



北京航空航天大学  
BEIHANG UNIVERSITY

# Challenges of Deadline-Aware Configurations for Hybrid TSN Networks

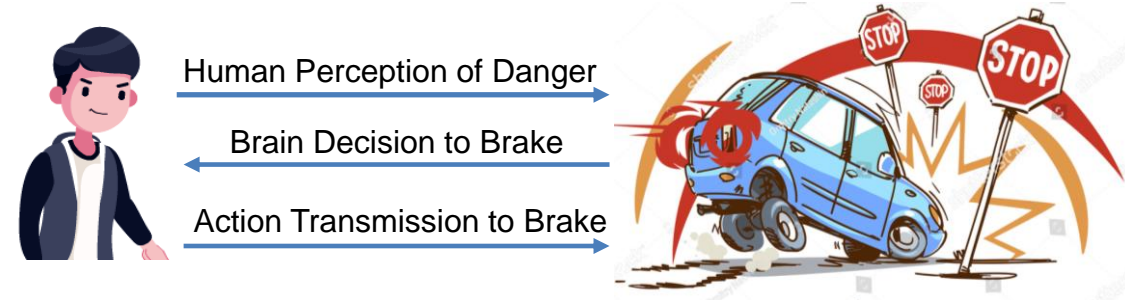
by **Luxi Zhao**

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Beihang University

# Real-time performance of TSN networks

- A key issue of focus
- Correctness in real-time communications
  - Task functional logic
  - Latency within defined upper bounds



