v, p)$$

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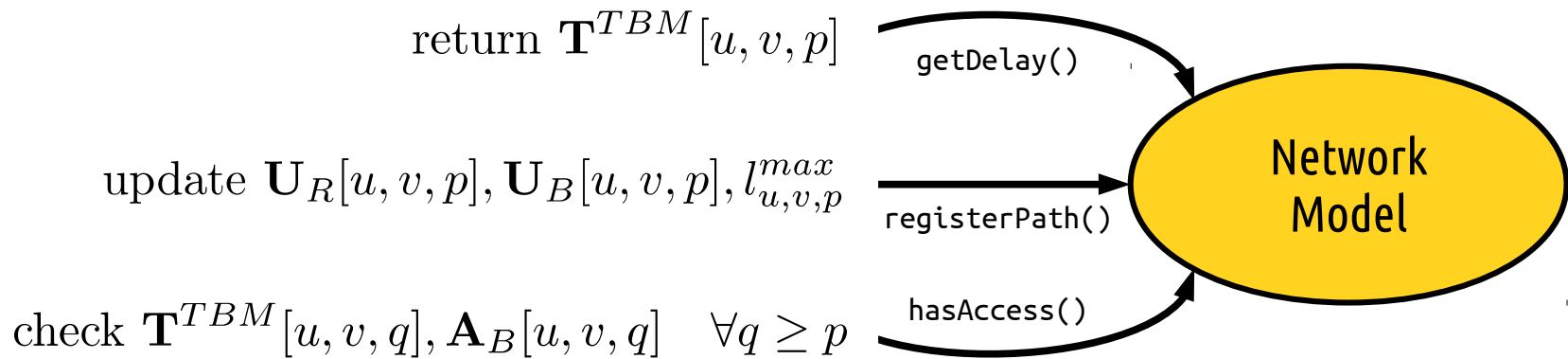
$\leq \mathbf{A}_B[u, v, p]$ buffer capacity

Requires to check **lower priority queues** and ~~higher priority queues~~

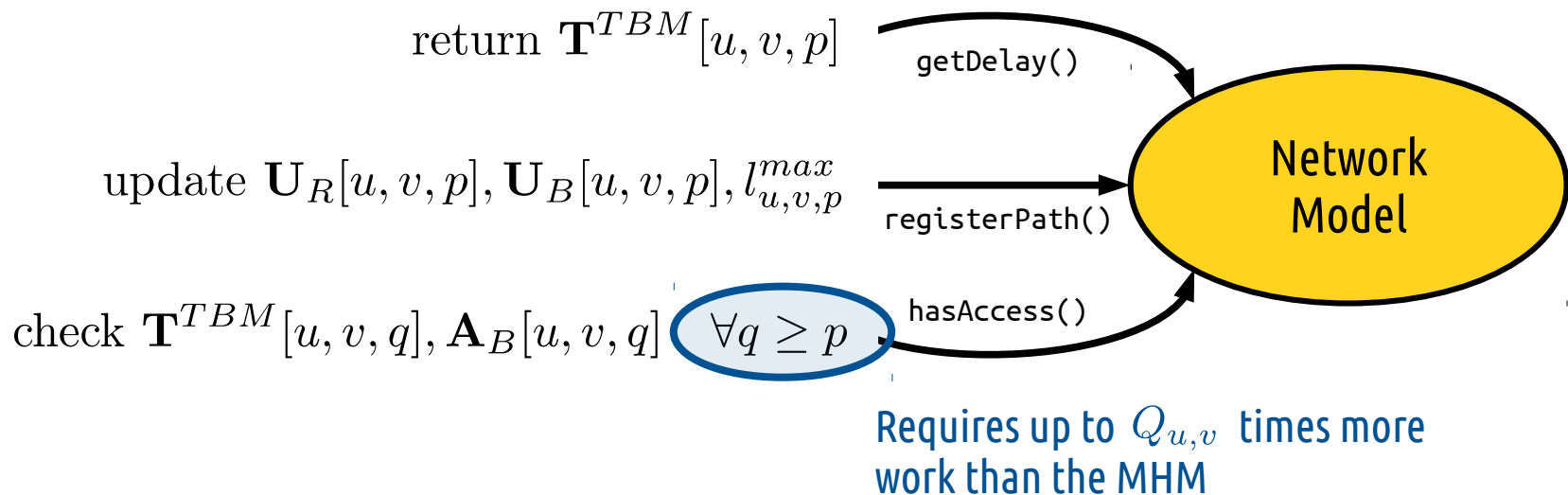
before the addition of a new flow

because there might be **unknown** best-effort traffic in the lowest priority queue

The Threshold-based Model (TBM)

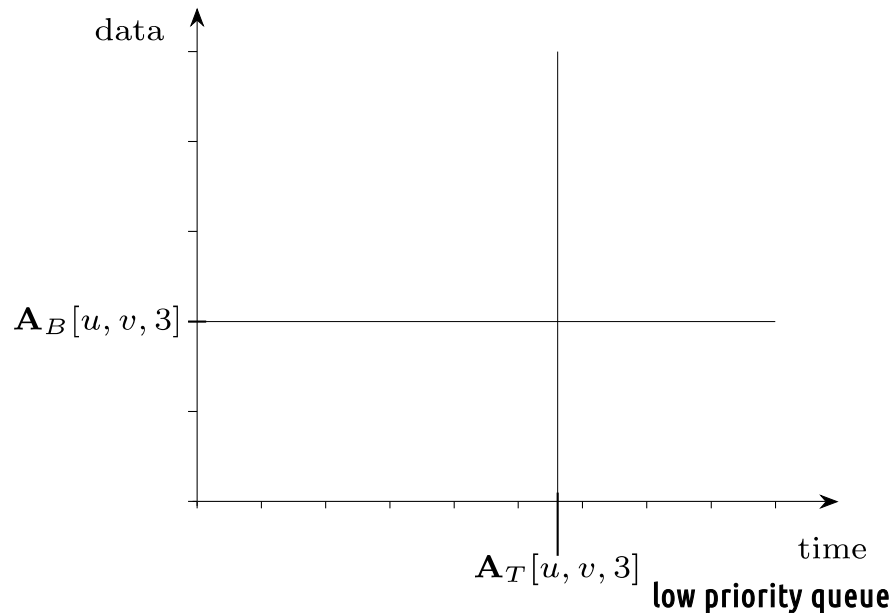
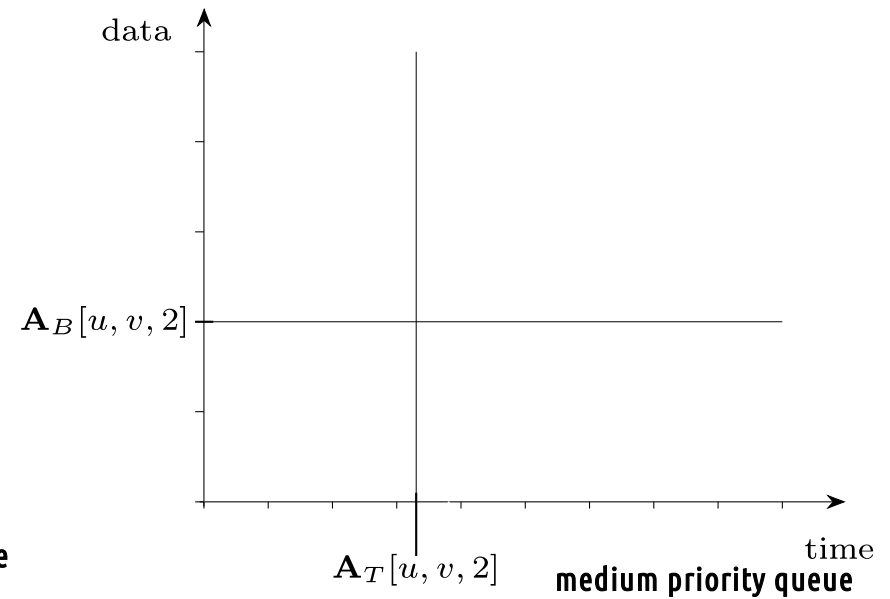
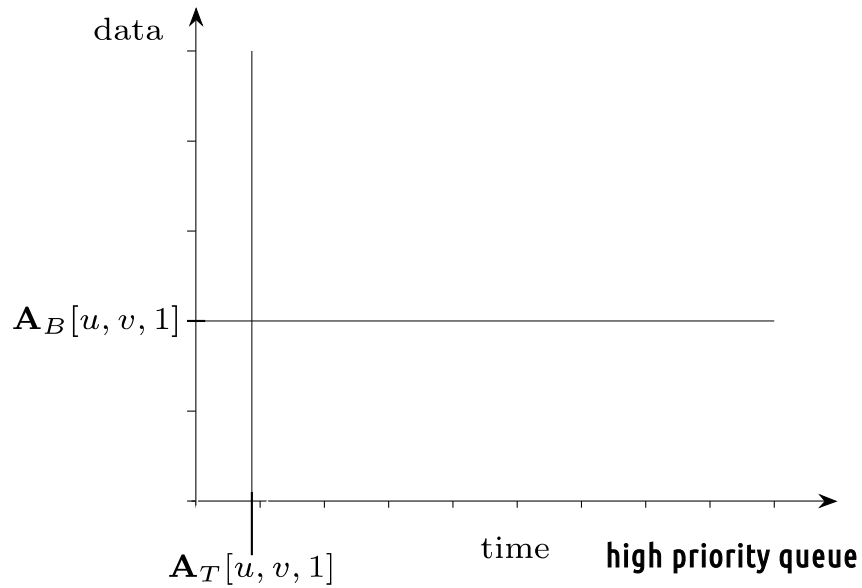


The Threshold-based Model (TBM)

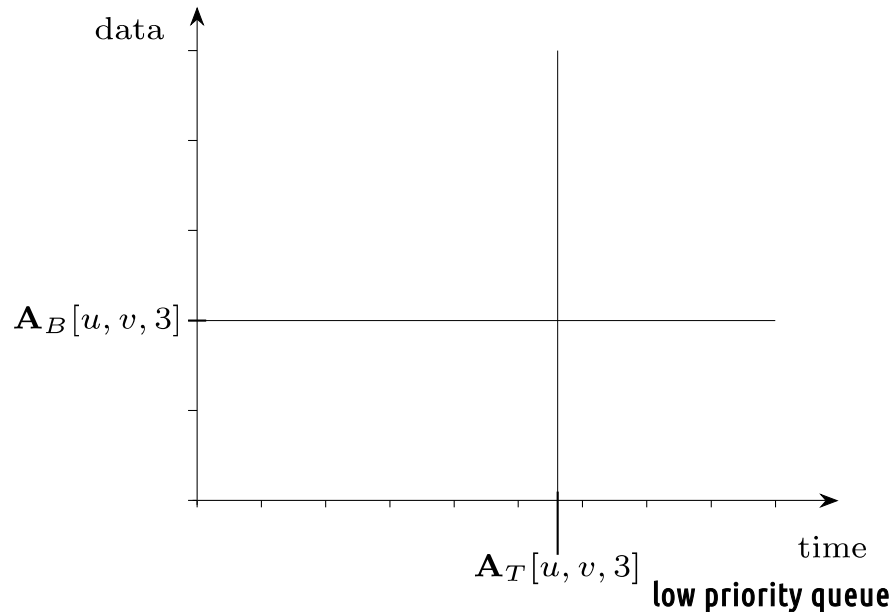
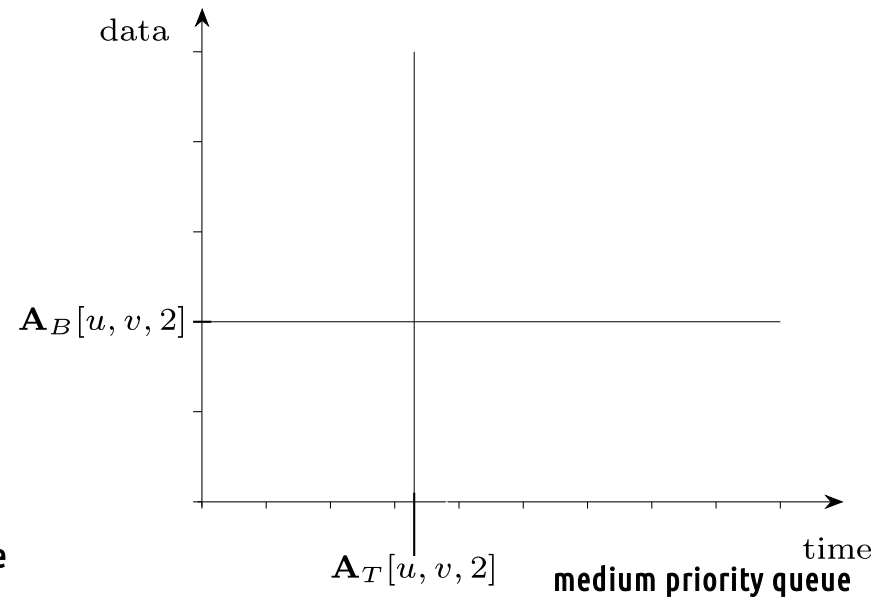
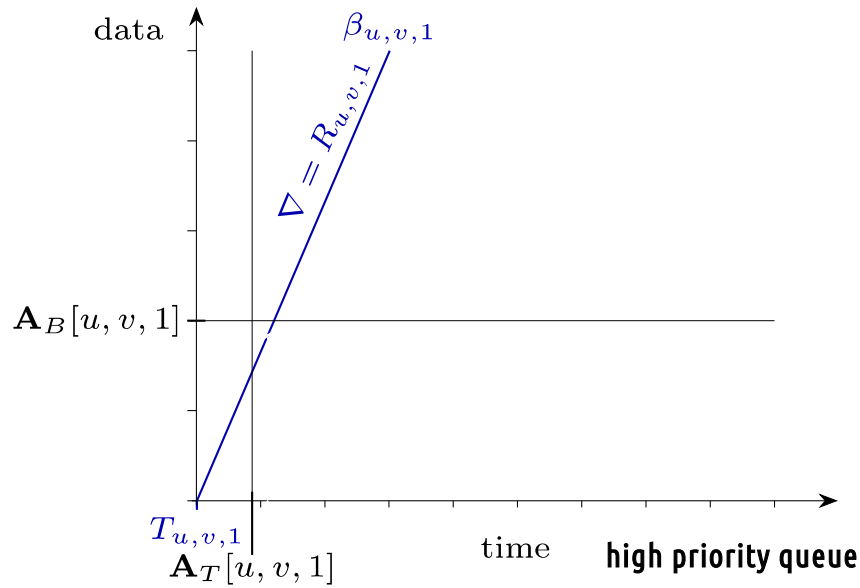


