

# Reliable Dynamic Packet Scheduling over Lossy Real-Time Wireless Networks

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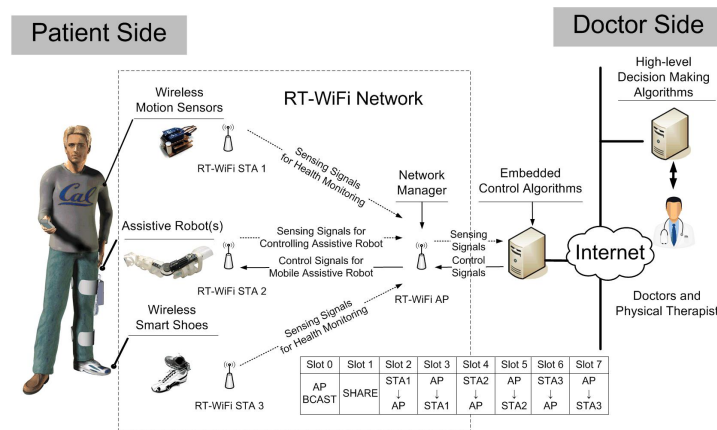
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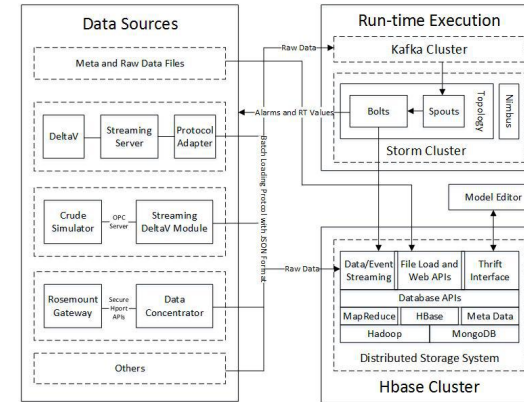
<sup>3</sup> University of Notre Dame, US

<sup>4</sup> Northeastern University, China

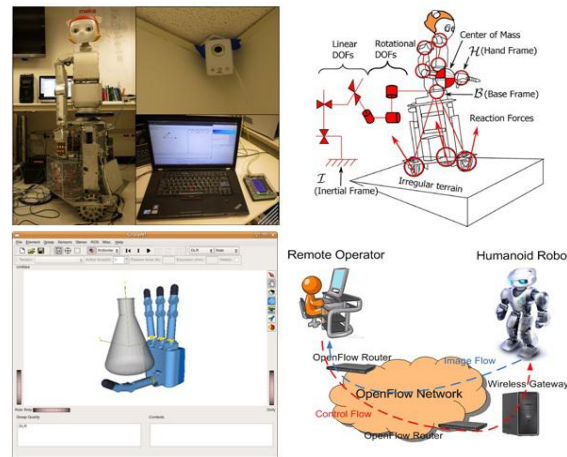
# Real-Time Wireless Networks (RTWNs)