**Manual Control**

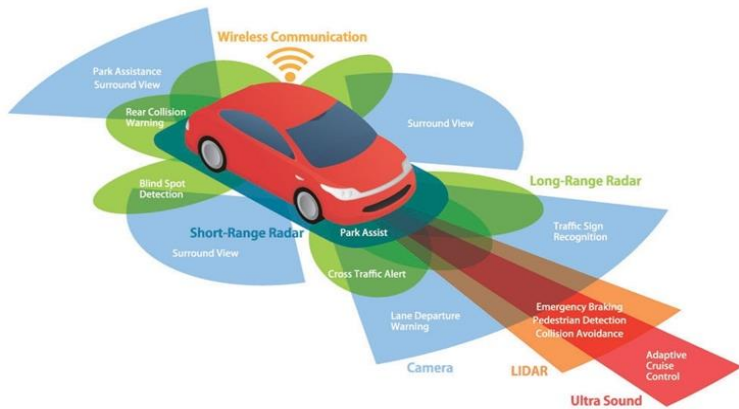
**Reaction Time**



**Automatic Control**

**Communication Deadline**

## Functional logic correctness

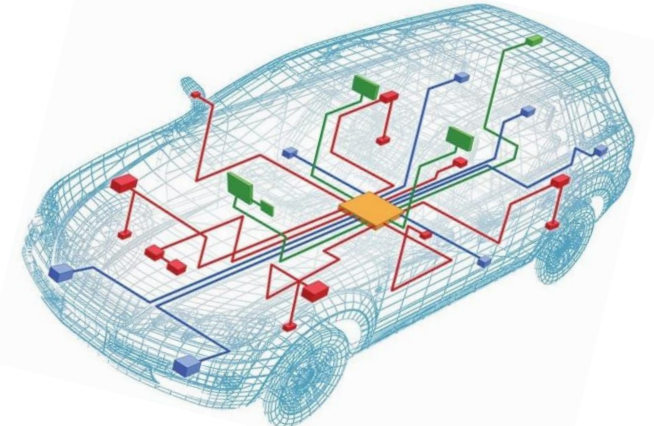


Sensor Perception



System Decision-Making

## Application deadline satisfaction

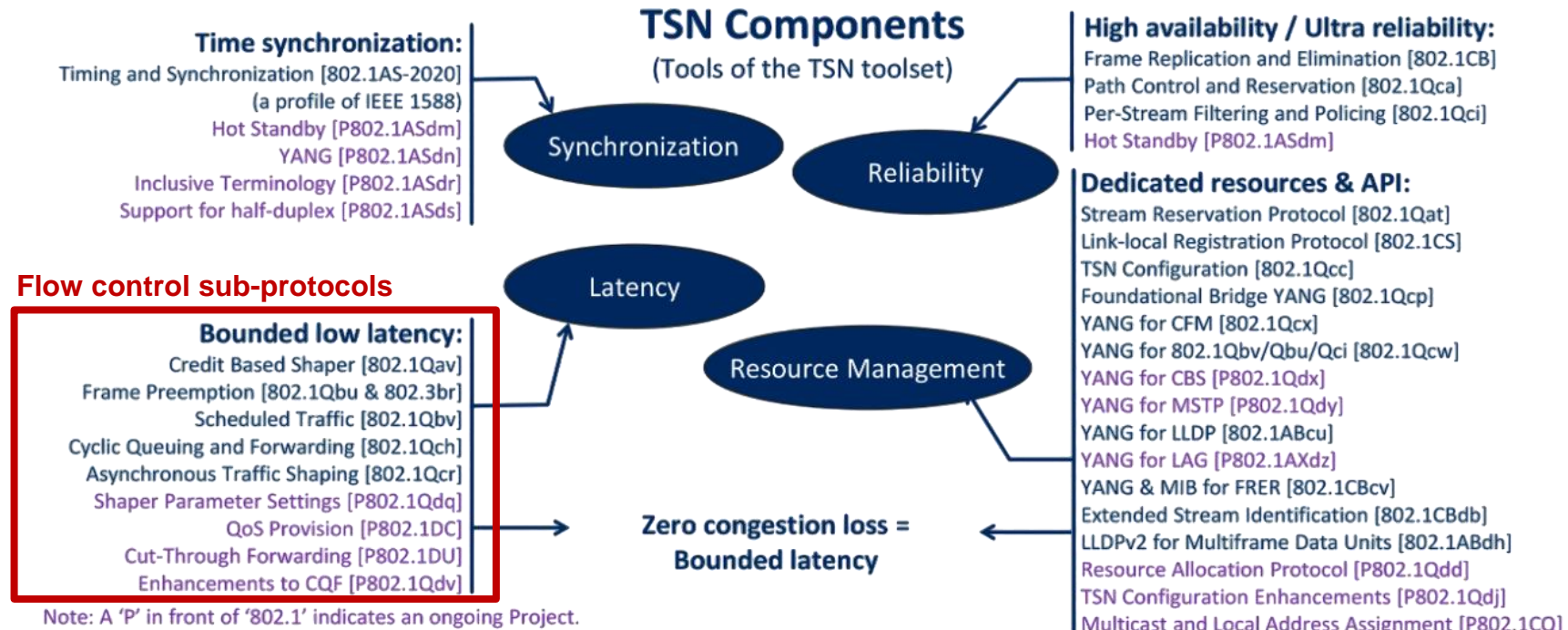


Real-Time Communication Network

# Real-time performance of TSN networks

## Does TSN Automatically Guarantee Real-Time Transmission? **NO**

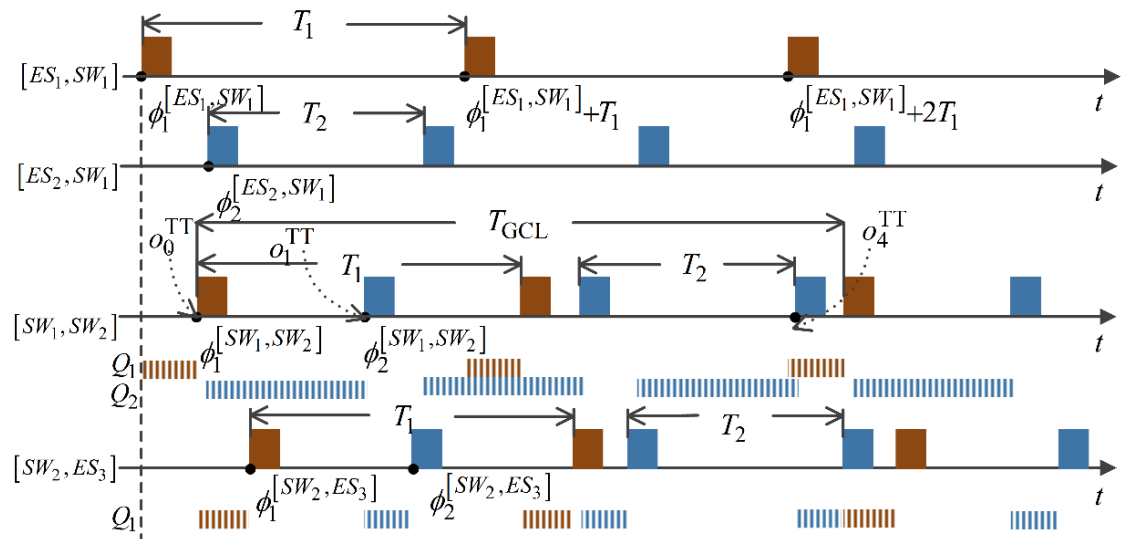
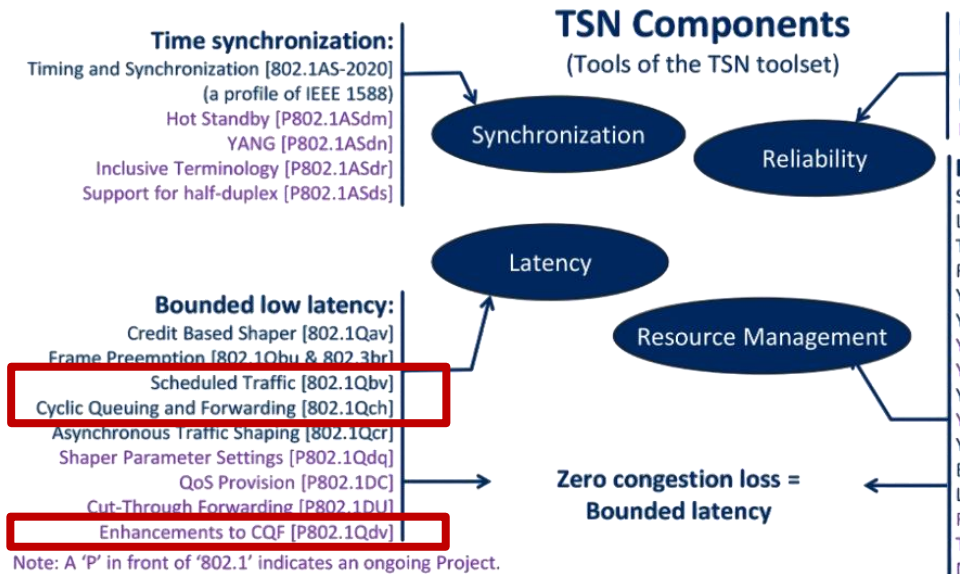
- Flow control related sub-protocols
  - Provides a basic paradigm for network design
- Require algorithms and tools for achieving real-time communications



# Real-time performance of TSN networks

## Real-time Guarantees for TIME-Triggered (TT) Communication

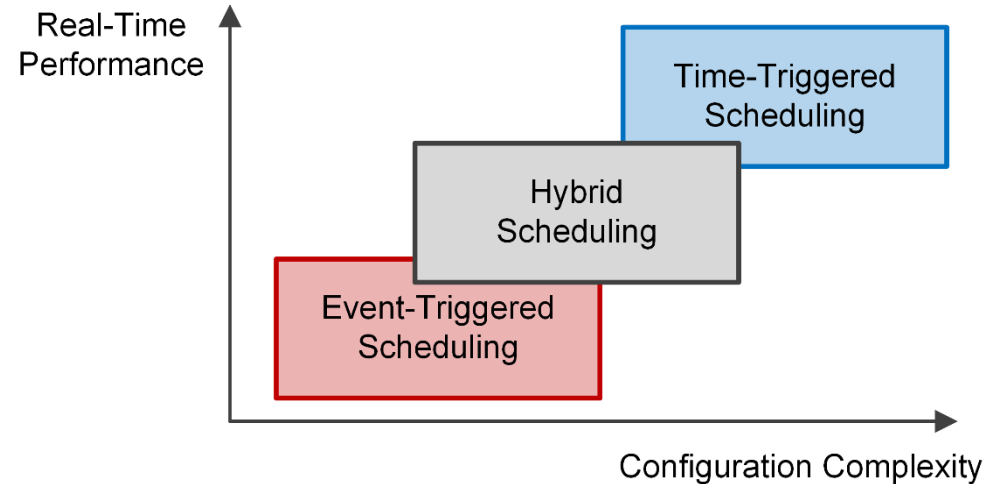
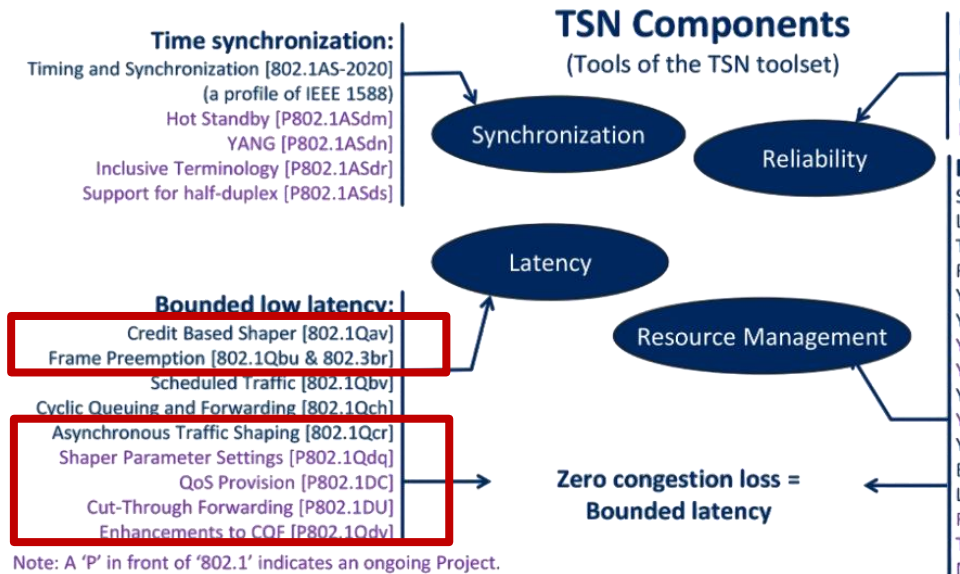
- Configuration goals: offsets, time slots, queue usage, etc.
- Configuration characteristic:
  - Real-Time Guarantees: at scheduling phase
  - Algorithm Complexity: high
  - Scope: periodic traffic flows
  - Global Clock Synchronization: yes