But no a priori choice on the burst/rate/delay trade-off

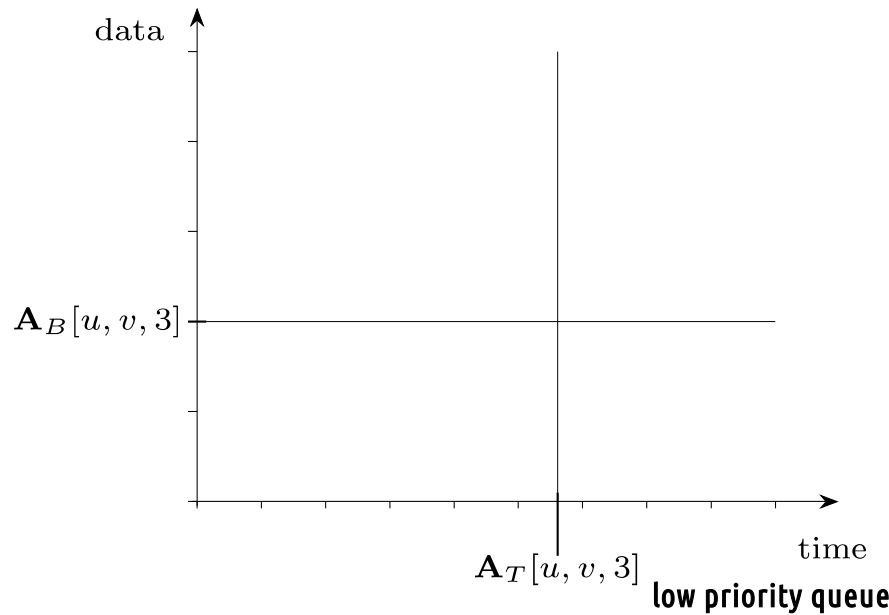
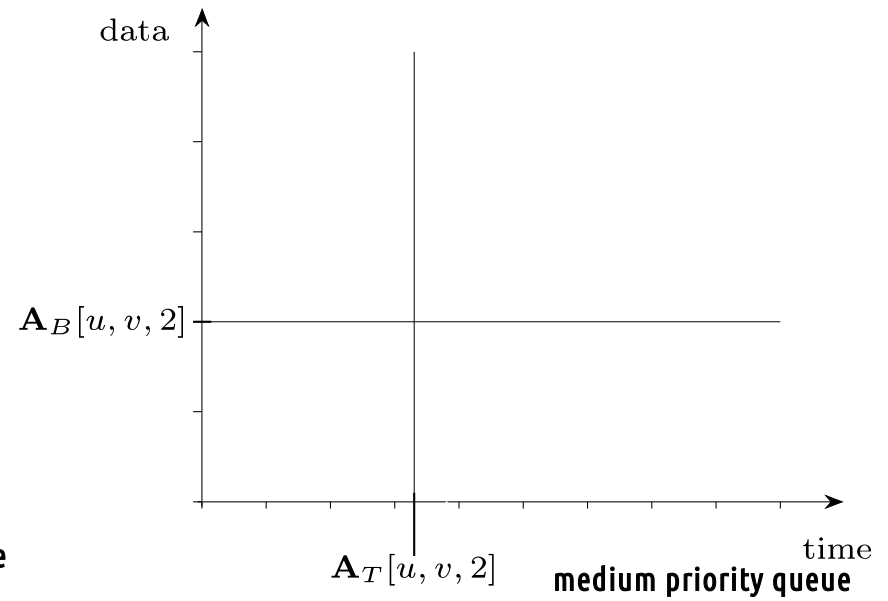
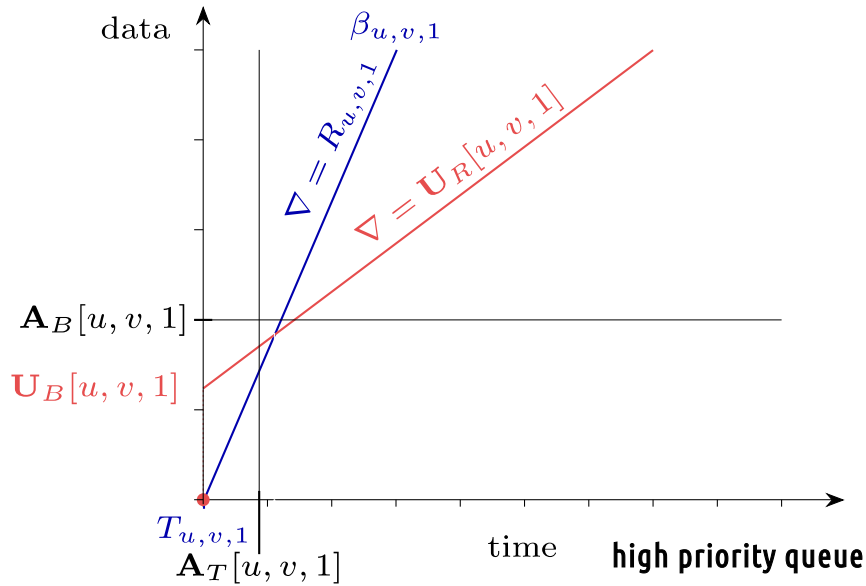
Let's see how this looks like graphically... at a link with 3 priority queues