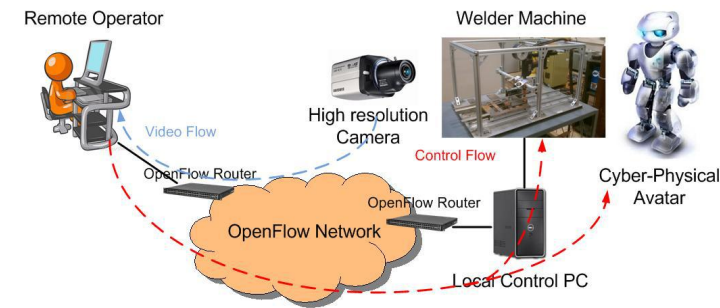
**Network-based Rehabilitation System**



**Real-Time Analytics Platform for Process Control**

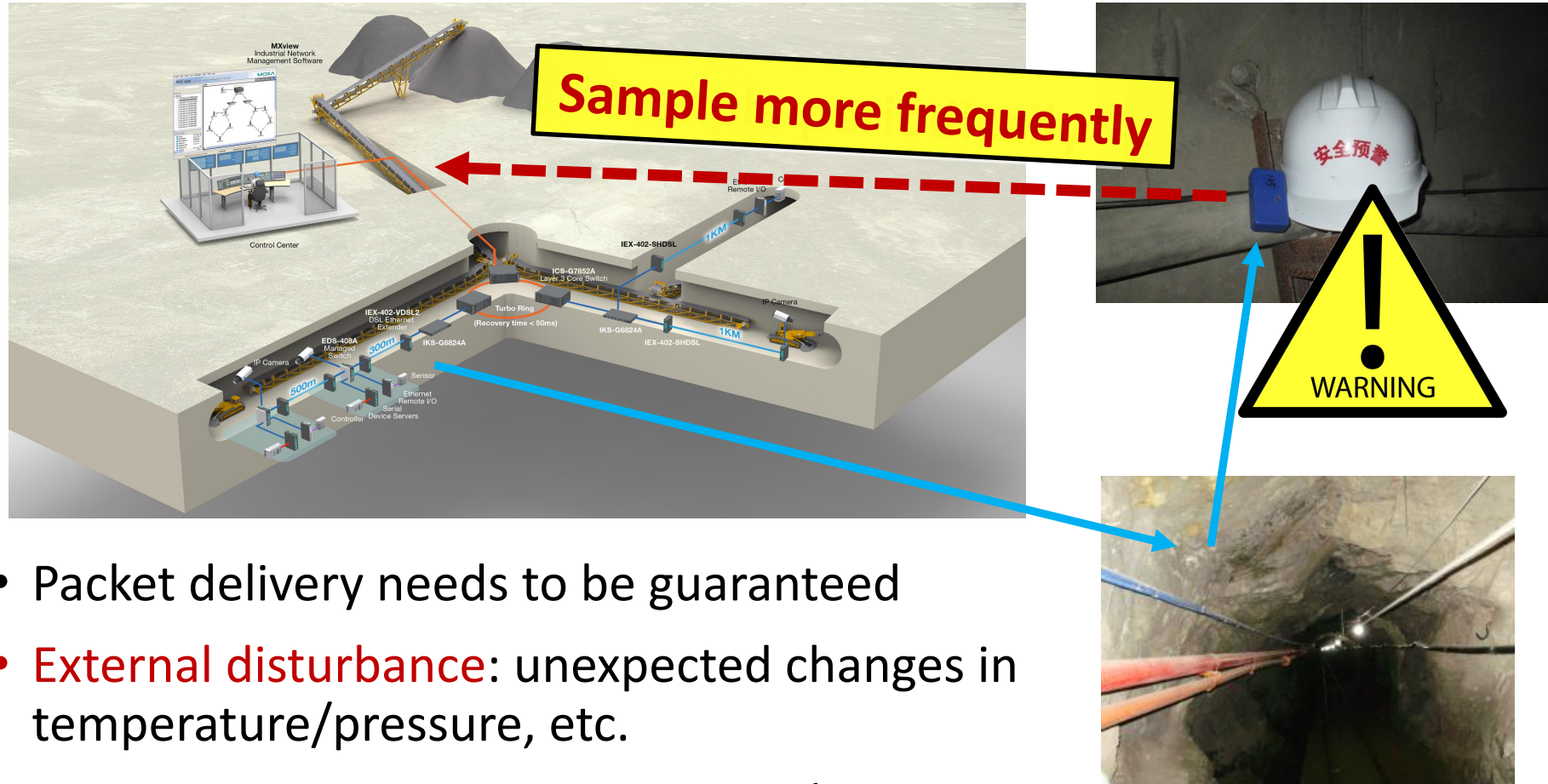


**Cyber-physical Avatar**



**Remote and Real-time Welding System**

# An Example: Mining Monitoring System



- Packet delivery needs to be guaranteed
- **External disturbance**: unexpected changes in temperature/pressure, etc.
- Require more frequent monitoring/response

# Problem and Challenges

- Requirements of a RTWN:
  - Environment data must be collected **timely**
  - Guaranteed data **freshness** and **delivery**
- QoS: how well it satisfies real-time deadlines and delivers packet
  - Packet scheduling is critical
- Challenges:
  - Lossy wireless link
  - External disturbances occur unexpectedly

# What We Want to Achieve?

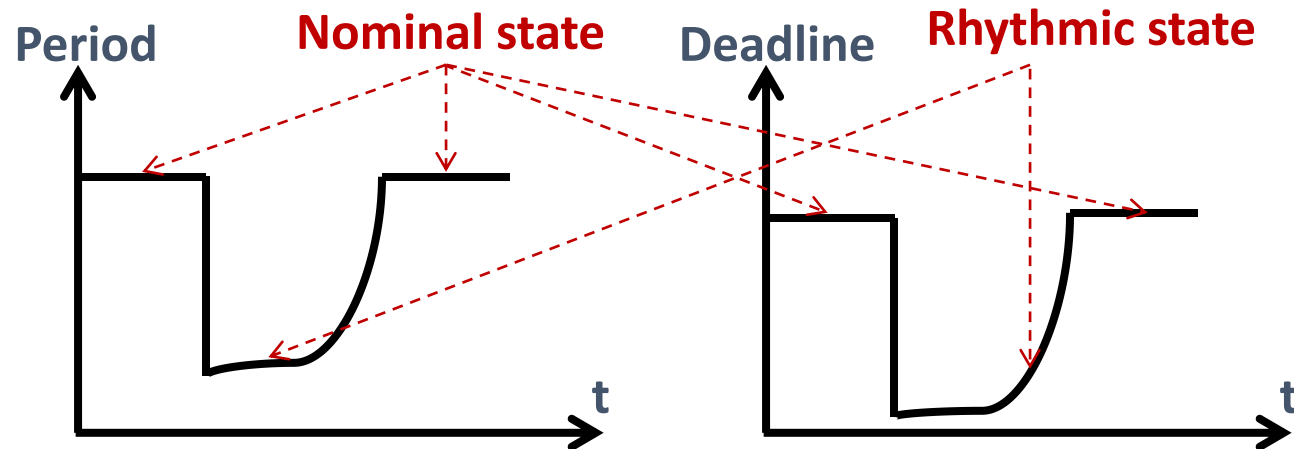
- Design a reliable on-line dynamic scheduling framework
- During nominal operation:
  - Determine a reliable static schedule
  - Each packet can be reliably delivered before its deadline
- Upon detecting a disturbance
  - Generate and distribute a temporary dynamic schedule
  - Deadlines and delivery of critical tasks are guaranteed
  - Minimize the impact to the rest of the tasks

# Outline

- Motivation
- **System Model**
- Reliable Real-Time Dynamic Packet Scheduling
- Experimental Evaluation
- Conclusion

# Rhythmic Task Model

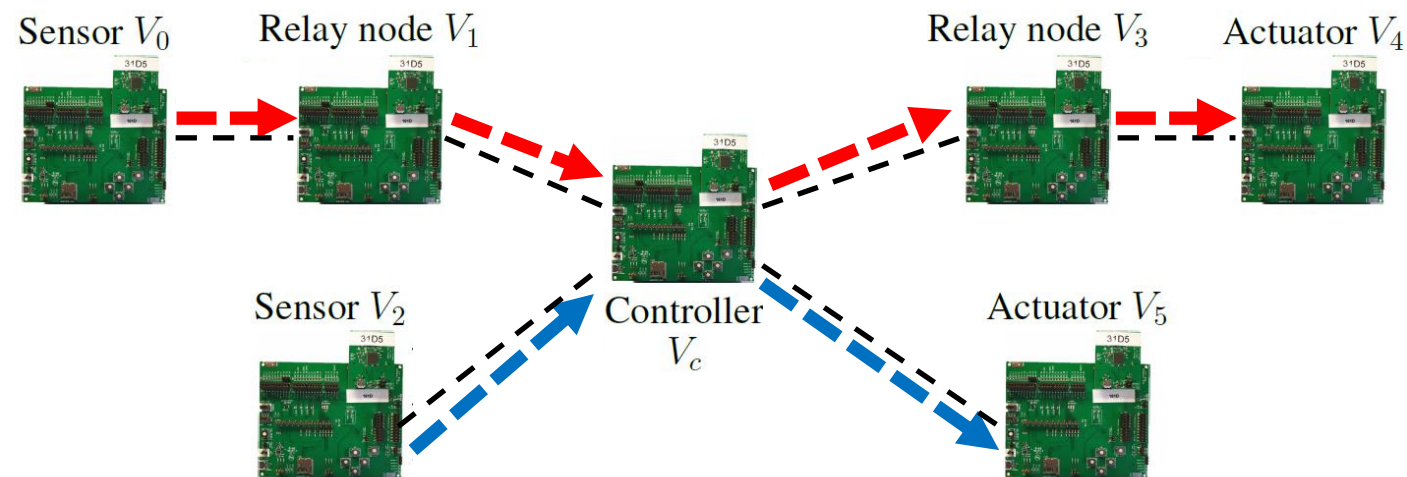
- When nothing happens
  - All tasks follow regular periods
- When disturbance occurs
  - The corresponding task follows a specific release pattern