# Real-time performance of TSN networks

## Real-Time Guarantees for EVENT-Triggered (ET) Communication

- Configuration characteristic:
  - Real-Time Guarantees: dedicated performance analysis
  - Algorithm Complexity: low
  - Scope: periodic/sporadic traffic flows
  - Global Clock Synchronization: no



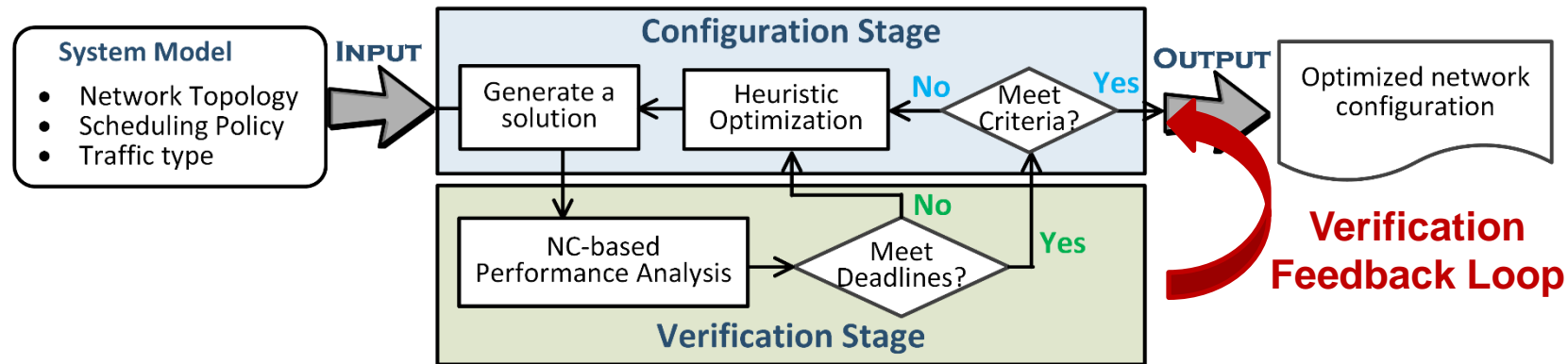
# Challenges of deadline-aware configuration in TSN

- Performance analysis methods:
  - event-triggered sub-protocols, hybrid TT and ET communication
  - network calculus, response timing analysis, ....

## Beyond Just Analyzing the Real-Time Performance of a Fully Configured System

- Design and configure a system to meet performance requirements

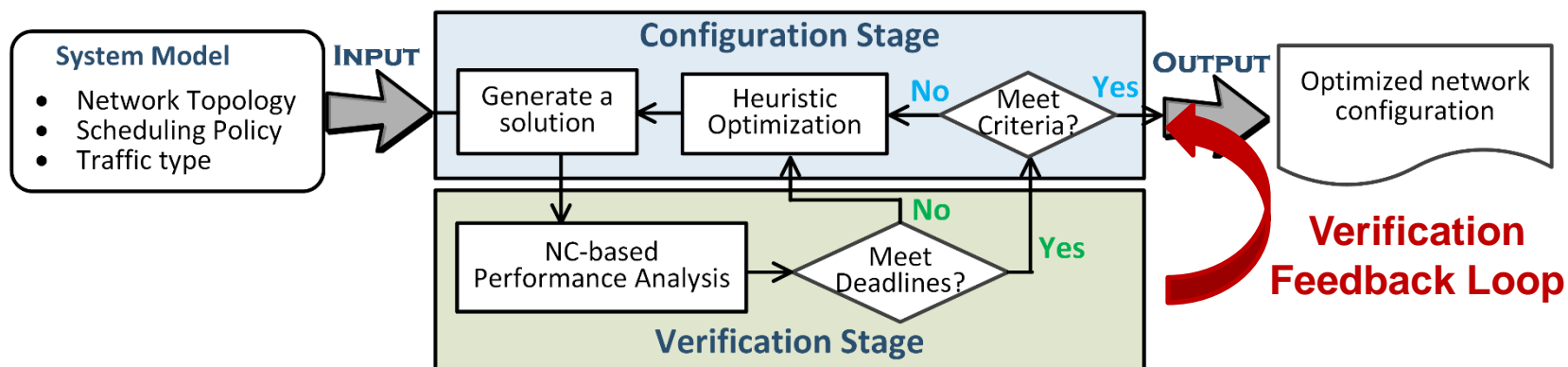
### Traditional Configuration Framework -- Post-Schedulability Verification