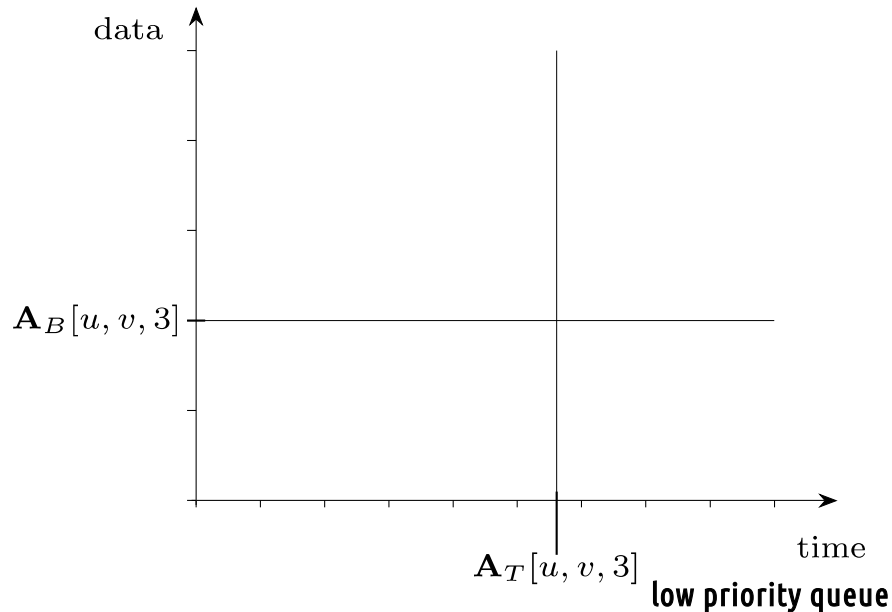
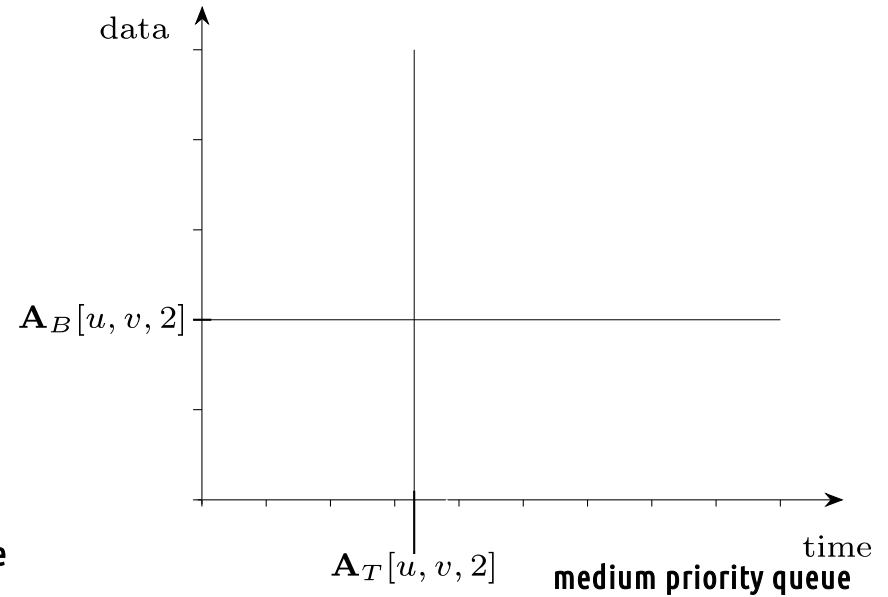
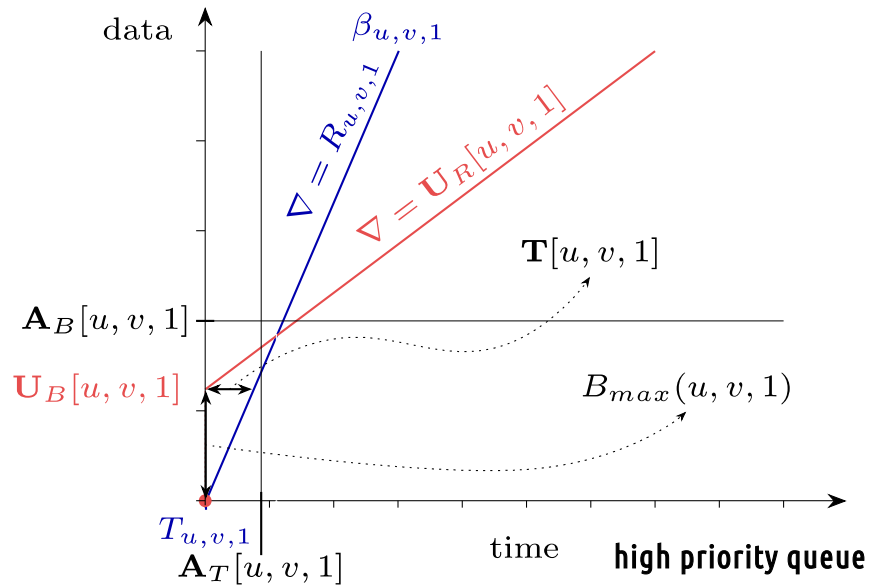
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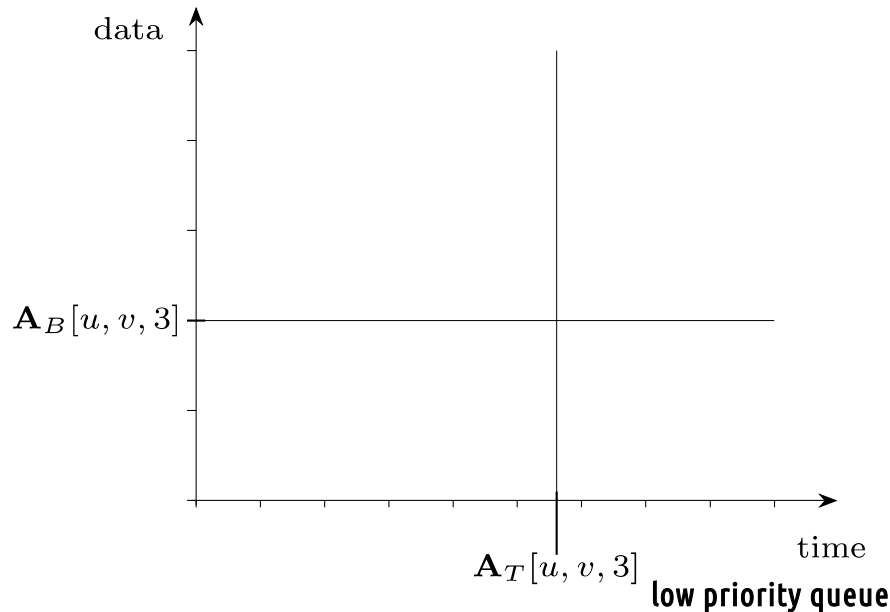
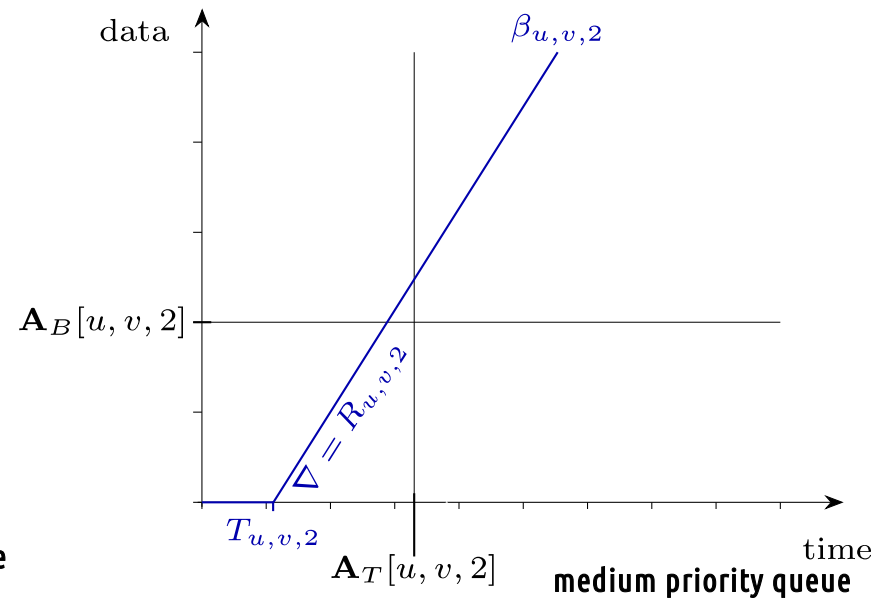
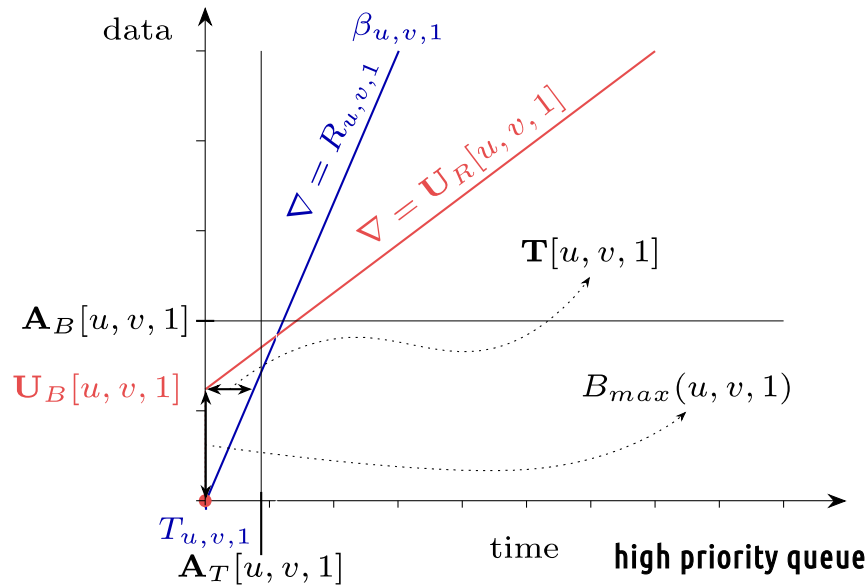
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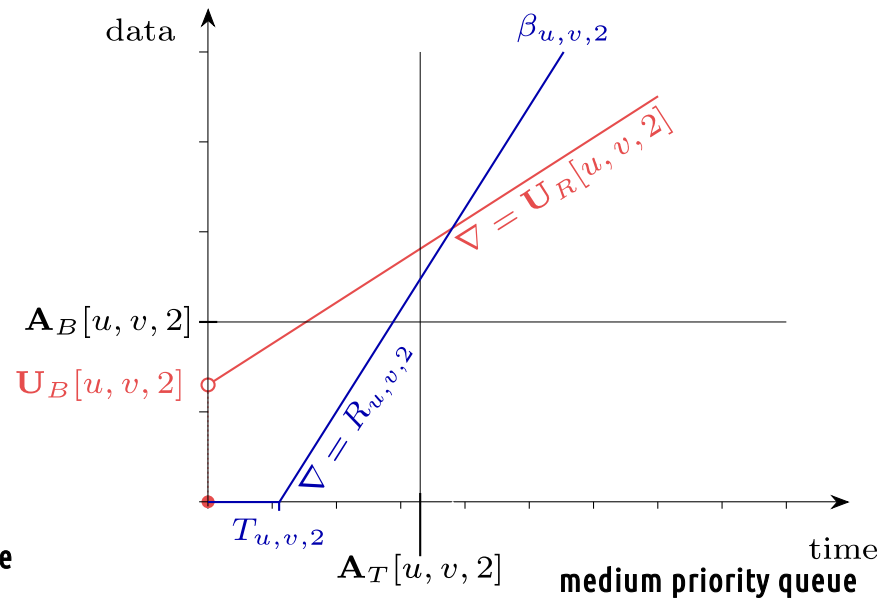
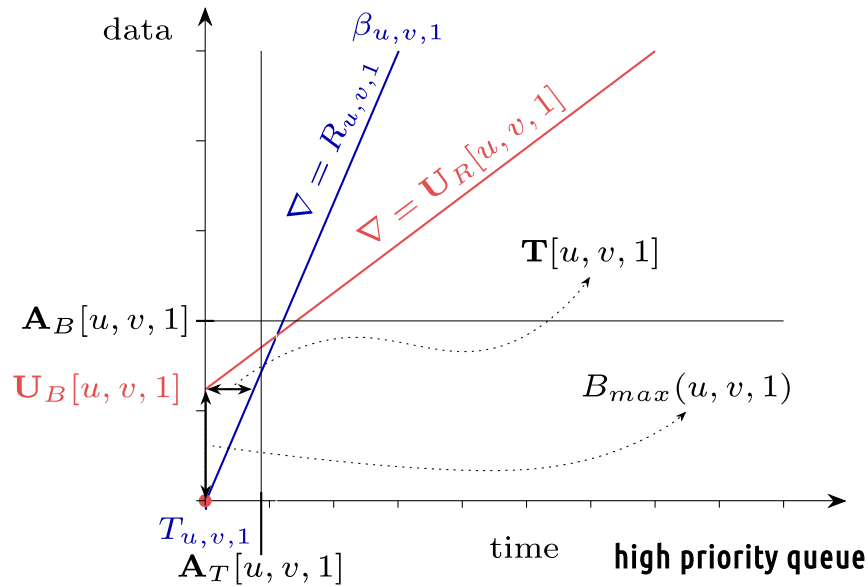
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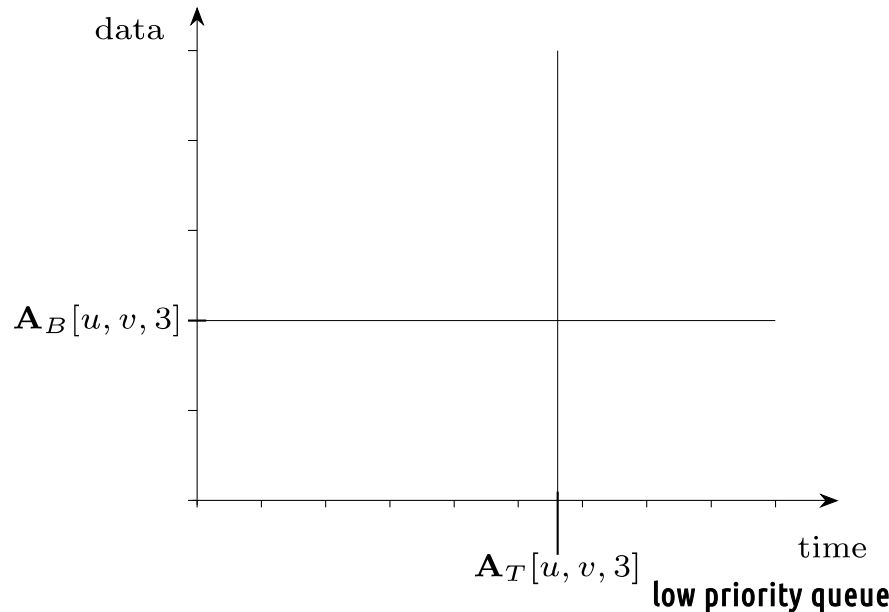
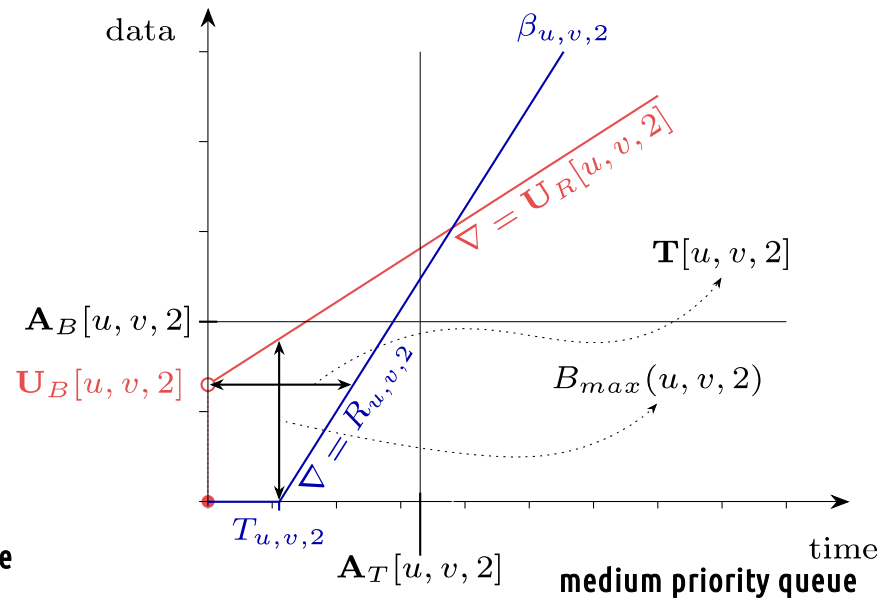
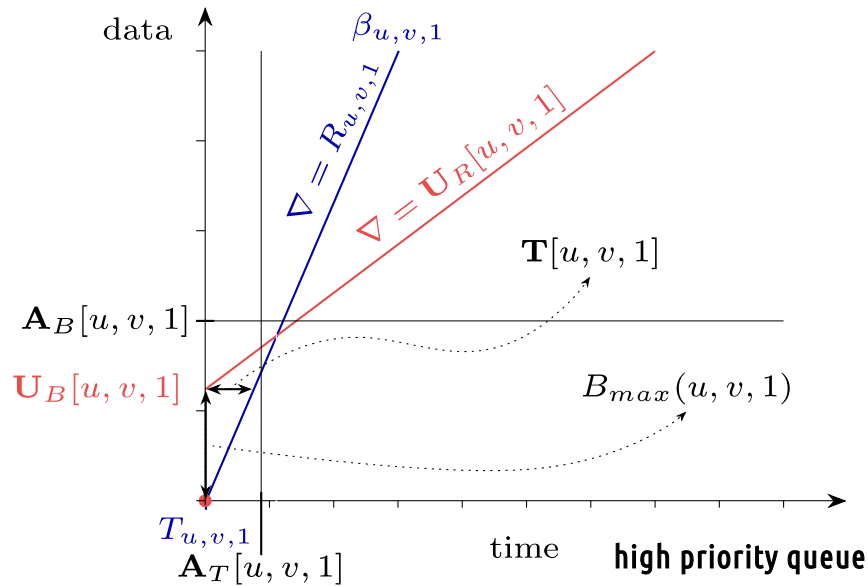
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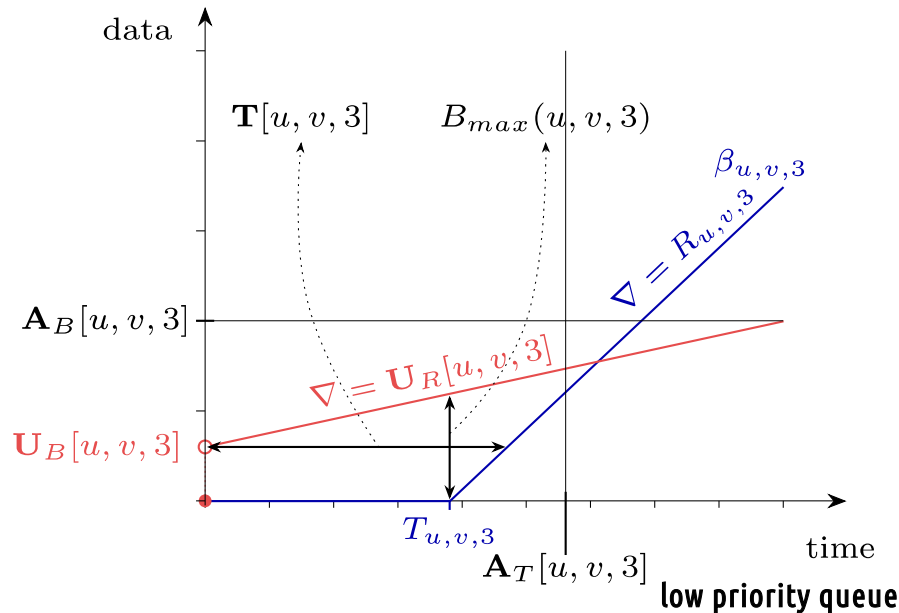
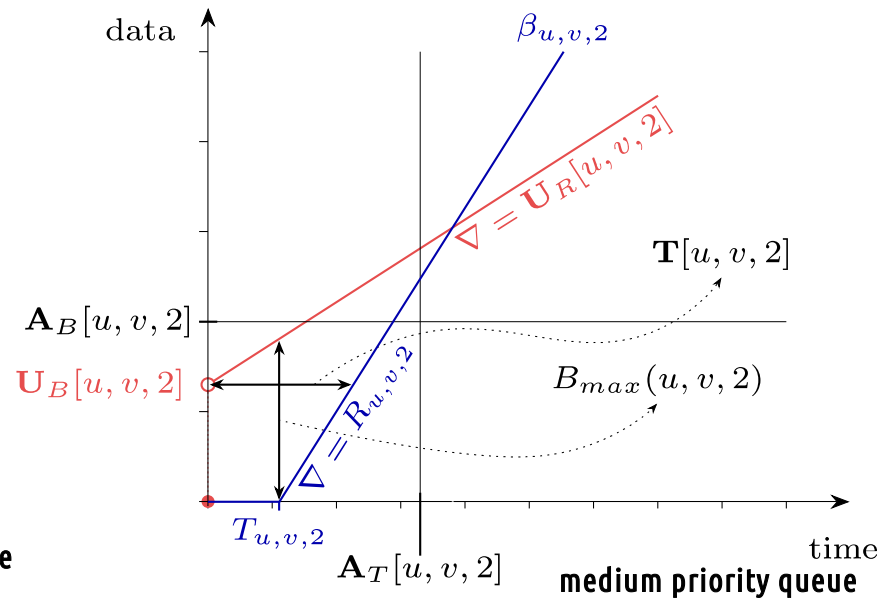
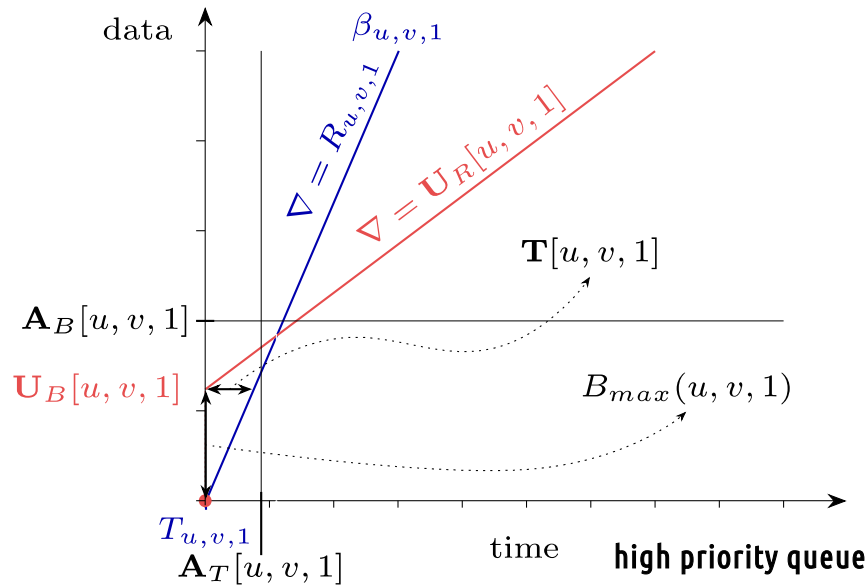
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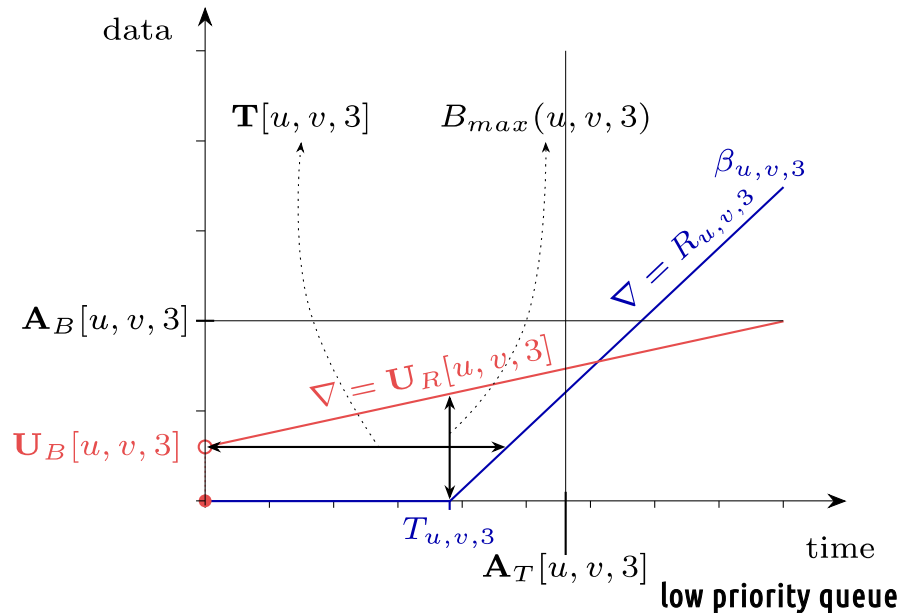
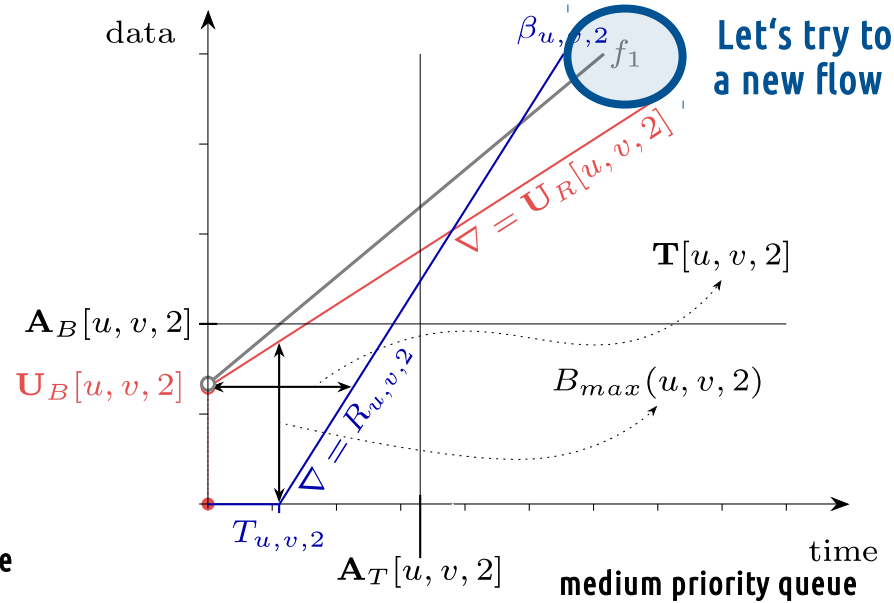
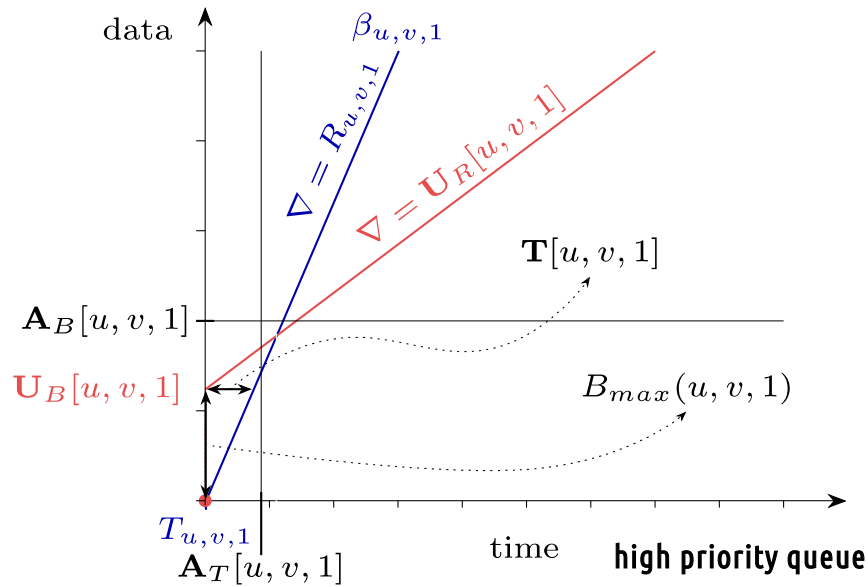
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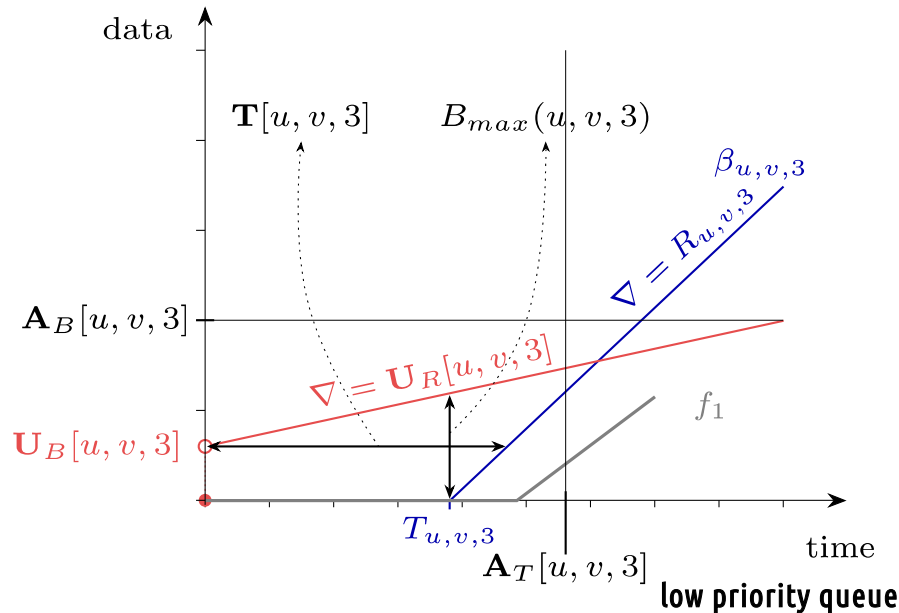
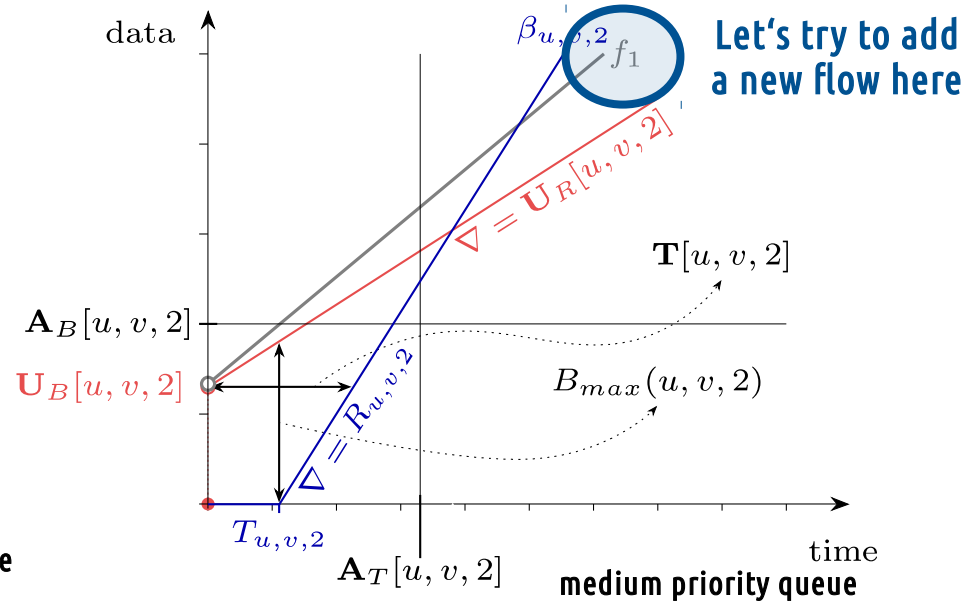
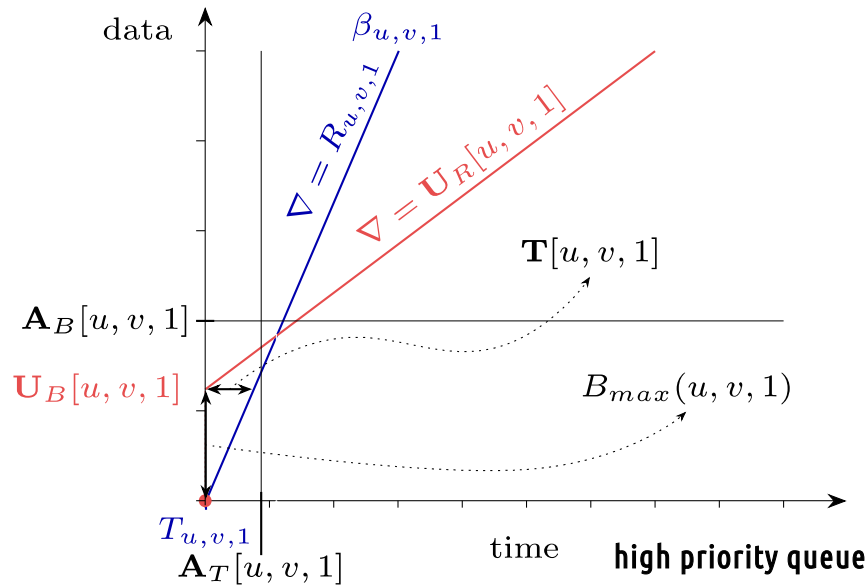
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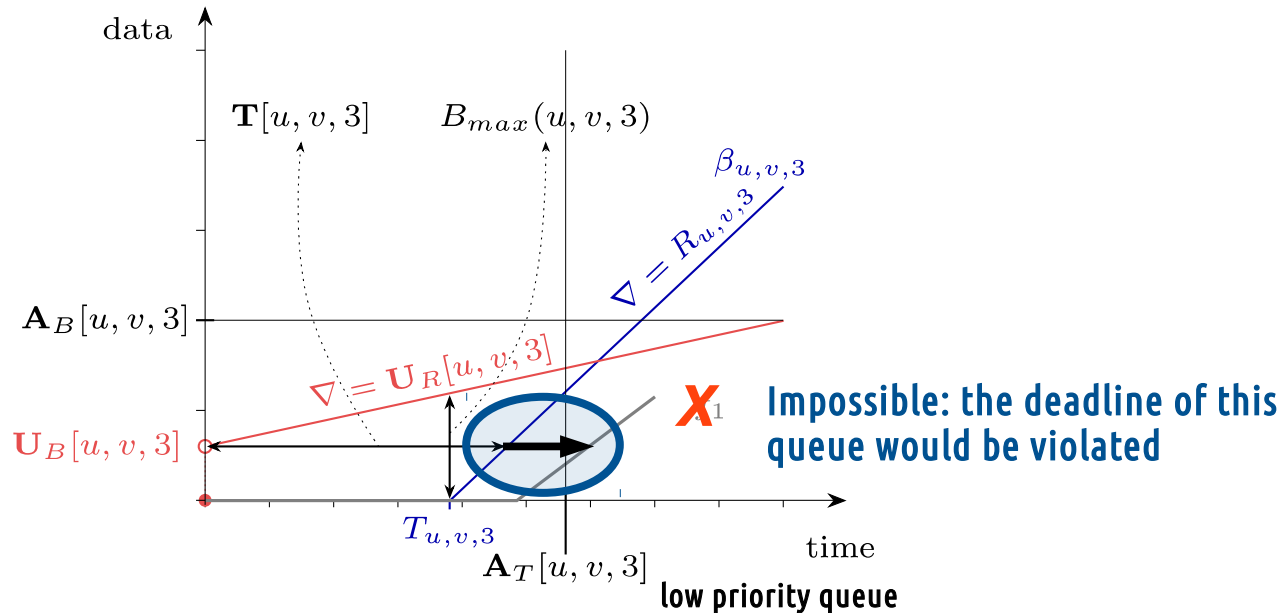
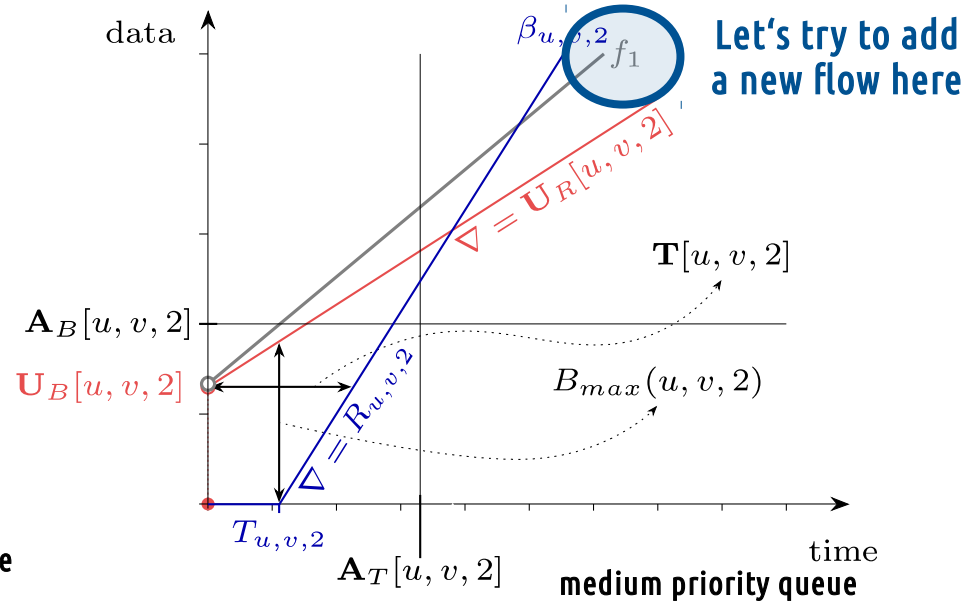
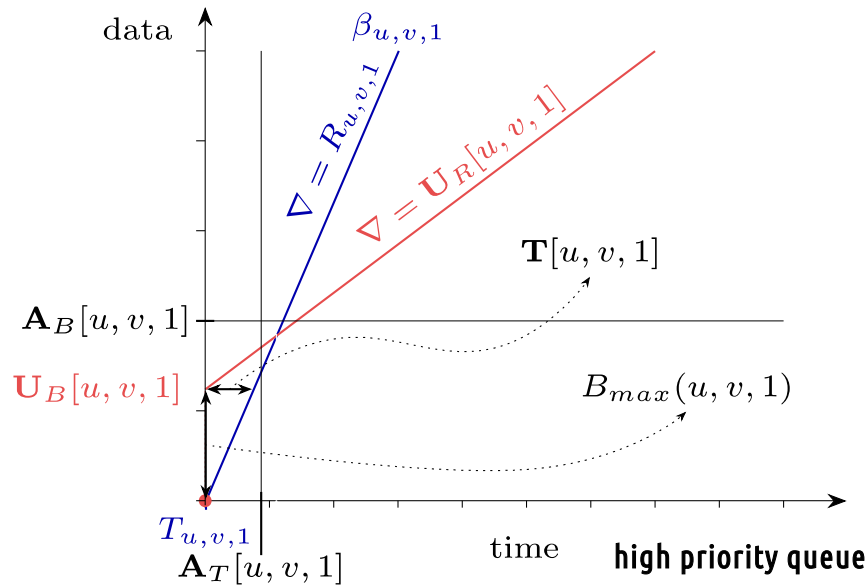
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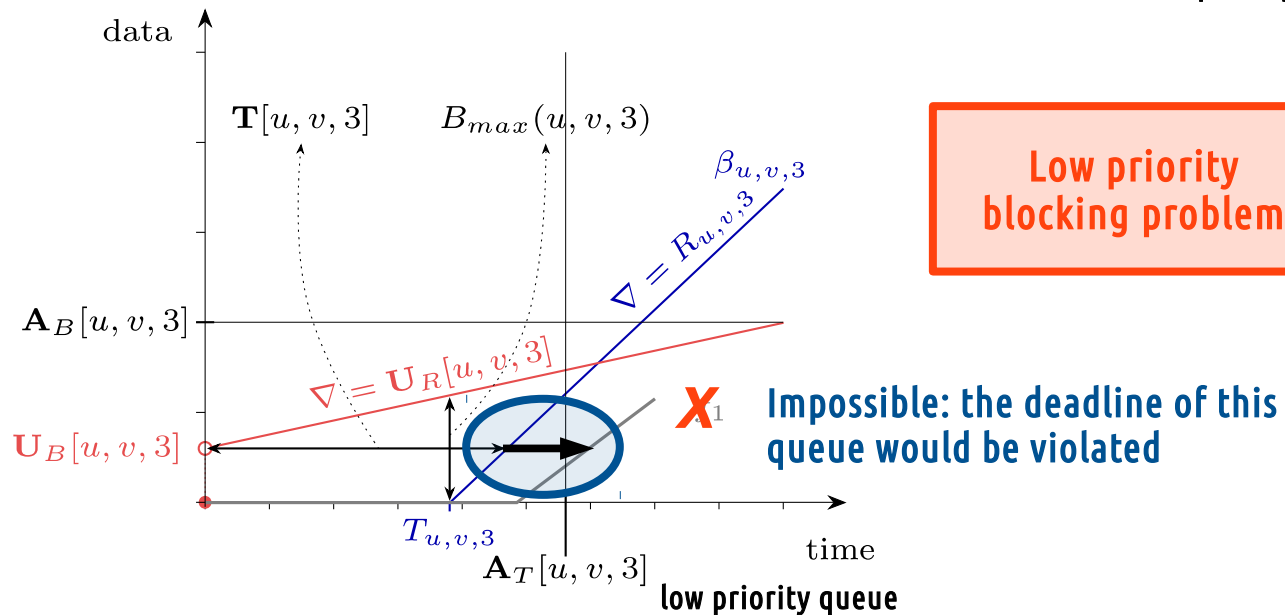
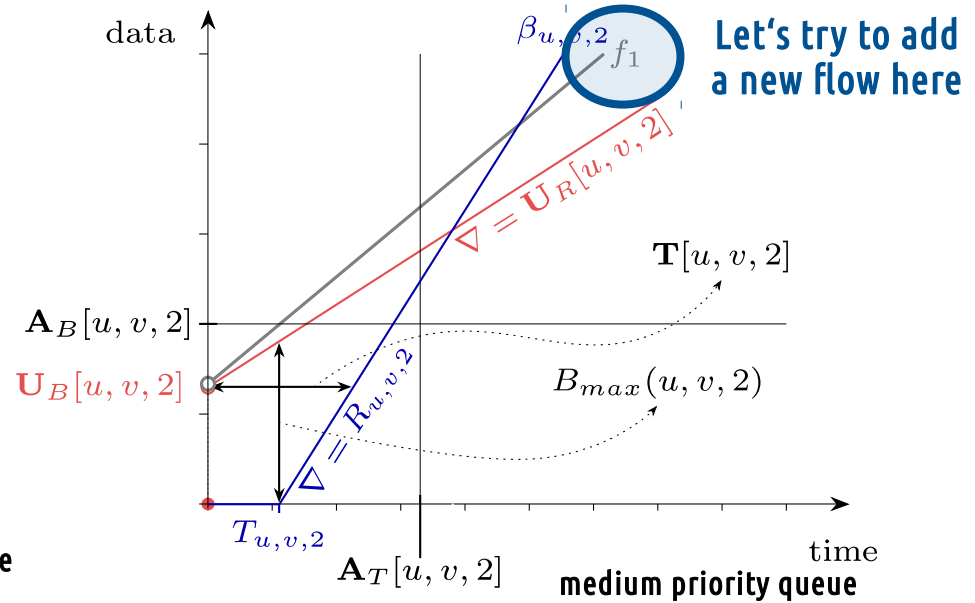
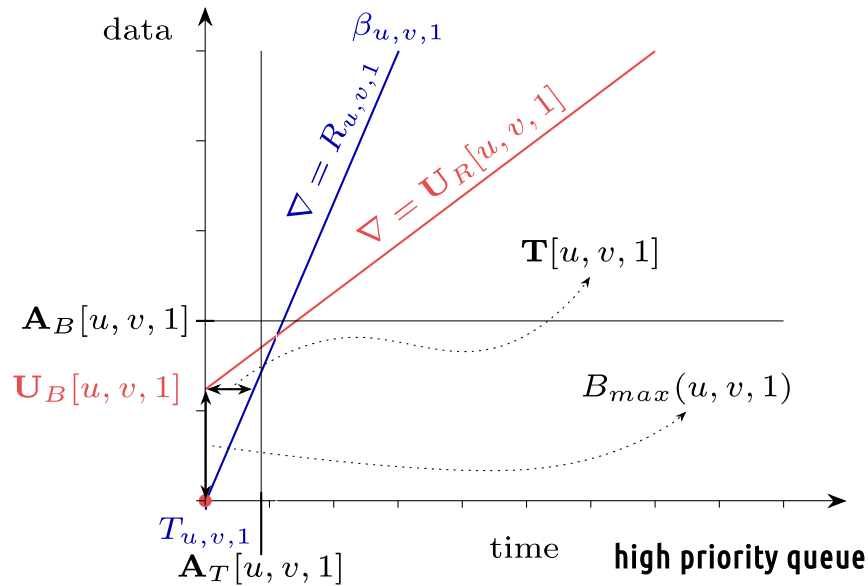
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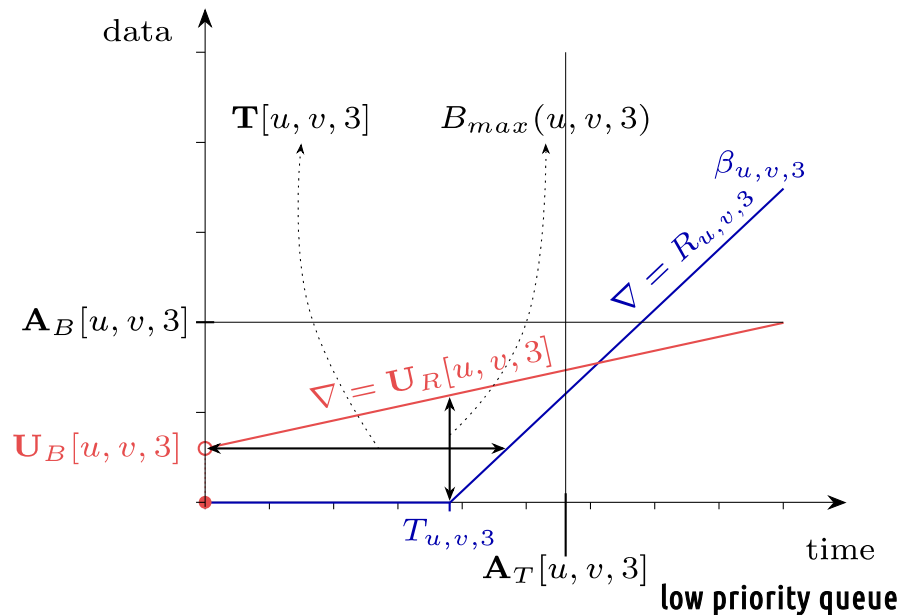
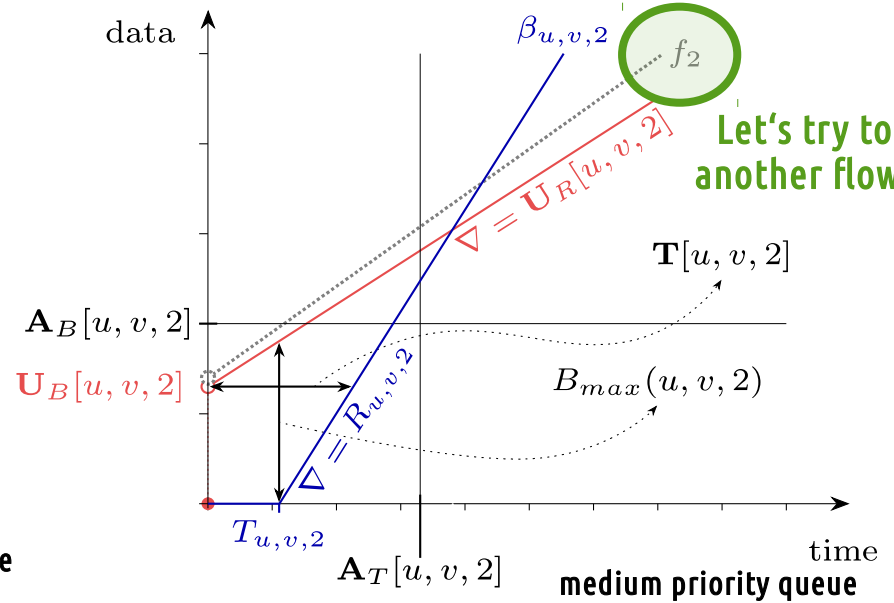
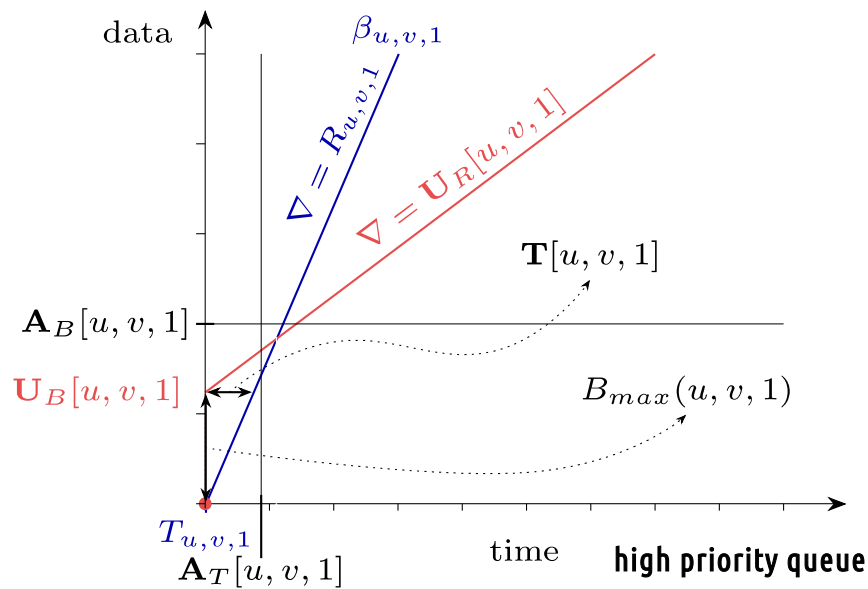
Let's see how this looks like graphically... at a link with 3 priority queues