In general, any given pattern can be used in the rhythmic state

# System Model

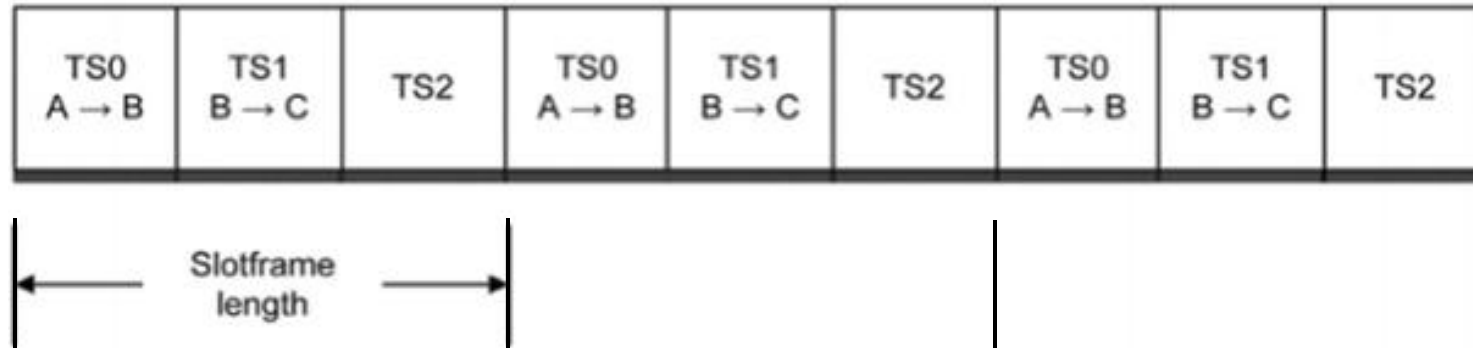
- Real-Time Wireless Network (RTWN) infrastructure
  - A controller, sensors, relay nodes and actuators sharing a channel
  - Nodes have computing capability
  - Link reliability is measured as link packet delivery ratio (PDR)
- Task model
  - Broadcast task and unicast tasks (periodic and rhythmic) release infinite **packets**
  - Each packet involves multiple **transmissions**, from a sensor to an actuator



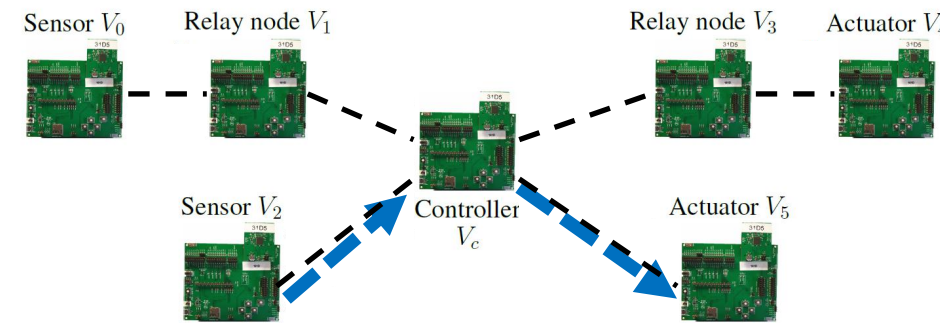


# System Model: Communication Model

- Time-Division Multiple Access (TDMA) network
- Time slot (TS), slot
- Slotframe



# Scheduling Model



- Transmission-based Scheduling (TBS)

- A time slot is assigned to a transmission of a packet from a task
- Sender and receiver(s) of the transmission will operate their RF modules

Slot 1	Slot 2	Slot 3	Slot 4
(1, 1)	(1, 1)	(1, 2)	(1, 2)

← Assign 2 retries for each transmission  
(x, y) mean the y-th transmission of the packet from task x.

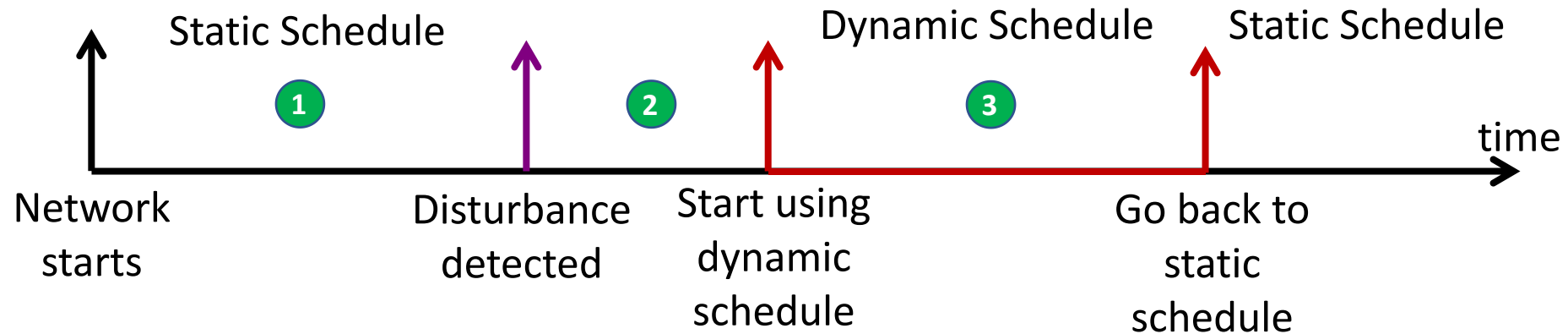
- Packet-based Scheduling (PBS)