(a) Conventional framework based on ex-post verification

## Traditional Configuration Framework -- Post-Schedulability Verification

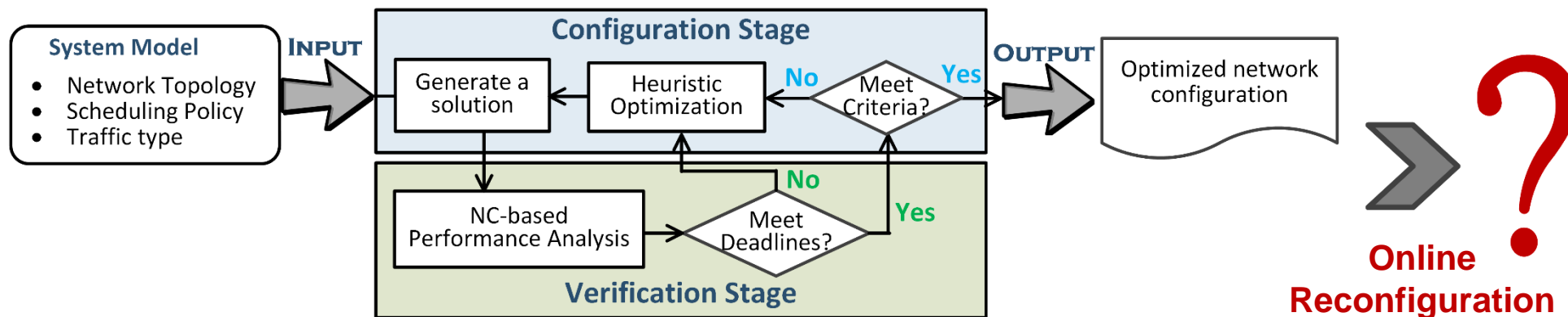
- Verification stage:
  - Takes only a few seconds per configuration
- Configuration stage:
  - Repeated real-time verification with each configuration change
  - Consumes over 90% overall configuration time



(a) Conventional framework based on ex-post verification

## What Comes Next? → Online Reconfiguration Scenario [1]

- Develop more efficient performance analysis framework to support network configuration
- Reduce verification overhead



(a) Conventional framework based on ex-post verification

[1] Boyer, M., and Henia, R. (2024). Industrial challenge: Embedded reconfiguration of TSN. *technical report*.

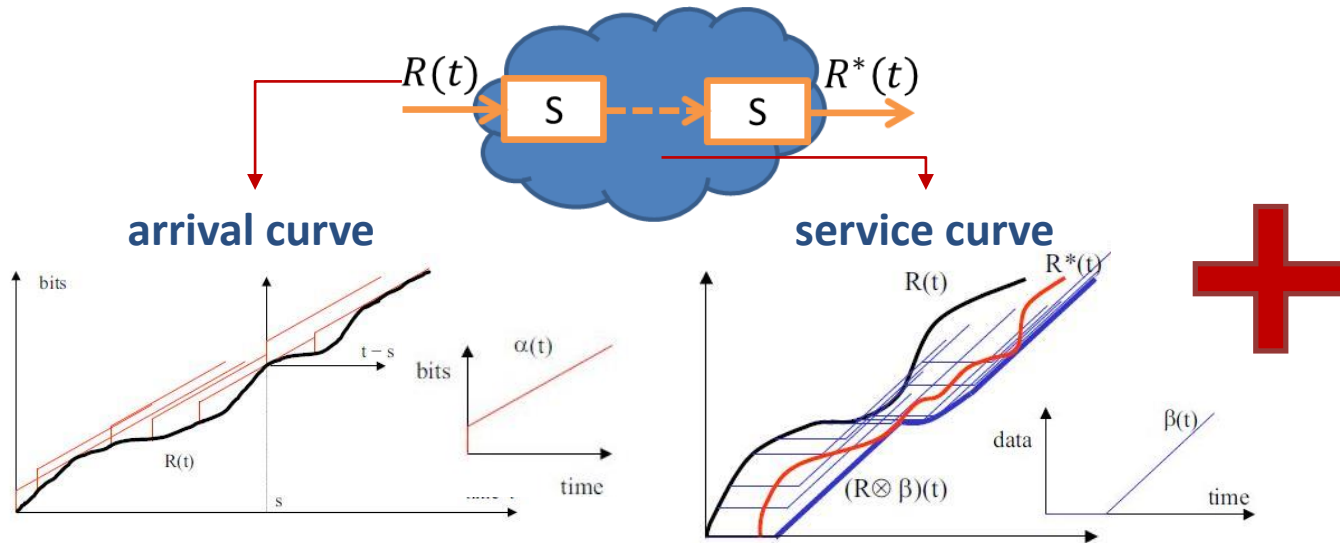


# Insights from Two Perspectives

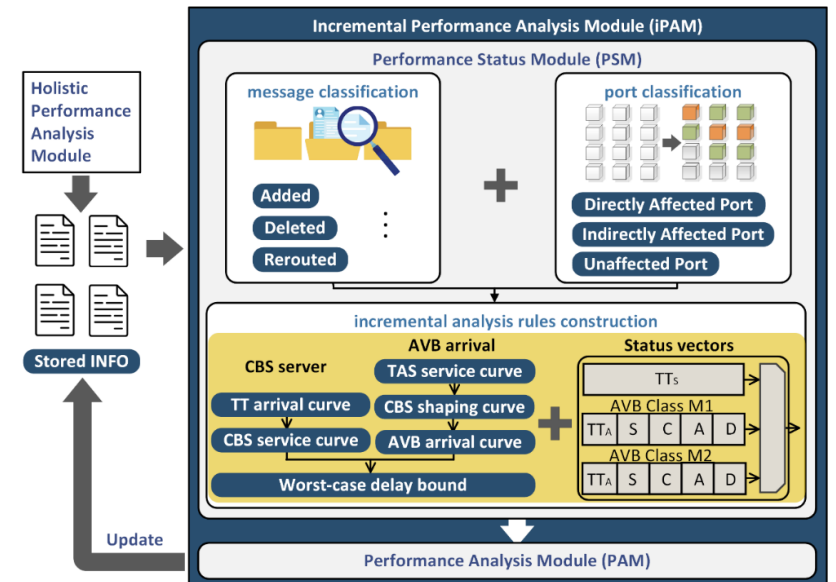
## (1) Incremental Performance Analysis [2]

- Principal idea
  - Analyze only the changed portions of the network
  - Avoid full re-analysis of entire network traffic every time