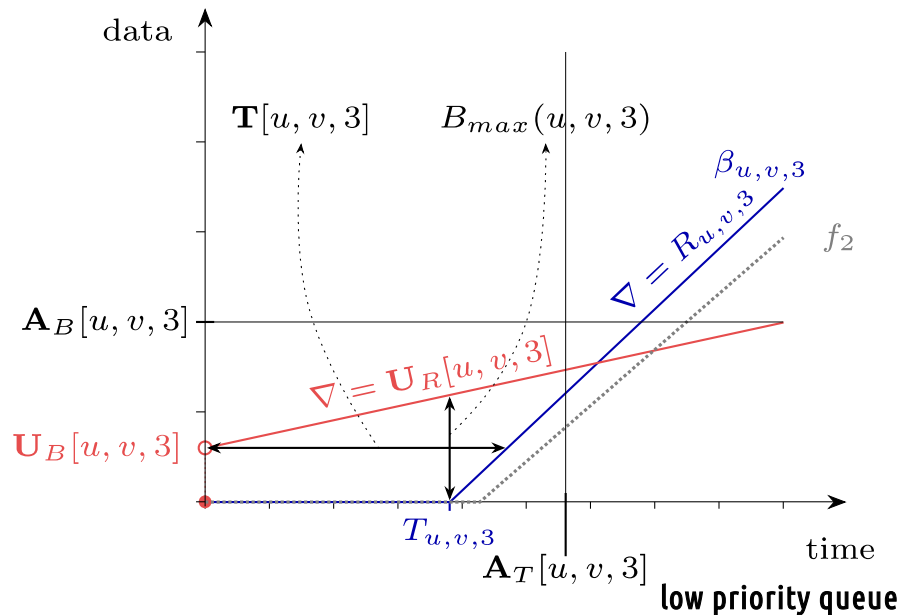
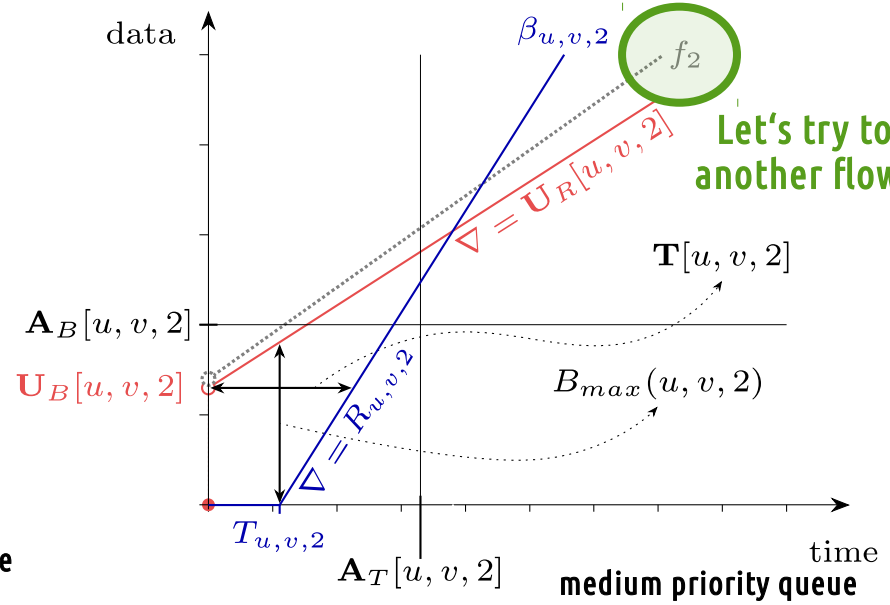
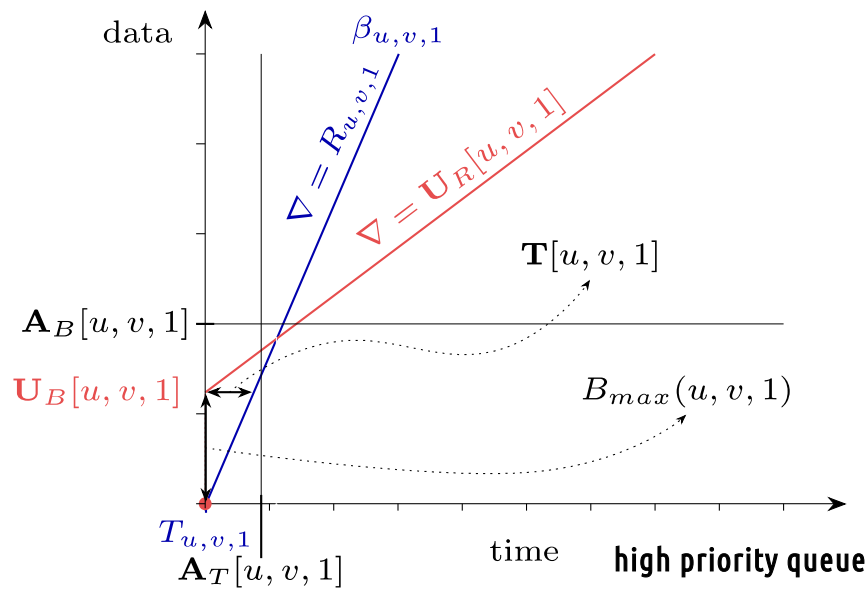
Let's see how this looks like graphically... at a link with 3 priority queues