- A time slot is assigned to a packet of a task
- Involved nodes decide radio operation (TX, RX, idle) at runtime

Slot 1	Slot 2	Slot 3	Slot 4
(1)	(1)	(1)	(1)

← Assign 4 time slots for this packet

# Problem Overview

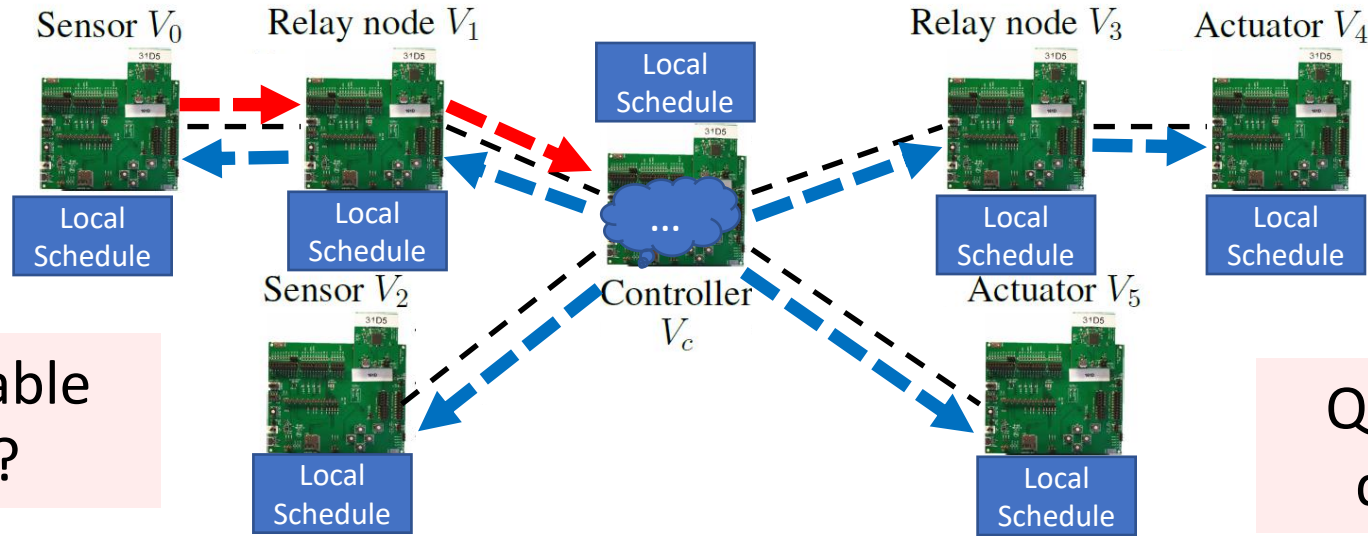


- No disturbance
  - 1 Determine a reliable static schedule.
- Upon detection of a disturbance, determine a dynamic schedule
  - 2 Collect disturbance information and distribute dynamic schedule.
  - 3 All rhythmic packets meet their deadlines and are reliable.  
Delivery of the periodic packets may be degraded

# Outline

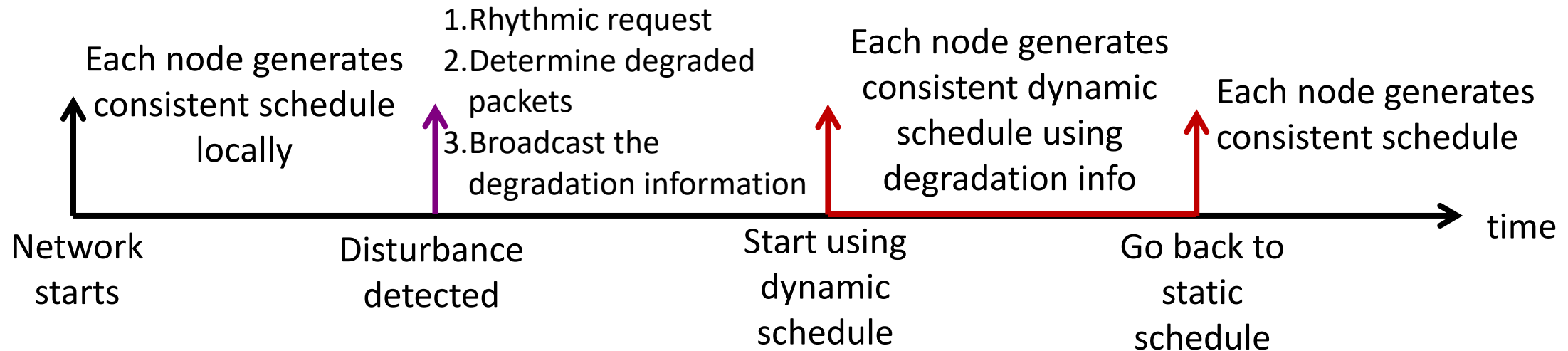
- Motivation
- System Model
  - Transmission-Based Scheduling (TBS)
  - Packet-Based Scheduling (PBS)
- **Reliable Real-Time Dynamic Packet Scheduling (RD-PaS)**
- Experimental Evaluation
- Conclusion

# RD-PaS Overview



Q1. What is a reliable static schedule?

Q2. What is a desired dynamic schedule?



# Reliable Static Schedule

- Problem: Given link PDR ( $\lambda^L$ ), task set  $T$ , determine the static schedule such that:
  - Reliability Constraint: All packets are scheduled such that end-to-end PDR ( $\lambda$ ) meets the required reliability  $\lambda^R$ .
  - Timing Constraint: All packets are scheduled before their deadlines.