### Network Calculus Theory



### Incremental Analysis Rules

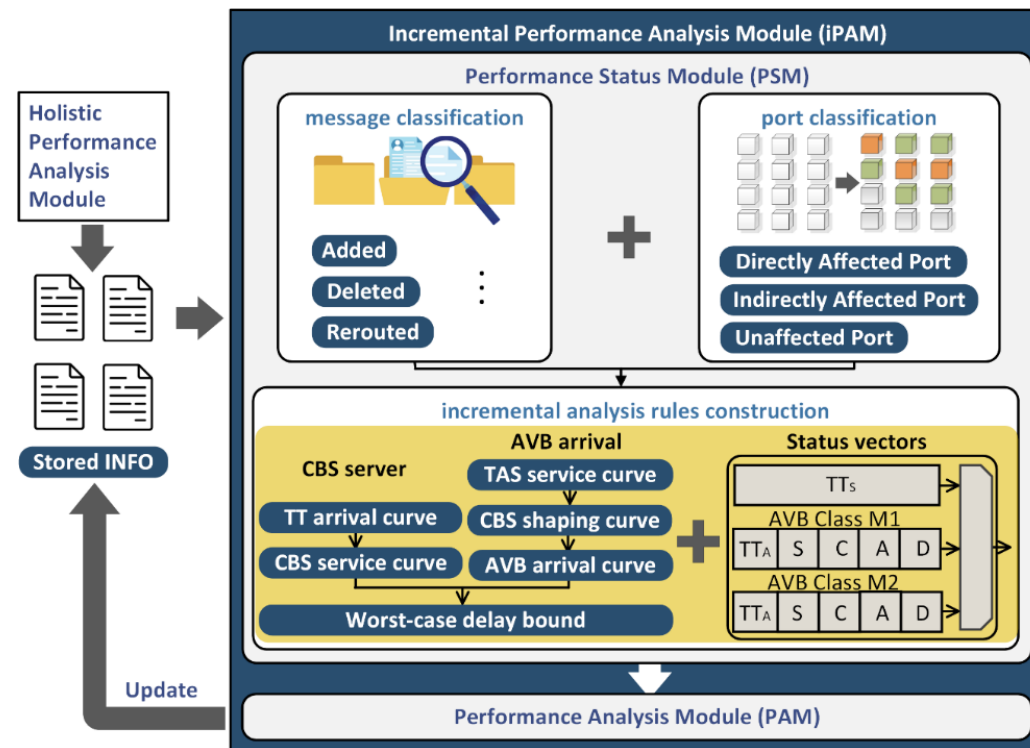


[2] Zhao, L., Zhang, X., He, F., et al. (2024). Incremental Performance Analysis for Accelerating Verification of TSN Network Reconfigurations. *IEEE Transactions on Network and Service Management*.

## Core Methods (TSN/TAS+CBS)

- Classify network node ports: directly affected, indirectly affected, unaffected
- Establish incremental rules to maximize reuse of existing analysis components
  - TT arrival curve
  - TAS service curve
  - AVB arrival curve
  - CBS service curve
  - CBS shaping curve
  - Delay bounds

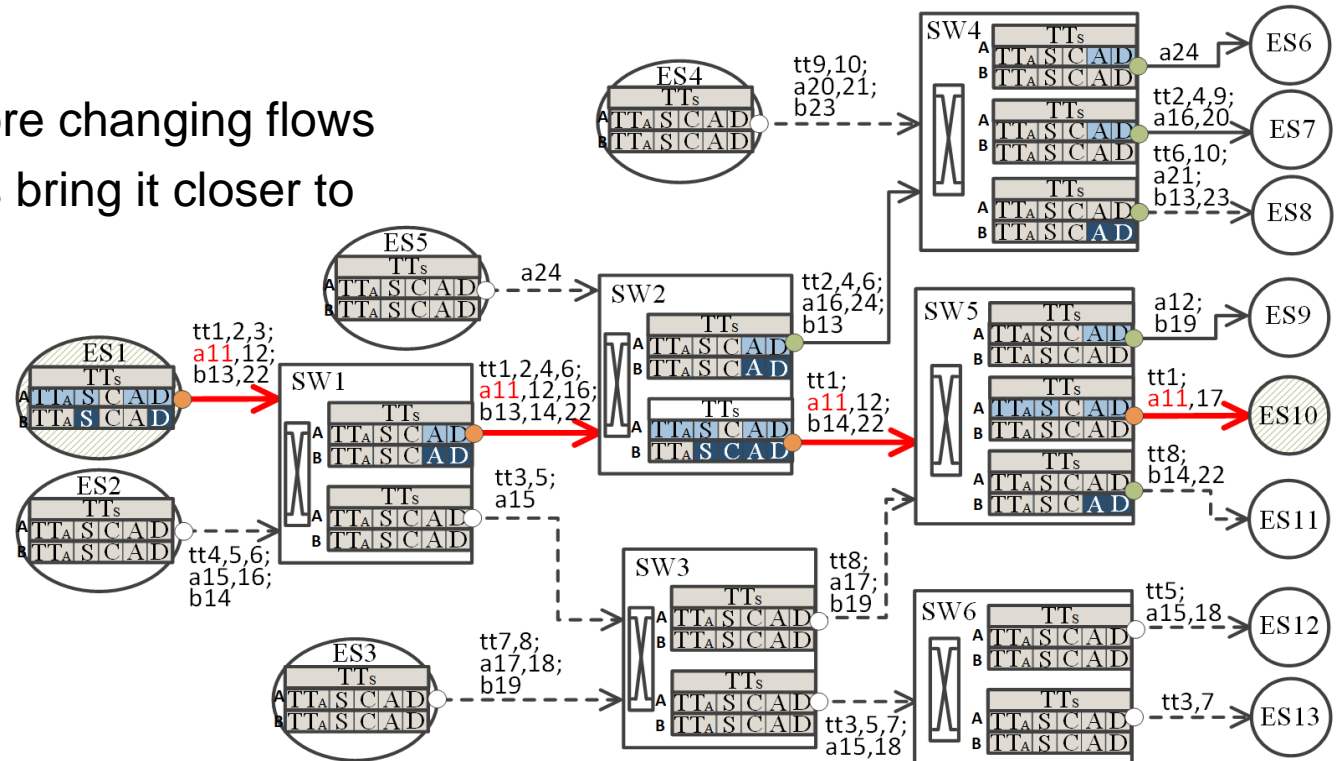
**Network Calculus  
Performance Model  
for TSN/TAS+CBS**



# Incremental Performance Analysis [2]

## Comparison with Traditional Performance Analysis

- Speed Improvement
  - 75% to 95% faster (simultaneous changing flows within 10%)
  - More effective with large-scale networks
- Limitations
  - Analysis time increases with more changing flows
  - More concurrent changing flows bring it closer to traditional performance analysis



# Incremental Performance Analysis [2]

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## Advantages

- Significant improvement when networks have small changes
- Just constructs incremental analysis rules on top of the traditional analysis model
- Easily extends to other TSN flow control sub-protocols