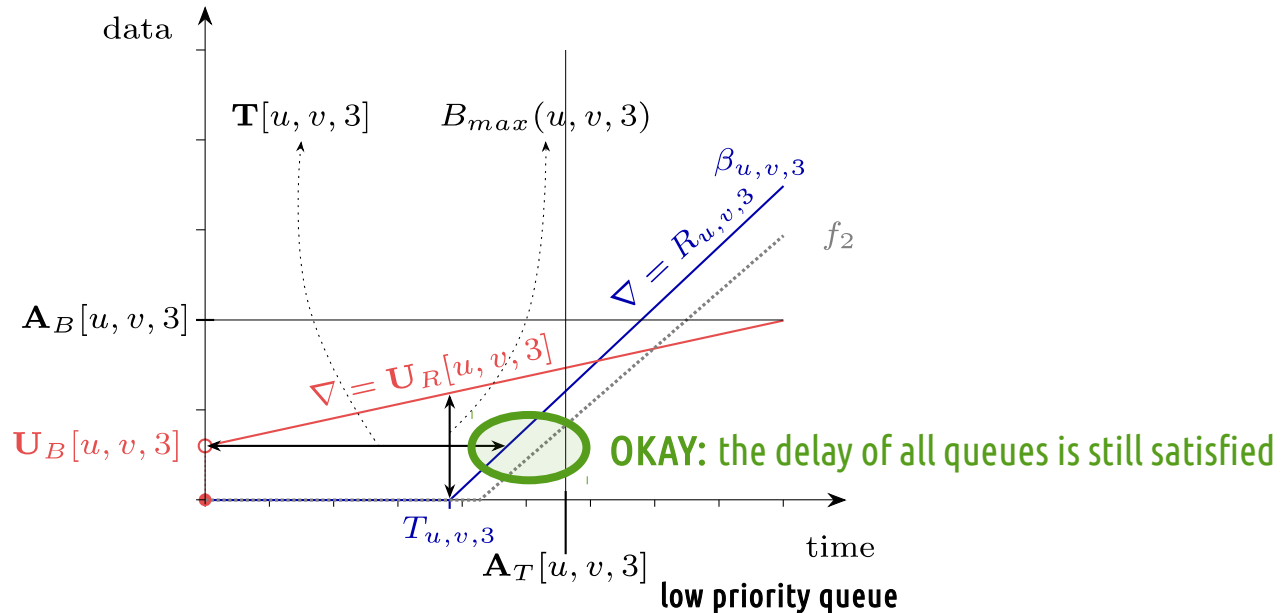
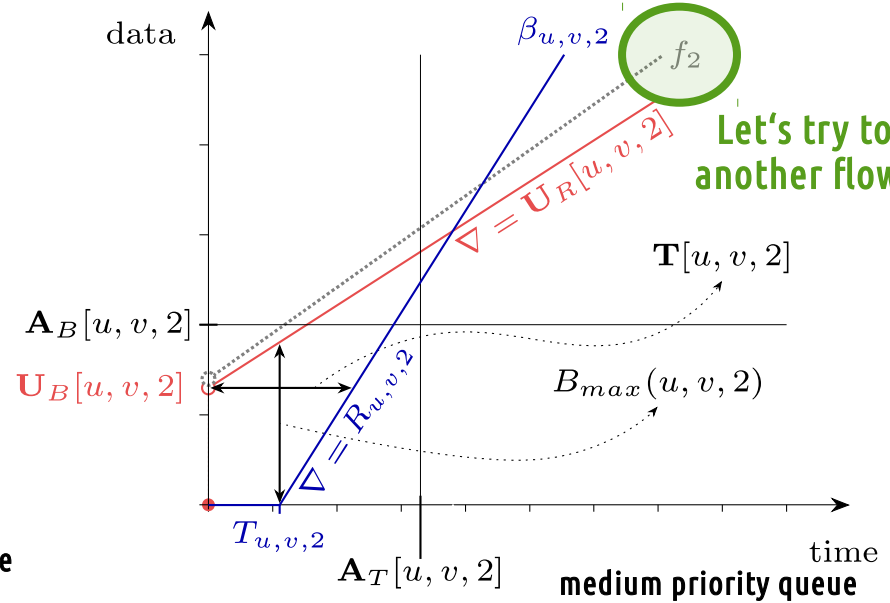
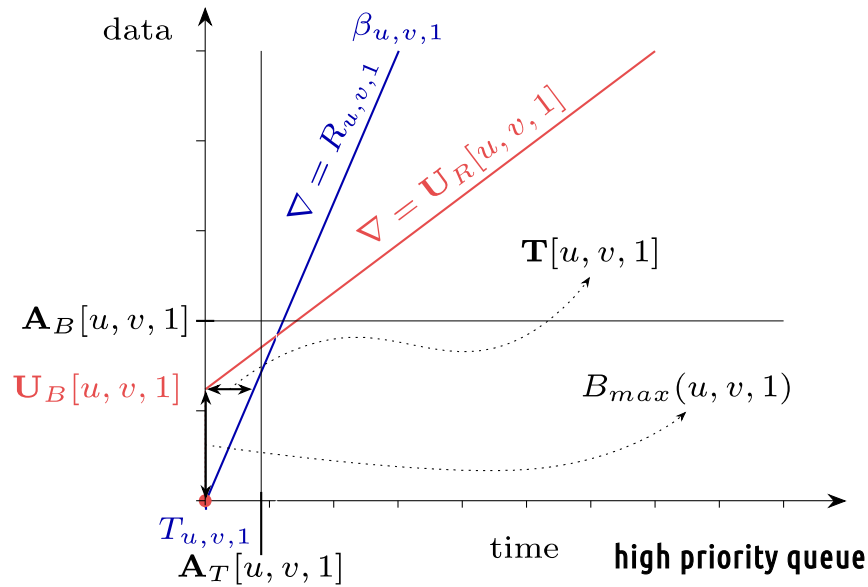
Let's see how this looks like graphically... at a link with 3 priority queues