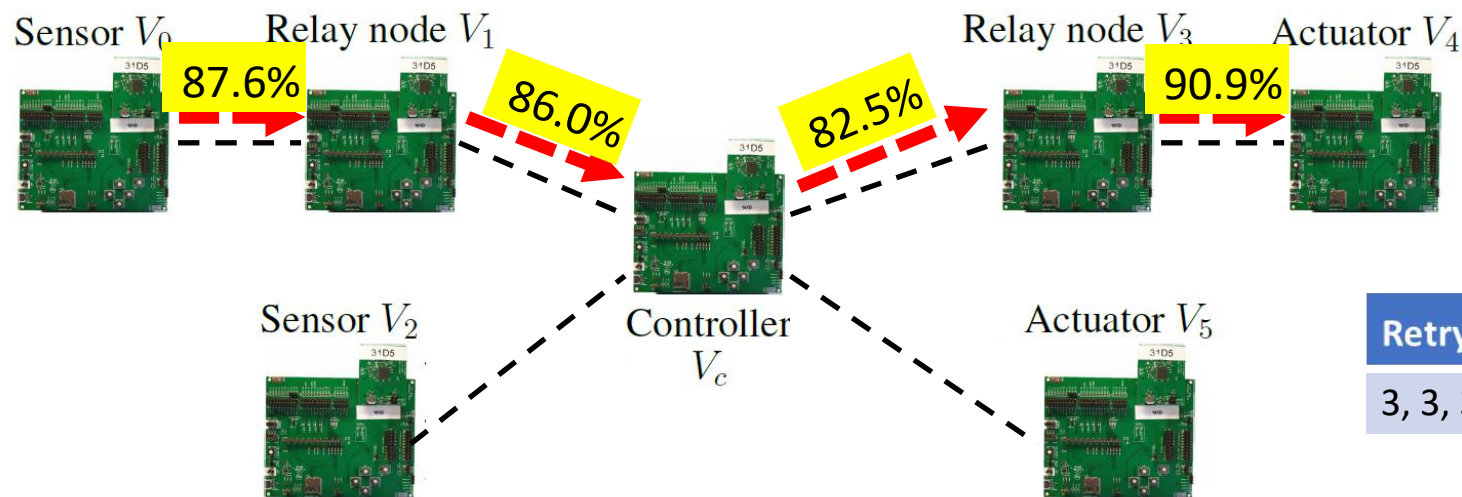
# Reliable Static Schedule: Methodology

- Solve reliability constraint for each packet
  - How many retransmission slots are needed?
- Solve timing constraint
  - How to schedule these slots?

# Reliable Static Schedule: reliability (TBS)

- Problem statement: Given the transmissions of a packet, and their link PDR ( $\lambda^L$ ), find out a **retry vector** ( $\vec{R}$ ) such that:
  - Total number of time slots ( $w$ ) is minimized
  - Packet PDR ( $\lambda$ ) achieves required reliability ( $\lambda^R$ )

$$\lambda = \prod_l 1 - (1 - \lambda_l^L)^{R[l]}$$



Retry vector ( $\vec{R}$ )	End-to-end PDR ( $\lambda$ )	Number of slots ( $w$ )
3, 3, 3, 3	0.989	12



# Proposed solution: PDR table

- Start from  $\vec{R} = [1,1,1,1]$
- Each time add 1 retry with maximum gain
- Stops when required PDR is reached (99%)
- Proved optimal
- Only last result is needed in static schedule

Number of slots ( $w$ )	End-to-end PDR ( $\lambda$ )	Retry vector ( $\vec{R}$ )
4	0.565	1, 1, 1, 1
5	0.664	1, 1, 2, 1
6	0.757	1, 2, 2, 1
7	0.851	2, 2, 2, 1
8	0.928	2, 2, 2, 2
9	0.952	2, 2, 3, 2
10	0.969	2, 3, 3, 2
11	0.982	3, 3, 3, 2
12	0.989	3, 3, 3, 3
13	0.994	3, 3, 4, 3

$w^+$

$\vec{R}^*$

# Reliable Static Schedule: timing

- Map to single CPU scheduling problem
- Each packet has release time and deadline
- $w^+$  -> Worst Case Execution Time (WCET), for each packet
- Earliest Deadline First (EDF) can give optimal schedule
- Packet transmission (execution) follows retry vector

Slot 1	Slot 2	Slot 3	Slot 4	Slot 5	Slot 6	Slot 7	Slot 8
Task 1	Task 1	Task 1	Task 2	Task 2	Task 1	Task 1	

# Rhythmic event: dynamic scheduling

- Check all packets are still schedulable
- If not schedulable, then packet degradation is needed

Number of slots	End-to-end PDR	Retry vector
4	0.565	1, 1, 1, 1
5	0.664	1, 1, 2, 1
6	0.757	1, 2, 2, 1
7	0.851	2, 2, 2, 1
8	0.928	2, 2, 2, 2
9	0.952	2, 2, 3, 2
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# Reliable Dynamic Schedule

- Problem statement: Given the packet set,  $\Gamma$ , determine  $w$  for each packet such that:
  - All **rhythmic** packets satisfy required reliability  $\lambda^R$
  - **Degradation information does not exceed broadcast payload**
  - **Total end-to-end PDR degradation is minimized**

$$\forall \chi \in \Gamma, \min \sum \max\{0, \lambda^R - \lambda_\chi\}$$

NP-Hard

# Proposed heuristic:

- Assign **basic** number of slots to each periodic packet.
- If not schedulable, drop smallest number of packets (a solved problem in literature).
- If schedulable, add slots to the packet that leads to best degradation improvement.