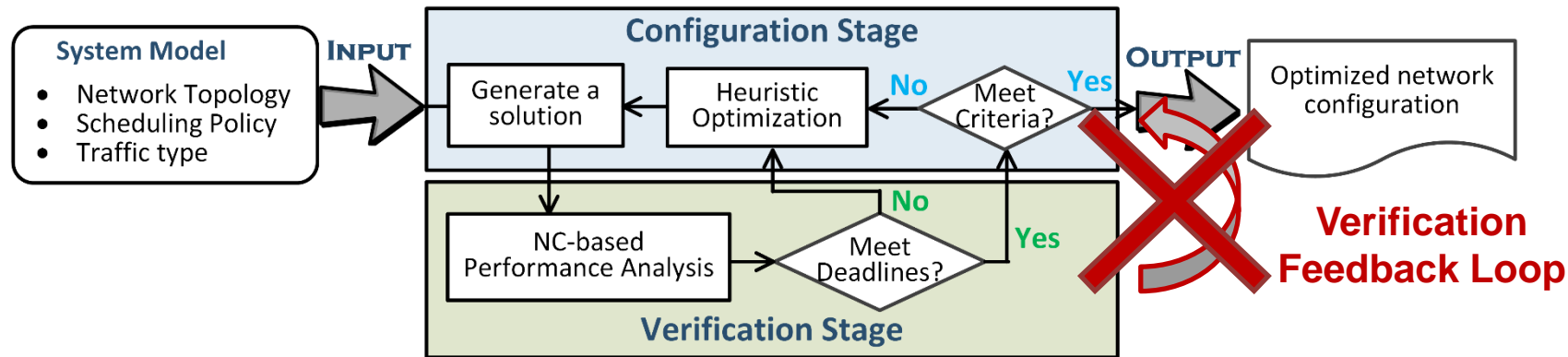
## Disadvantages

- Complexity can approach traditional analysis when there are large network changes
- Still relies on the real-time verification feedback loop

## (2) Performance-Driven Configuration Optimization [3] [4]

### ■ Principal idea

- Can we automatically ensure real-time performance while configuration optimization, like TT scheduling?
- Avoid the traditional real-time verification feedback loop



(a) Conventional framework based on ex-post verification

[3] Zhao, L., Yan, Y., & Zhou, X. (2023). Minimum Bandwidth Reservation for CBS in TSN With Real-Time QoS Guarantees. *IEEE Transactions on Industrial Informatics*.

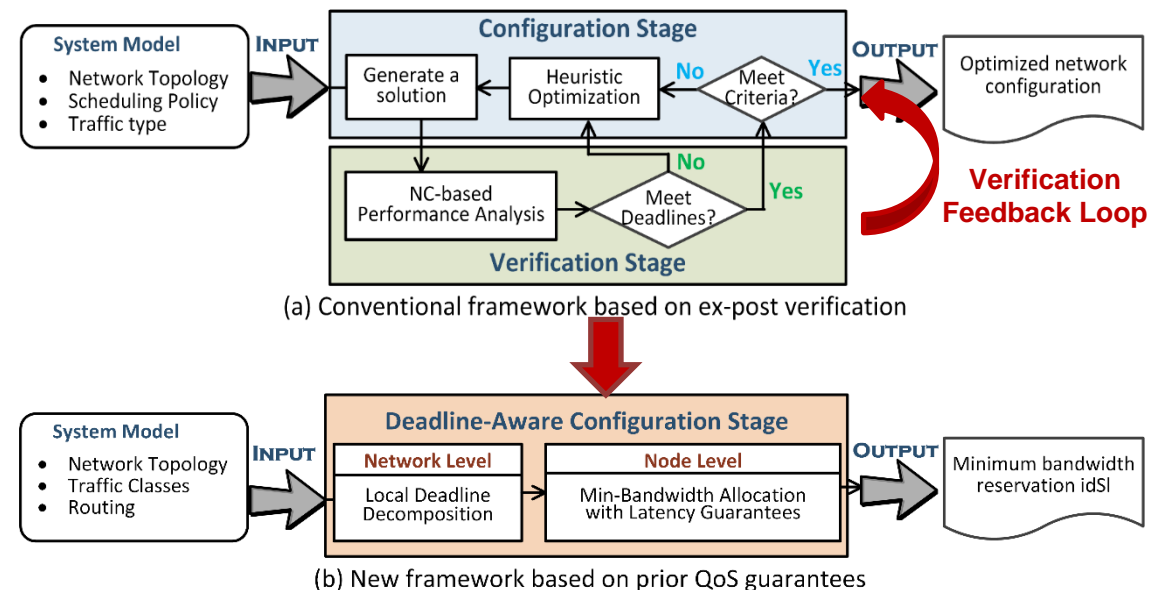
[4] Xie, A., He, F., & Zhao, L. (2024) Optimizing Quantum Assignment for DRR in TSN: A Network Calculus-Based Method. *IEEE Real-Time Systems Symposium (RTSS)*.

## ■ Problem Motivation

- CBS, DRR, TAS+CBS: optimize bandwidth to optimize residual bandwidth utilization while guarantees deadlines
- Over-allocation
  - ✓ Leads to resource waste
  - ✓ Decreases service quality for lower-priority
- Under-allocation
  - ✓ Risks missing deadlines for time-critical applications

## ■ Overall framework

- Network level
- Node level

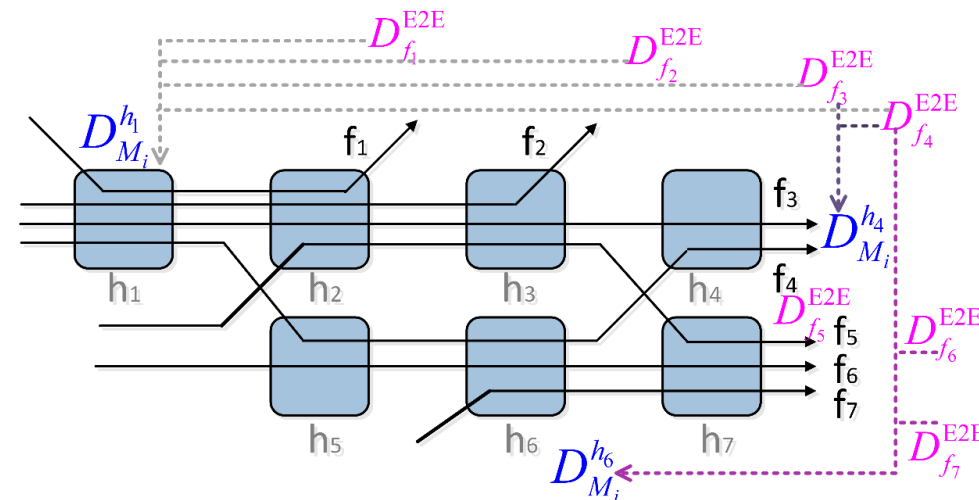


[3] Zhao, L., Yan, Y., & Zhou, X. (2023). Minimum Bandwidth Reservation for CBS in TSN With Real-Time QoS Guarantees. *IEEE Transactions on Industrial Informatics*.