Let's see how this looks like graphically... at a link with 3 priority queues



Let's see how this looks like graphically... at a link with 3 priority queues

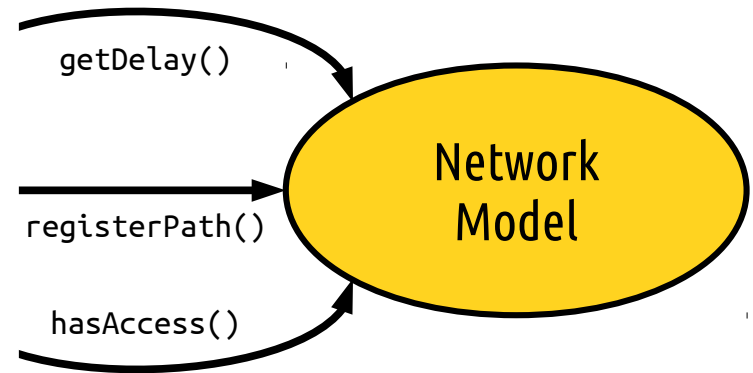


The Multi-Hop Model (MHM)

return $\mathbf{T}^{MHM}[u, v, p]$

update $\mathbf{U}_R[u, v, p], \mathbf{U}_B[u, v, p]$

check $\mathbf{M}_B[u, v, p], \mathbf{A}_R[u, v, p]$ are not exceeded

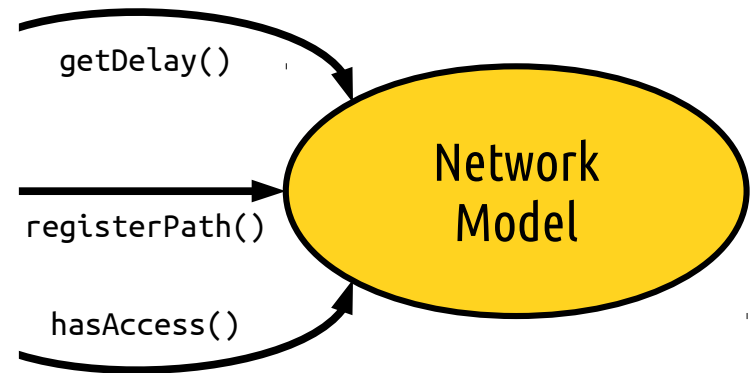


The Threshold-based Model (TBM)

return $\mathbf{T}^{TBM}[u, v, p]$

update $\mathbf{U}_R[u, v, p], \mathbf{U}_B[u, v, p], l_{u,v,p}^{max}$

check $\mathbf{T}^{TBM}[u, v, q], \mathbf{A}_B[u, v, q] \quad \forall q \geq p$



The Multi-Hop Model (MHM)

return $\mathbf{T}^{MHM}[u, v, p]$

getDelay()

update $\mathbf{U}_R[u, v, p], \mathbf{U}_B[u, v, p]$

registerPath()

hasAccess()

- + fast
- a priori choice
- 2 parameters to allocate

check $\mathbf{M}_B[u, v, p], \mathbf{A}_R[u, v, p]$ are not exceeded

The Threshold-based Model (TBM)

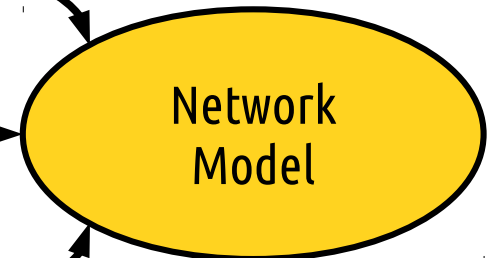
return $\mathbf{T}^{TBM}[u, v, p]$

getDelay()

update $\mathbf{U}_R[u, v, p], \mathbf{U}_B[u, v, p], l_{u,v,p}^{max}$

registerPath()

hasAccess()



check $\mathbf{T}^{TBM}[u, v, q], \mathbf{A}_B[u, v, q] \quad \forall q \geq p$

The Multi-Hop Model (MHM)

return $\mathbf{T}^{MHM}[u, v, p]$

getDelay()

update $\mathbf{U}_R[u, v, p], \mathbf{U}_B[u, v, p]$

registerPath()

hasAccess()