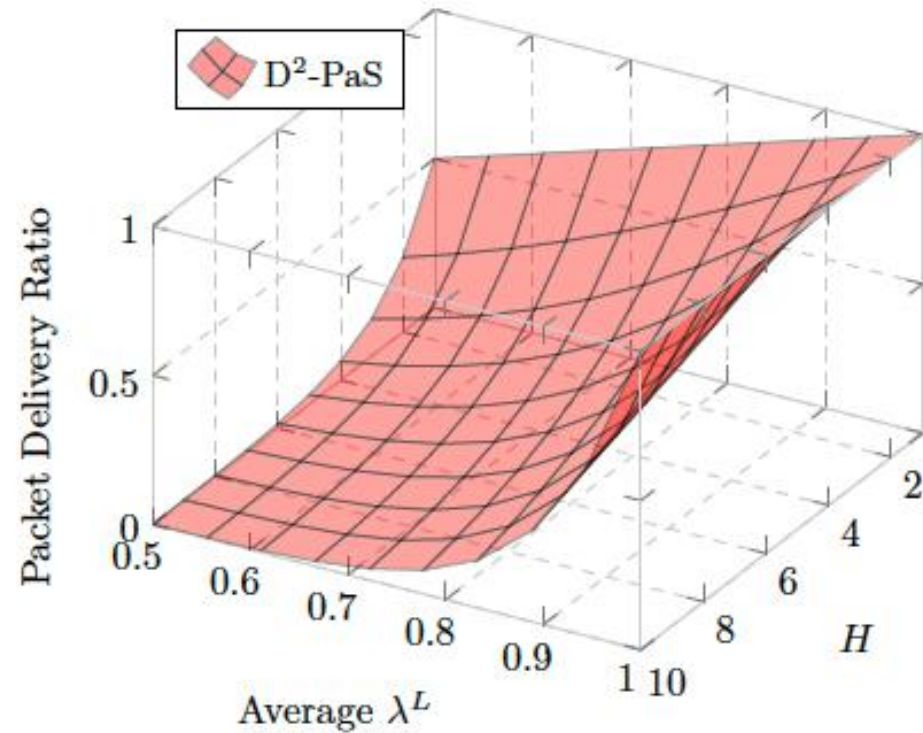
	Number of slots	End-to-end PDR	Retry vector
Degradation ↓	4	0.565	1, 1, 1, 1
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	7	0.851	2, 2, 2, 1
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Reliable →

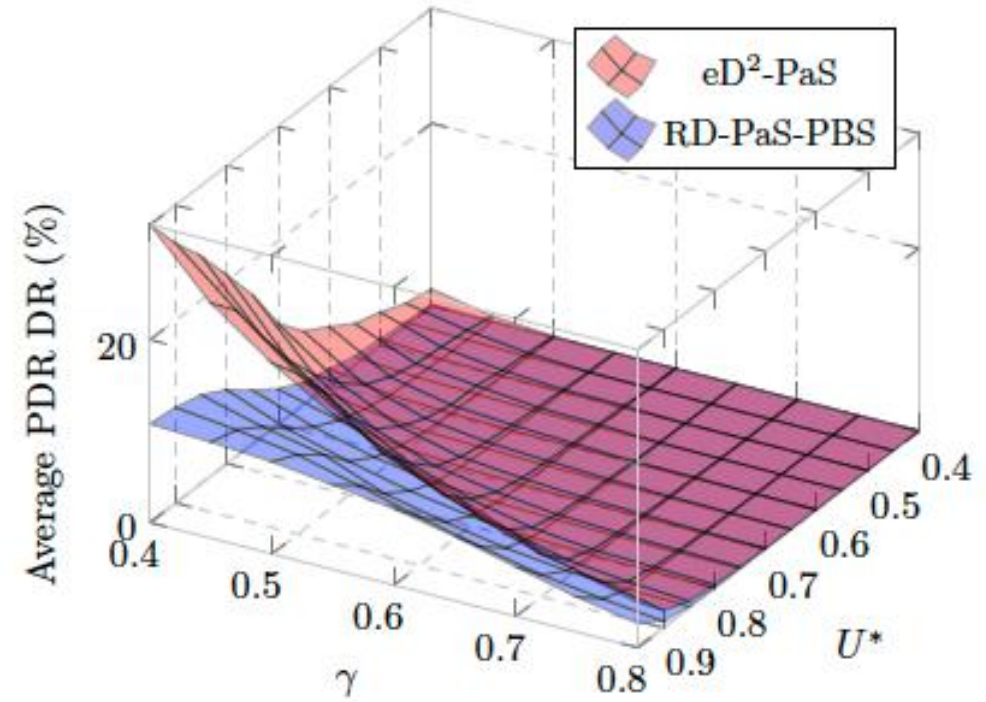
# Outline

- Motivation
- System Model
  - Transmission-Based Scheduling (TBS)
  - Packet-Based Scheduling (PBS)
- Reliable Real-Time Dynamic Packet Scheduling
  - Reliable Static Schedule
  - Reliable Dynamic Schedule
- **Experimental Evaluation**
  - **Simulation**
  - **Testbed**
- Conclusion

# Simulation Evaluation



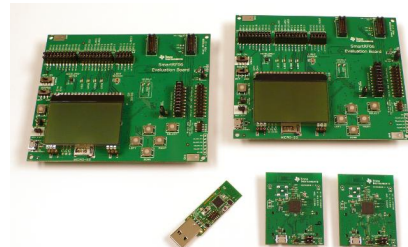
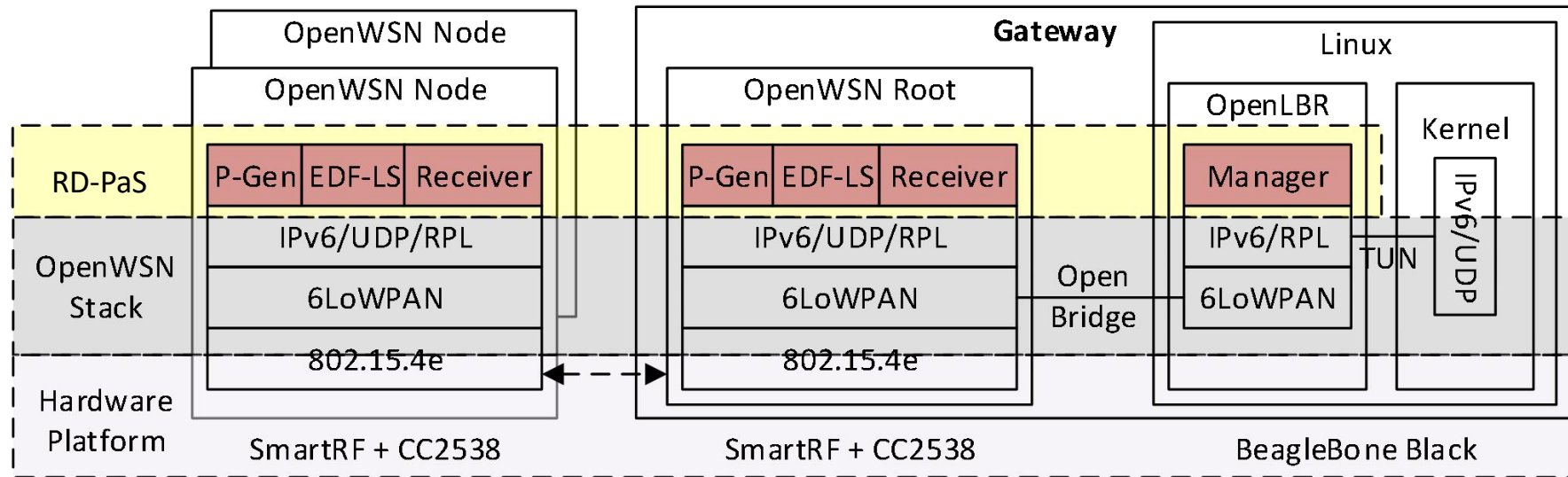
■ **Figure 6** PDR in traditional RTWN scheduling