[4] Xie, A., He, F., & Zhao, L. (2024) Optimizing Quantum Assignment for DRR in TSN: A Network Calculus-Based Method. *IEEE Real-Time Systems Symposium (RTSS)*.

## Network Level -- Deadline Decomposition Technique

- Problem
  - Upstream bandwidth changes impact downstream delays
  - Need to decouple traffic between nodes
- Solution
  - Decompose end-to-end deadlines into local deadlines at each node
  - Ensures end-to-end deadlines are met when all local deadlines are satisfied



[3] Zhao, L., Yan, Y., & Zhou, X. (2023). Minimum Bandwidth Reservation for CBS in TSN With Real-Time QoS Guarantees. *IEEE Transactions on Industrial Informatics*.

[4] Xie, A., He, F., & Zhao, L. (2024) Optimizing Quantum Assignment for DRR in TSN: A Network Calculus-Based Method. *IEEE Real-Time Systems Symposium (RTSS)*.

## Node Level – Optimize Configuration Parameters

- Coupled models
  - Integrate NC-based performance analysis model with bandwidth optimization problem
- Challenge
  - Derive closed-form or fast optimal solutions

**Objective function:** maximize residual bandwidth

**Decision variables:** idle slope  $idSl_i^h$

**Constraints:** deadline guarantees – NC-based CBS performance analysis model

$$\mathbb{P}: \max_{idSl_1^h, \dots, idSl_{N_{CBS}}^h > 0} \mu^h(idSl_1^h, \dots, idSl_{N_{CBS}}^h) = C - \sum_{i=1}^{N_{CBS}} idSl_i^h$$

$$\text{s.t. } \mathbb{C}_1 : D_i^h \geq hDev(\alpha_i^h, \beta_{i,CBS}^h), \quad \forall i \in [1, N_{CBS}]$$

$$\mathbb{C}_2 : idSl_i^h \geq \sum_{f \in \mathcal{F}_i^h} \rho_f, \quad \forall i \in [1, N_{CBS}]$$

**Scheduling Policy:** Credit-Based Shaping (CBS) [3]

**Objective function:** maximize residual bandwidth

**Decision variables:** quantum  $q_i^h, Q^h$

**Constraints:** deadline guarantees – NC-based DRR performance analysis model

$$\mathbb{P}: \max_{Q^h, q_1^h, \dots, q_{N_{cDRR}}^h > 0} \mu^h(Q^h, q_1^h, \dots, q_{N_{cDRR}}^h) = 1 - \sum_{i=1}^{N_{cDRR}} \frac{q_i^h}{Q^h} = 1 - \sum_{i=1}^{N_{cDRR}} \eta_i^h$$

$$\text{s.t. } \mathbb{C}_1 : D_i^h \geq hDev(\alpha_i^h, \beta_{i,DRR}^h), \quad \forall i \in [1, N_{cDRR}]$$

$$\mathbb{C}_2 : q_i^h \geq l_i^{h,max}, \quad \forall i \in [1, N_{cDRR}]$$

**Scheduling Policy:** Deficit Round Robin (DRR) [4]

[3] Zhao, L., Yan, Y., & Zhou, X. (2023). Minimum Bandwidth Reservation for CBS in TSN With Real-Time QoS Guarantees. *IEEE Transactions on Industrial Informatics*.

[4] Xie, A., He, F., & Zhao, L. (2024) Optimizing Quantum Assignment for DRR in TSN: A Network Calculus-Based Method. *IEEE Real-Time Systems Symposium (RTSS)*.



## Node Level – Optimize Configuration Parameters

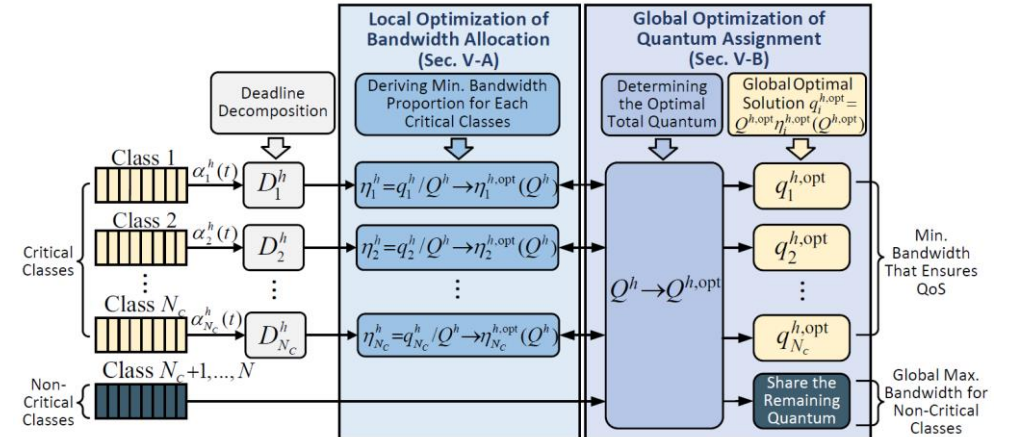
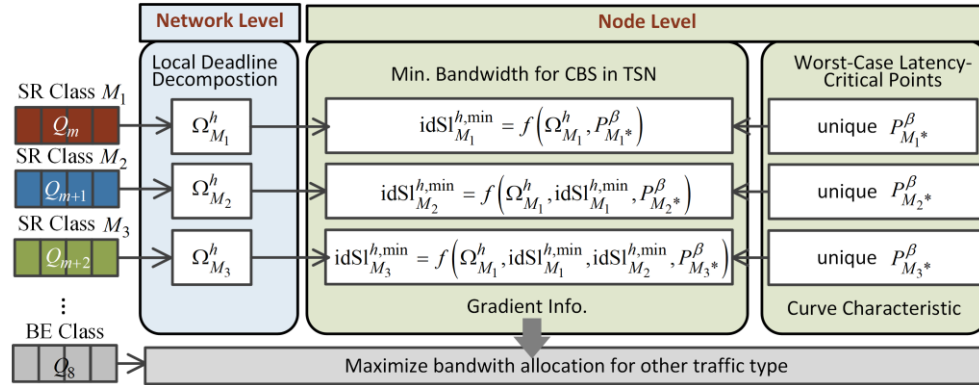
### ■ Closed-form solution

#### CBS Scheduler: [3]

- Established equation linking idle slope  $idSl_i^h$  to worst-case delay;
- By gradient information, derived closed-form expression for minimal bandwidth reservation  $idSl_i^h$  required to meet local deadlines;
- TAS+CBS hybrid architecture** - [under review]

#### DRR Scheduler: [4]

- Established equation linking quantum  $q_i^h$ ,  $Q^h$  to worst-case delay;
- Derived closed-form solution for local optimal bandwidth with fixed  $Q^h$ ;
- Used gradient ascent to find optimal total quantum  $Q^h$  for maximizing residual bandwidth;
- Formally proved gradient ascent avoids local optima



[3] Zhao, L., Yan, Y., & Zhou, X. (2023). Minimum Bandwidth Reservation for CBS in TSN With Real-Time QoS Guarantees. *IEEE Transactions on Industrial Informatics*.