+ fast

- a priori choice

- 2 parameters to allocate

check $\mathbf{M}_B[u, v, p], \mathbf{A}_R[u, v, p]$ are not exceeded

The Threshold-based Model (TBM)

return $\mathbf{T}^{TBM}[u, v, p]$

getDelay()

update $\mathbf{U}_R[u, v, p], \mathbf{U}_B[u, v, p], l_{u,v,p}^{max}$

registerPath()

hasAccess()

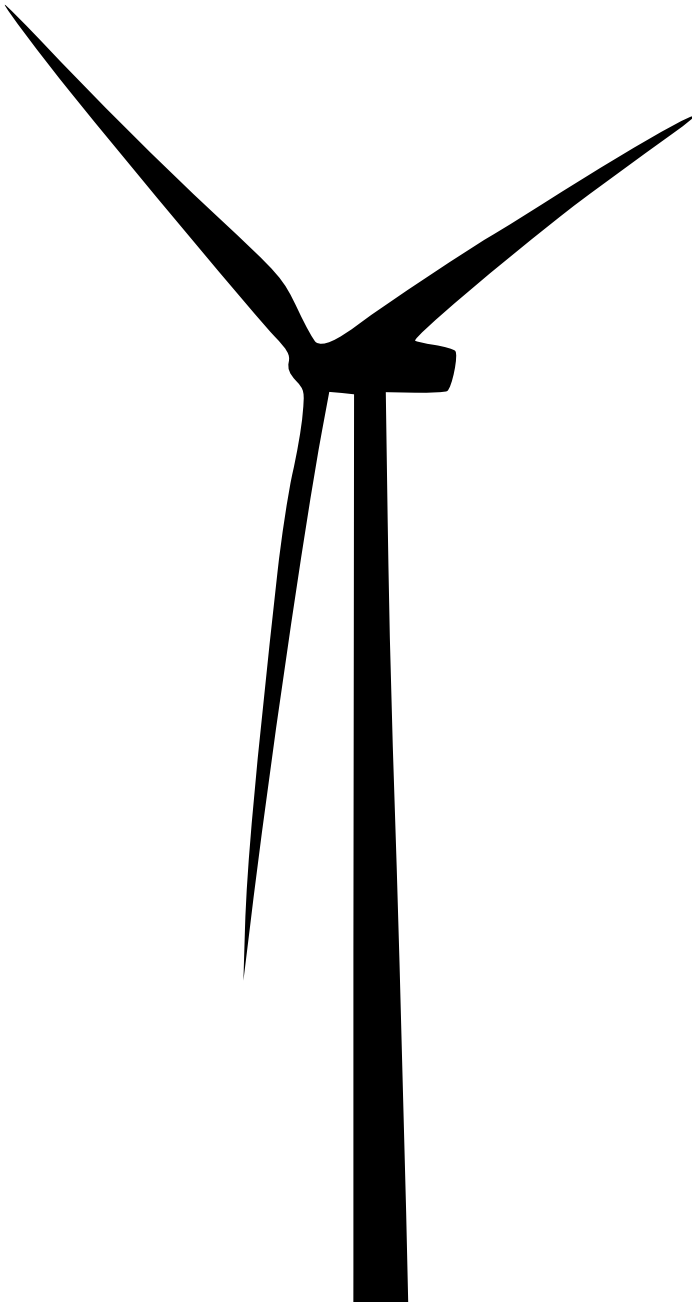
+ no a priori choice

+ 1 parameter to allocate

- blocking problem

- slower

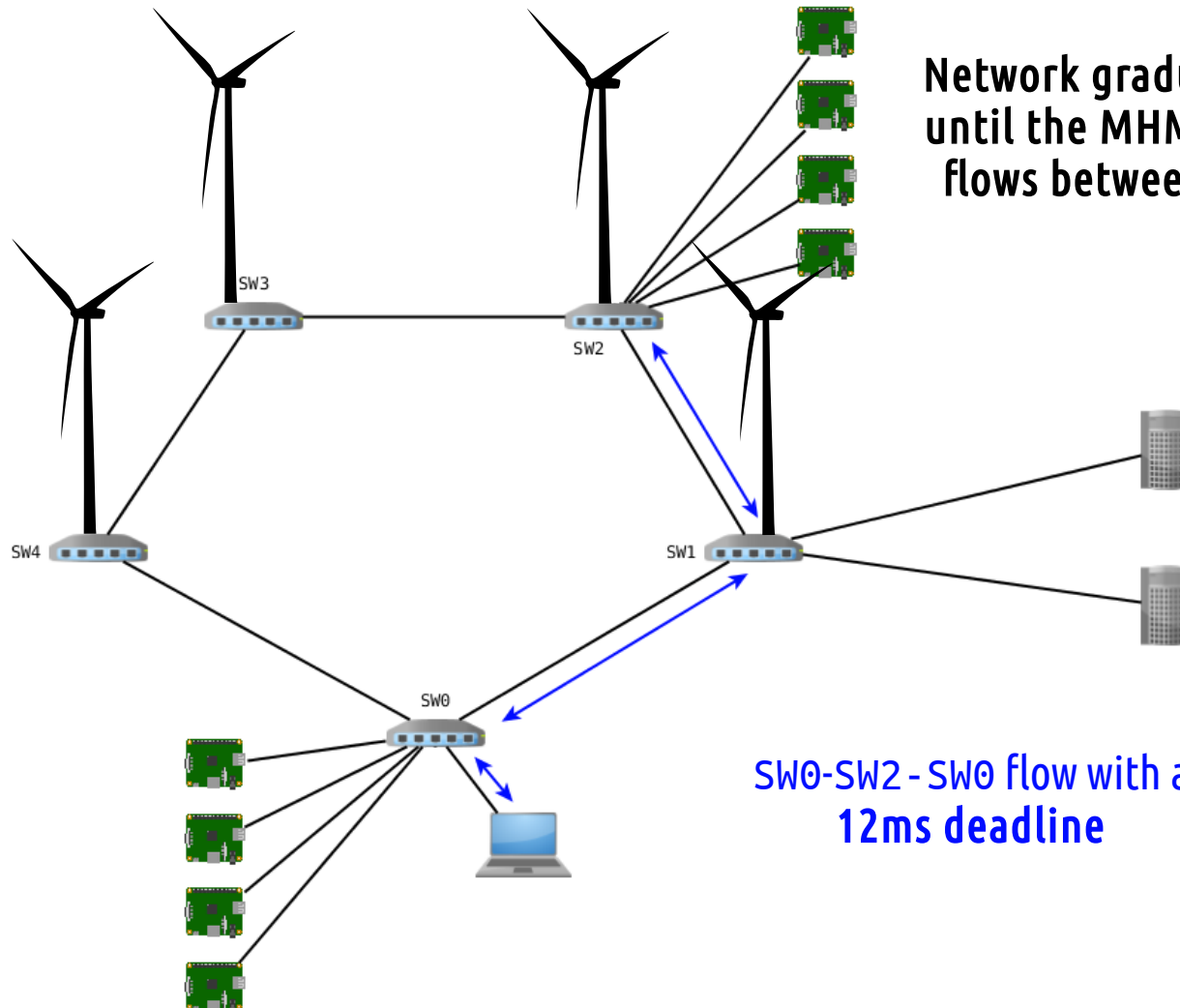
check $\mathbf{T}^{TBM}[u, v, q], \mathbf{A}_B[u, v, q] \quad \forall q \geq p$