■ **Figure 9** Comparison of the PDR degradation rate.

# Testbed

- Use TI CC2538 EMKs to form a mesh network
- Implement RD-PaS on an OpenWSN testbed
- Dynamic schedule generation in the application layer

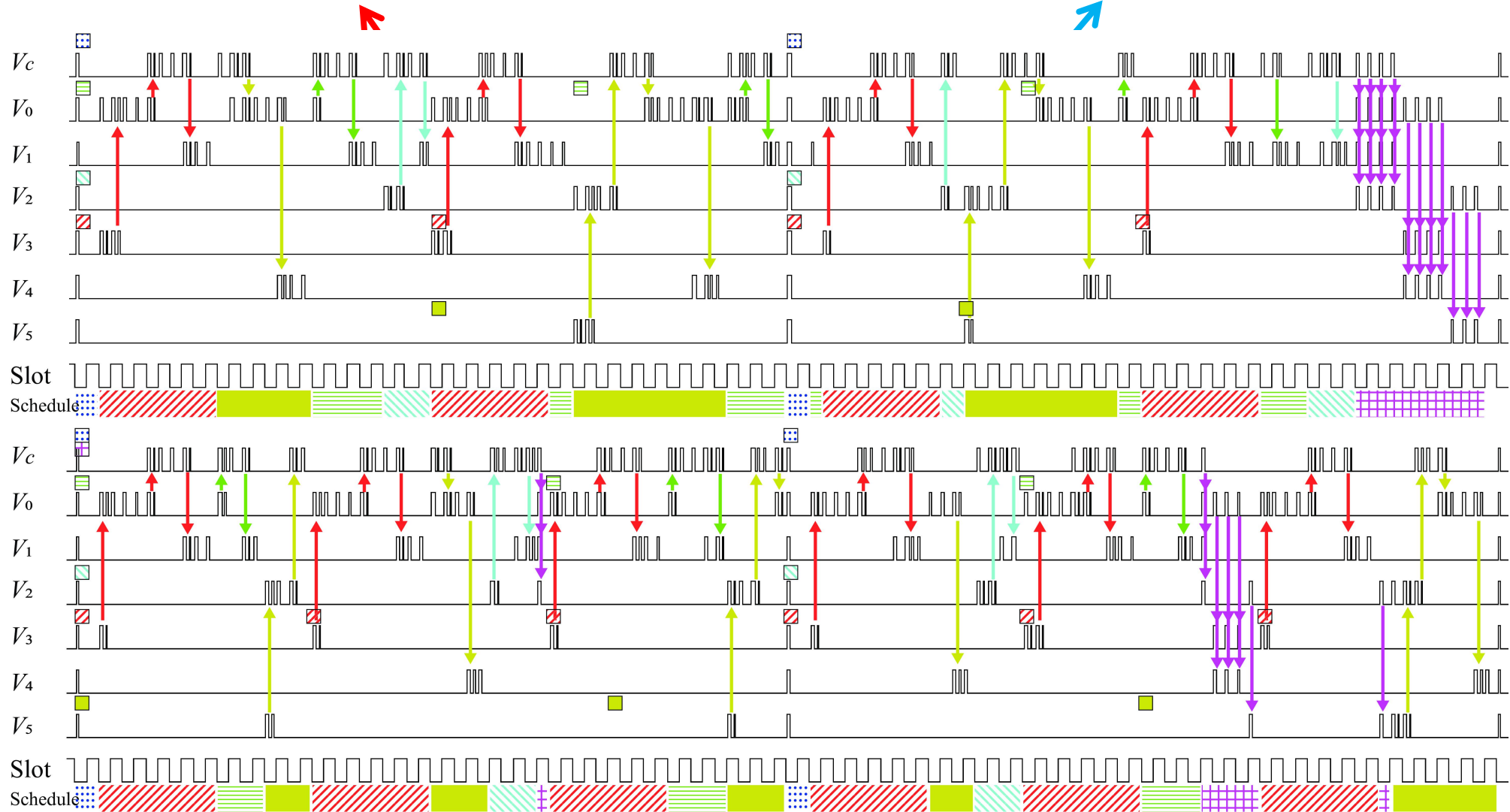




# Testbed-Based Experiment

7 CC2538 wireless devices

Logic analyzer



# Conclusion:

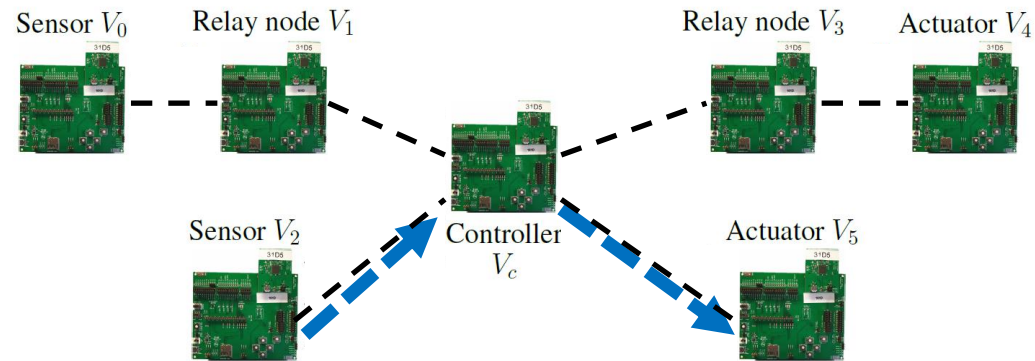
- RD-PaS solves reliable online static and dynamic scheduling problem considering each individual sensing packet.
  - It computes a reliable static schedule in nominal mode
  - It computes a dynamic schedule to compensate the new traffic and minimize the impact in rhythmic mode
- We studied the performance of RD-PaS
- We also implement RD-PaS in an OpenWSN testbed to validate the correctness

# Thanks

Questions?