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## Comparison with Default idSI (75%) -- CBS

- Bandwidth Savings
  - Saves an average of 91.1% and up to 99.0% compared to default idSI (e.g., 75%)
- Correctness Validation
  - NC-based analysis confirms that all flows meet deadline requirements configured with optimized bandwidth
- Runtime Efficiency
  - Configuring optimal bandwidth reservations for all traffic classes across all ports takes just seconds

TABLE II  
VALIDITY OF OUR PROPOSED APPROACH IDSLMIN/NC

SR Class	Port	idSI <sub>Min/NC</sub>	idSI <sub>Min/Std</sub>	idSI/Default
Class $M_1$	[ES1,SW1]	12.77%	4%	$M_1+M_2=75%$
	[ES2,SW1]	4.94%	1.6%	
	[ES3,SW1]	2.47%	0.8%	
	[SW1,ES4]	9.84%	3.2%	
	[SW1,ES5]	9.56%	3.2%	
Class $M_2$	[ES1,SW1]	7.93%	1.6%	
	[ES2,SW1]	0.72%	0.16%	
	[ES3,SW1]	5.11%	1.12%	
	[SW1,ES4]	8.74%	1.92%	
	[SW1,ES5]	4.42%	0.96%	
Average SR Class		13.3%	3.72%	75%

TABLE III  
CORRECTNESS OF OUR PROPOSED APPROACH IDSLMIN/NC

SR Class	Flow	WCD ( $\mu s$ ) idSI <sub>Min/NC</sub>	WCD ( $\mu s$ ) idSI <sub>Min/Std</sub>	WCD ( $\mu s$ ) idSI/Default	Deadline
Class $M_1$	f1	533.8	2038	129.8	1000
	f2	443.1	1740	106.1	500
	f3	499.8	1930	89.8	500
	f4	669.8	2438	97.8	1000
Class $M_2$	f5	1640.1	9316.4	122.8	5000
	f6	666.4	3882.5	221.3	1000
	f7	925.3	5017.3	245.3	5000
	f8	998.4	6459.2	186.8	1000

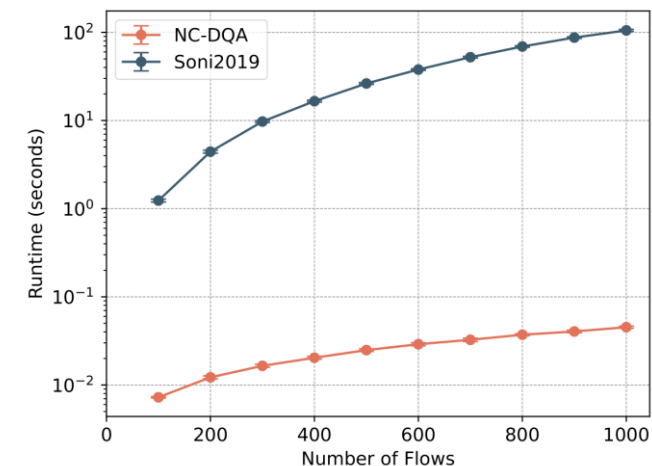
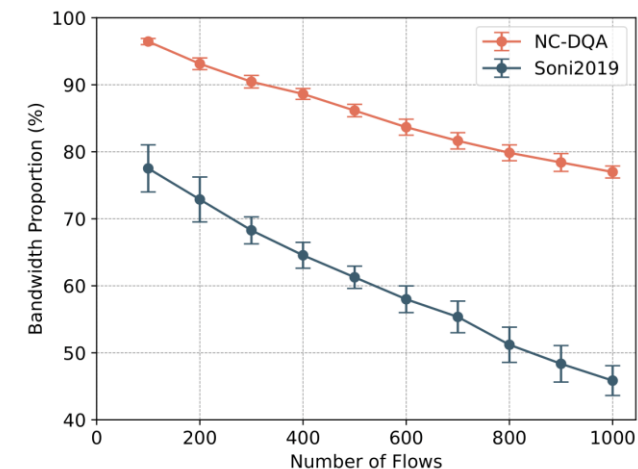
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## Comparison with Traditional Optimization -- DRR

- Bandwidth Efficiency
  - Saves over 85% residual bandwidth.
  - Traditional schedulability feedback-based method: Saves around 60% residual bandwidth.
- Runtime Improvement
  - At least 2-3 orders of magnitude faster

Improvements in both Objective Performance and Optimization Speed !



[3] Zhao, L., Yan, Y., & Zhou, X. (2023). Minimum Bandwidth Reservation for CBS in TSN With Real-Time QoS Guarantees. *IEEE Transactions on Industrial Informatics*.

[4] Xie, A., He, F., & Zhao, L. (2024) Optimizing Quantum Assignment for DRR in TSN: A Network Calculus-Based Method. *IEEE Real-Time Systems Symposium (RTSS)*.

## Advantages

- Ensures QoS during optimization
- Removes real-time verification feedback-loop

## Disadvantages

- Requires specific coupling models for different schedulers and optimization objectives
- Identifying suitable optimization methods can be challenging

[3] Zhao, L., Yan, Y., & Zhou, X. (2023). Minimum Bandwidth Reservation for CBS in TSN With Real-Time QoS Guarantees. *IEEE Transactions on Industrial Informatics*.

[4] Xie, A., He, F., & Zhao, L. (2024) Optimizing Quantum Assignment for DRR in TSN: A Network Calculus-Based Method. *IEEE Real-Time Systems Symposium (RTSS)*.

- [1] M. Boyer, and R. Henia, “Industrial challenge: Embedded reconfiguration of TSN.” technical report, 2024.
- [2] L. Zhao, X. Zhang, F. He, et al., “Incremental Performance Analysis for Accelerating Verification of TSN Network Reconfigurations.” *IEEE Transactions on Network and Service Management*, early access, 2024.
- [3] L. Zhao, Y. Yan, and X. Zhou, "Minimum Bandwidth Reservation for CBS in TSN With Real-Time QoS Guarantees." *IEEE Transactions on Industrial Informatics*, 20(4), 2023.
- [4] A. Xie, F. He, and L. Zhao, “Optimizing Quantum Assignment for DRR in TSN: A Network Calculus-Based Method.” *IEEE Real-Time Systems Symposium (RTSS)*, accepted, 2024.



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Happy to answer questions 😊  
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