Evaluation of the models

Evaluation of the MHM in a real wind park setup

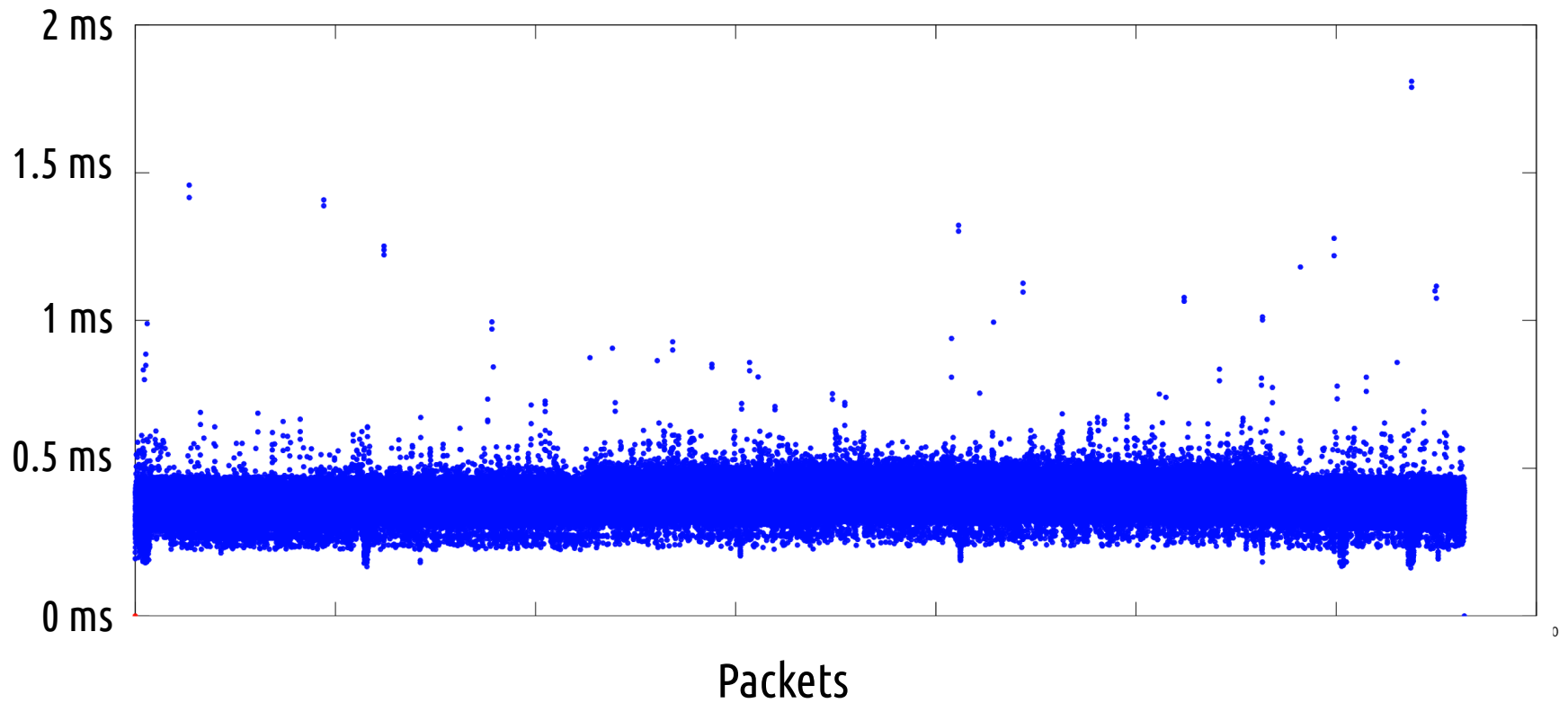
Model running on top of OpenDaylight



Evolution of the packet delay for the SW0-SW2-SW0 flow

Delay border never violated, no packet loss

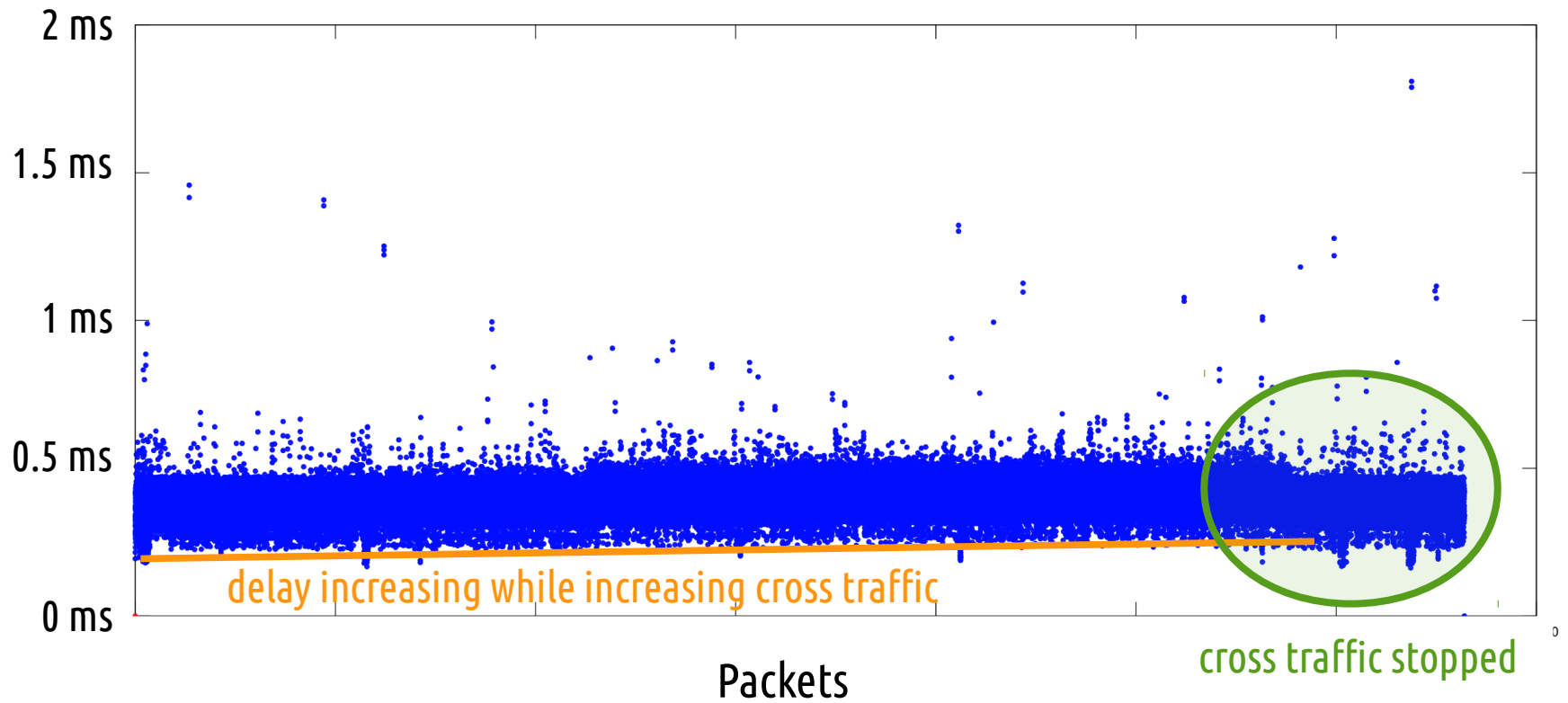
Delay guarantee 12ms



Evolution of the packet delay for the SW0-SW2-SW0 flow

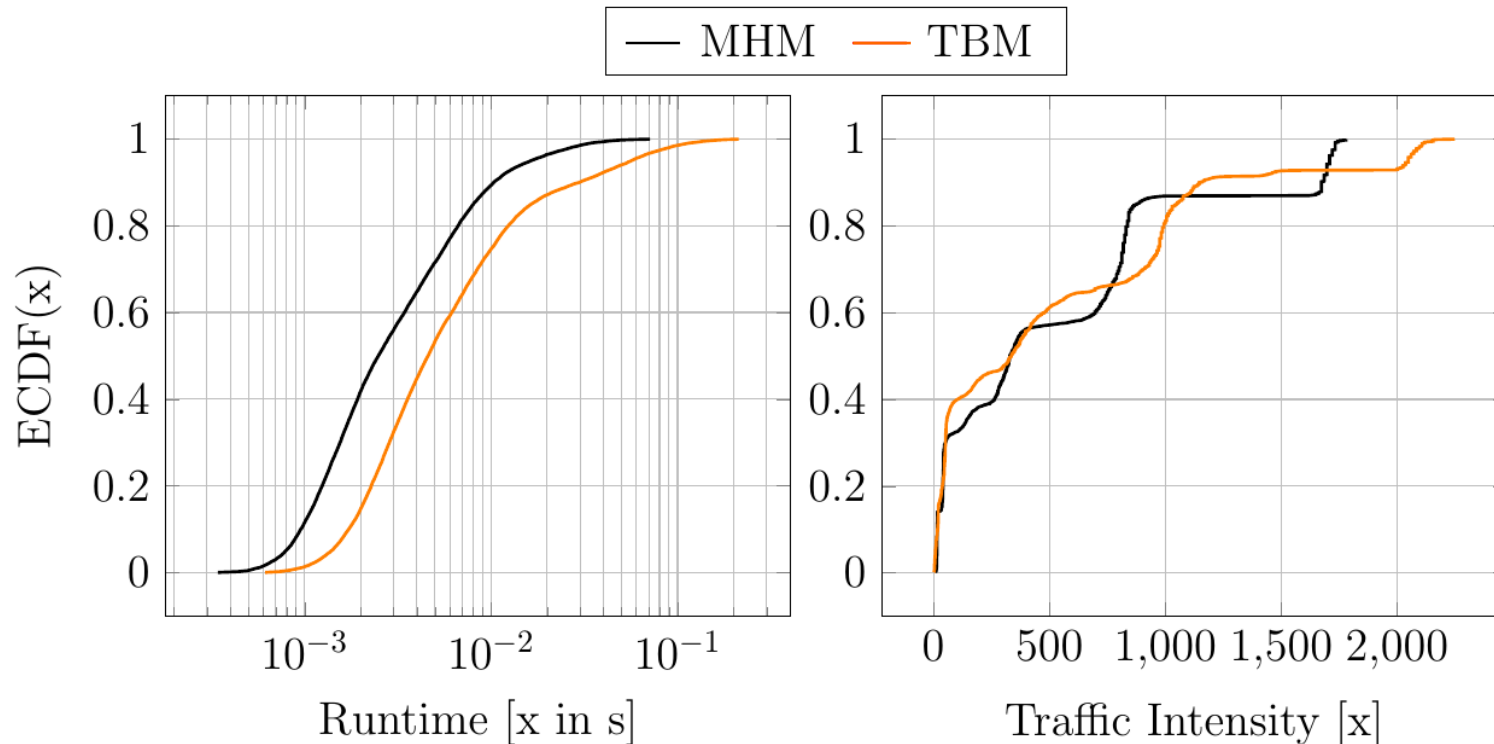
Delay border never violated, no packet loss

Delay guarantee 12ms



Simulation of the MHM and TBM

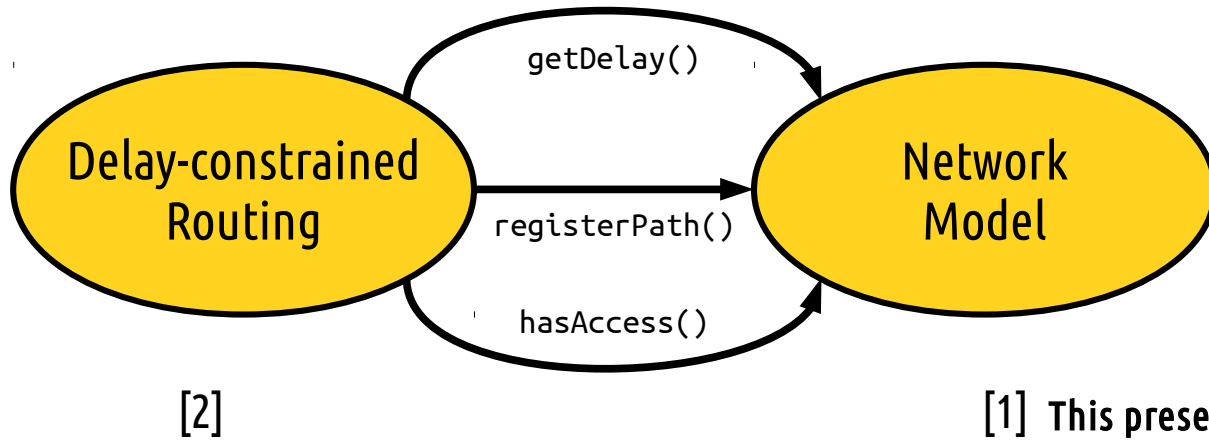
4 queues, various topologies, various routing procedures, various delay constraints



TBM around $Q_{u,v}$ times **slower**

TBM **potential to perform better** but depends on how the routing and resource allocation algorithms **avoid the blocking problem**

The **performance of the models is highly dependent** on the other routing/resource allocation algorithms



[1] This presentation!

Unicast QoS Routing Algorithms for SDN: A Comprehensive Survey and Performance Evaluation

Jochen W. Guck, Amaury Van Bemten, Martin Reisslein, *Fellow, IEEE*, and Wolfgang Kellerer, *Senior Member, IEEE*

Abstract—A variety of communication networks, such as industrial communication systems, have to provide strict delay guarantees to the carried flows. Fast and close to optimal quality of service (QoS) routing algorithms, e.g., delay-constrained least-cost (DCLC) routing algorithms, are required for routing flows in such networks with strict delay requirements. The emerging software-defined networking (SDN) paradigm centralizes the network control in SDN controllers that can centrally execute QoS routing algorithms. A wide range of QoS routing algorithms have been proposed in the literature and examined in individual studies. However, a comprehensive evaluation framework and quantitative comparison of QoS routing algorithms that can serve as a basis for selecting and further advancing QoS routing in SDN networks is missing in the literature. This makes it difficult to select the most appropriate QoS routing algorithm for a particular use case, e.g., for SDN controlled industrial communications. We close this gap in the literature by conducting a comprehensive up-to-date survey of centralized QoS routing algorithms. We introduce a novel four-dimensional (4D) evaluation framework for QoS routing algorithms, whereby the 4D correspond to the type of topology, two forms of scalability of a topology, and the tightness of the delay constraint. We implemented 26 selected DCLC algorithms and compared their runtime and cost inefficiency within the 4D evaluation framework. While the main conclusion of this evaluation is that the best algorithm depends on the specific sub-space of the 4D space that is targeted, we identify two algorithms, namely *Lagrange relaxation-based aggregated cost (LARAC)* and *search space reduction delay-cost-constrained routing (SSR+DCCR)*, that perform very well in most of the 4D evaluation space.

Index Terms—Delay-constrained least-cost (DCLC) routing, performance evaluation framework, quality of service (QoS), scalability, software-defined networking (SDN).

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J. W. Guck, A. Van Bemten, and W. Kellerer are with the Lehrstuhl für Kommunikationsnetze, Technical University of Munich, 80290 Munich, Germany (e-mail: guck@tum.de; amaurv.van-bemten@tum.de; kellerer@tum.de).

I. INTRODUCTION

A. Topic Area: Routing Algorithms for QoS Networking

ROUTING, i.e., determining a route (path) from a source node to a destination node through a sequence of intermediate switching nodes, is an elementary function of the network layer in communication networks. Given the importance of routing for communication networks, a diverse array of routing algorithms have been designed. Many routing algorithms have been specifically designed for specific network settings or applications, see Section I-C.

Providing quality of service (QoS) is an important requirement for a wide range of communication network settings and applications. For instance, multimedia network applications require QoS from the network service, as do many network applications in industrial networks [1] and the smart grid [2] as well as networked control systems [3]. The required QoS is often in the form of delay bounds (constraints) for the data packets traversing the network. Accordingly, extensive research has developed routing algorithms that satisfy given delay constraints while minimizing some cost metric, i.e., so-called delay-constrained least-cost (DCLC) routing algorithms. DCLC routing algorithms and similar routing algorithms that support QoS networking are often referred to as *QoS routing algorithms*.

Generally, the route determination (computation) is either carried out in distributed nodes, e.g., the control modules in individual distributed Internet Protocol (IP) routers, or by a centralized controller, e.g., a Software-Defined Networking (SDN) controller [4]–[8]. Distributed routing algorithms had been intensely researched for traditional IP routing, e.g., [9]–[11], and more recently for ad hoc networks, see [12]–[16]. In the mid 1990s, the development of QoS paradigms for the Internet, see [17]–[22], led to a renewed interest in examining routing and spurred the development of a plethora of QoS routing algorithms, which mainly targeted distributed computation. In sharp contrast, the emergence of the Software-Defined Networking (SDN) paradigm [23], [24] has shifted the research focus to centralized network control, including centralized routing computations [25]–[30]. The pur-

DetServ: Network Models for Real-Time QoS Provisioning in SDN-Based Industrial Environments

Jochen W. Guck[✉], Amaury Van Bemten, and Wolfgang Kellerer[✉], *Senior Member, IEEE*

Abstract—Industrial networks require real-time guarantees for the flows they carry. That is, flows have hard end-to-end delay requirements that have to be deterministically guaranteed. While proprietary extensions of Ethernet have provided solutions, these often require expensive forwarding devices. The rise of software-defined networking (SDN) opens the door to the design of centralized traffic engineering frameworks for providing such real-time guarantees. As part of such a framework, a *network model* is needed for the computation of worst-case delays and for access control. In this paper, we propose two network models based on network calculus theory for providing deterministic services (DetServ). While our first model, the *multi-hop model* (MHM), assigns a rate and a buffer budget to each queue in the network, our second model, the *threshold-based model* (TBM), simply fixes a maximum delay for each queue. Via a packet-level simulation, we confirm that the delay bounds guaranteed by both models are never exceeded and that no packet loss occurs. We further show that the TBM provides more flexibility with respect to the characteristics of the flows to be embedded and that it has the potential of accepting more flows in a given network. Finally, we show that the runtime cost for this increase in flexibility stays reasonable for online request processing in industrial scenarios.

Index Terms—Access control, real-time, industrial network, network modeling, network calculus, quality of service (QoS), software-defined networking (SDN).

I. INTRODUCTION

A. Motivation: Industrial Networking Quality of Service

INDUSTRIAL communications (e.g., machine-to-machine (M2M) communications or production facilities networks) have strict Quality of Service (QoS) requirements, mainly in terms of end-to-end delay [1]. This means that flows have end-to-end delay bounds that must not be exceeded. In this article, such flows are referred to as *real-time flows*. A wide range of proprietary solutions [2] and extensions of Ethernet [3] have been developed for providing this strict QoS. However, these

solutions typically require changes within the network protocol stack or impose restrictions on the topology that can be deployed, which leads to expensive forwarding devices.

B. Basis: Centralized Frameworks Based on Software-Defined Networking

Software-Defined Networking (SDN) is a new networking paradigm that runs control functions on a centralized controller which is then able to program the Ethernet forwarding elements in the network using a standardized interface such as OpenFlow [4]. This central view offered by SDN allows to perform traffic engineering based on the global knowledge of the network. Because it only requires simple commodity SDN forwarding elements that can be changed and updated independently [5], SDN is considered as an inexpensive solution. Therefore, as elaborated in Section II, a plethora of work has been considering the usage of SDN for the provisioning of QoS [6]–[18]. However, the QoS control provided by these approaches is either too *inaccurate* or *slow* for industrial applications [18].

As initiated by Jasperneite et al. [19], Guck et al. [16]–[18] propose to overcome the two above-mentioned shortcomings by using *network calculus*, a mathematical modeling framework (introduced in Section III), to maintain a deterministic model of the network state in the control plane. First, network calculus being a deterministic framework, *accurate* bounds can be computed on a per-flow basis. Second, keeping a deterministic model in the centralized control plane allows to avoid the QoS control loop to go through the forwarding plane, thereby allowing to *quickly* provision new flow requests [17]. As such, the two drawbacks of existing approaches are overcome.

C. Contribution: DetServ: Network Models for Deterministic Worst-Case Delay Computation and Access Control

As elaborated in Section IV, a centralized industrial QoS framework requires a network model for the computation of worst-case delays and for access control. The core contribution of this article consists of two network models that can be used as part of such QoS frameworks for providing determin-

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The authors are with the Lehrstuhl für Kommunikationsnetze, Technical

- [1] J. W. Guck, A. Van Bemten and W. Kellerer, "DetServ: Network Models for Real-Time QoS Provisioning in SDN-Based Industrial Environments," in *IEEE Transactions on Network and Service Management*, vol. 14, no. 4, pp. 1003-1017, Dec. 2017.
- [2] J. W. Guck, A. Van Bemten, M. Reisslein and W. Kellerer, "Unicast QoS Routing Algorithms for SDN: A Comprehensive Survey and Performance Evaluation," in *IEEE Communications Surveys & Tutorials*, vol. 20, no. 1, pp. 388-415, Firstquarter 2018.