# Packet-based Scheduling (PBS)

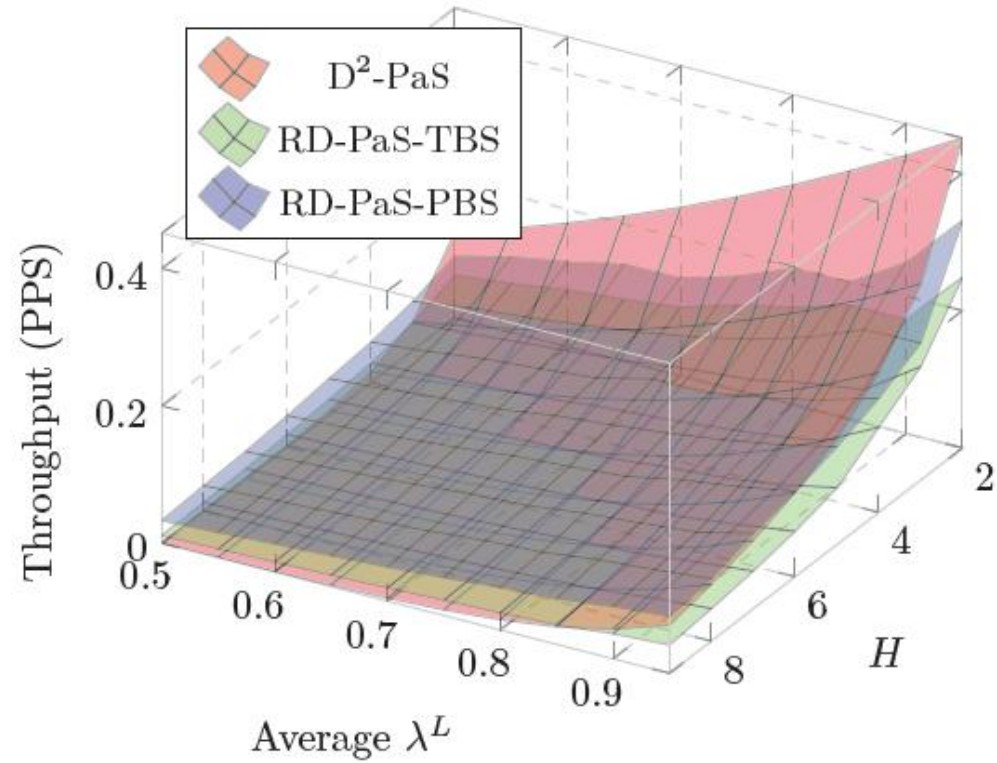
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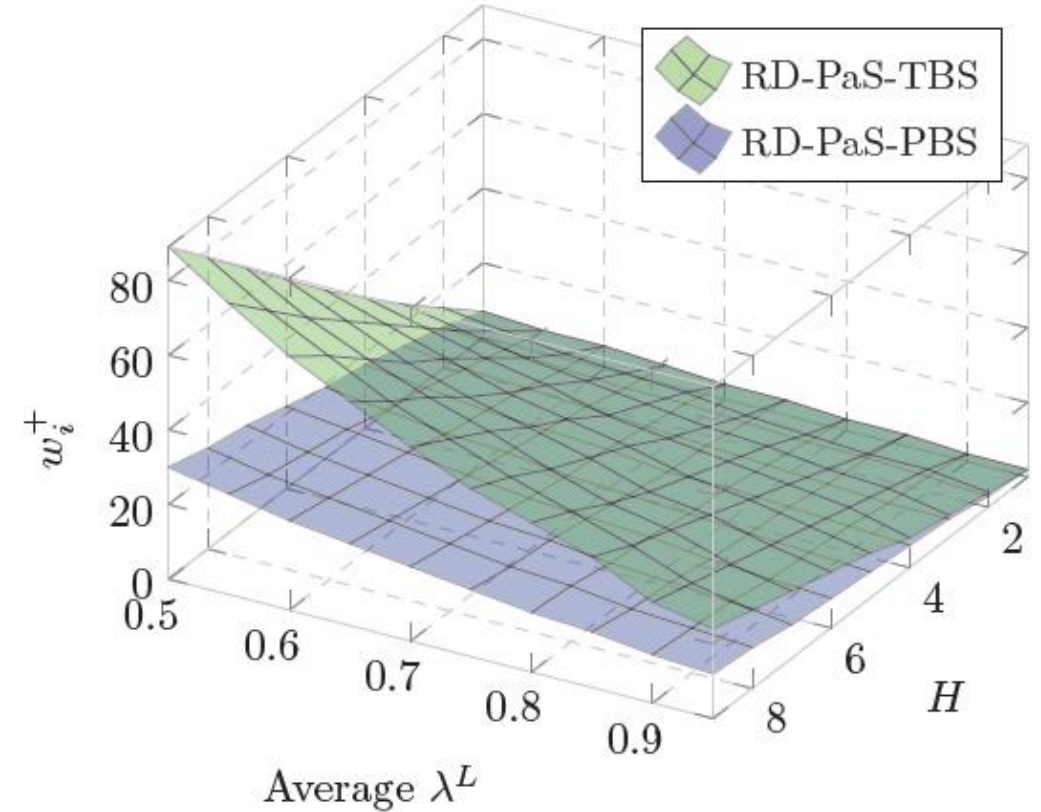
Slot 1	Slot 2	Slot 3	Slot 4
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← Assign 4 time slots for this packet

# Performance comparison



■ **Figure 7** Throughput comparison among different scheduling frameworks.



■ **Figure 8** Comparison of  $w_i^+$  in TBS and PBS.