



INTERNET2021

# Path Schedulers Performance on Cellular/Wi-Fi Multipath Video Streaming

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## ◆ Masayoshi Kondo

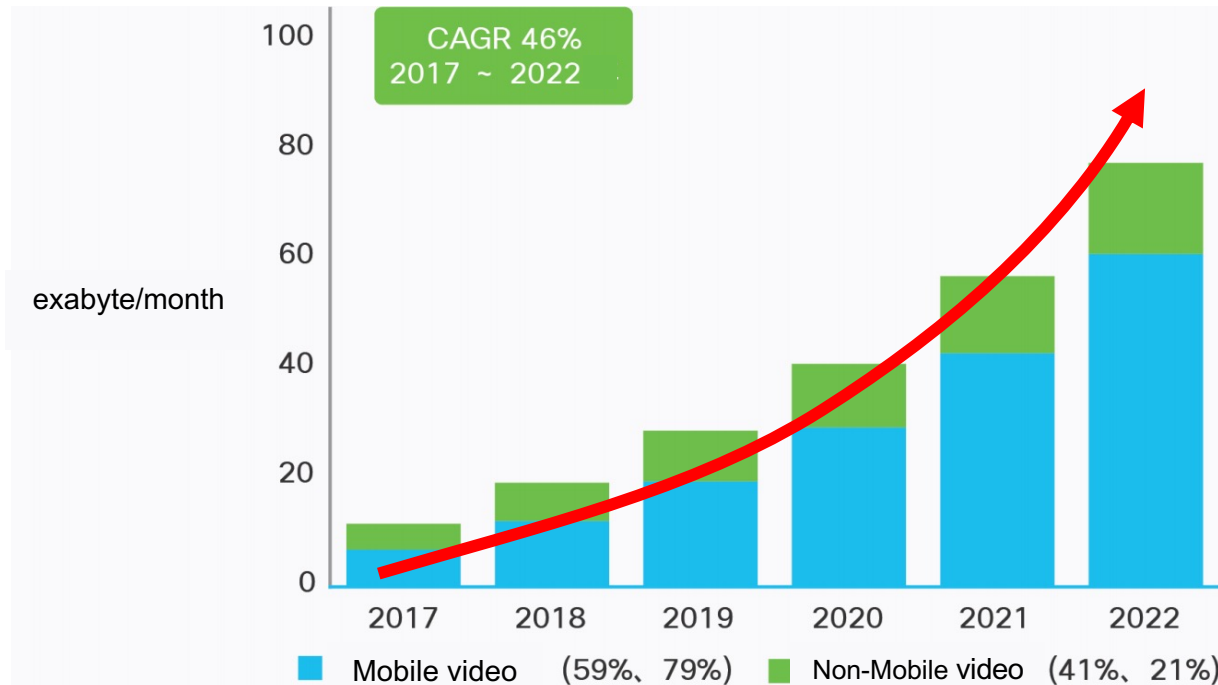
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- [kondo.masayoshi146@mail.kytuech.jp](mailto:kondo.masayoshi146@mail.kytuech.jp)
  
- Field of Study
  - MPTCP
  - Transport Protocol



# Introduction #1



- ◆ Mobile video traffic is increasing year by year.
  - The demand of video streaming has exploded



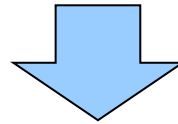
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# Introduction #2

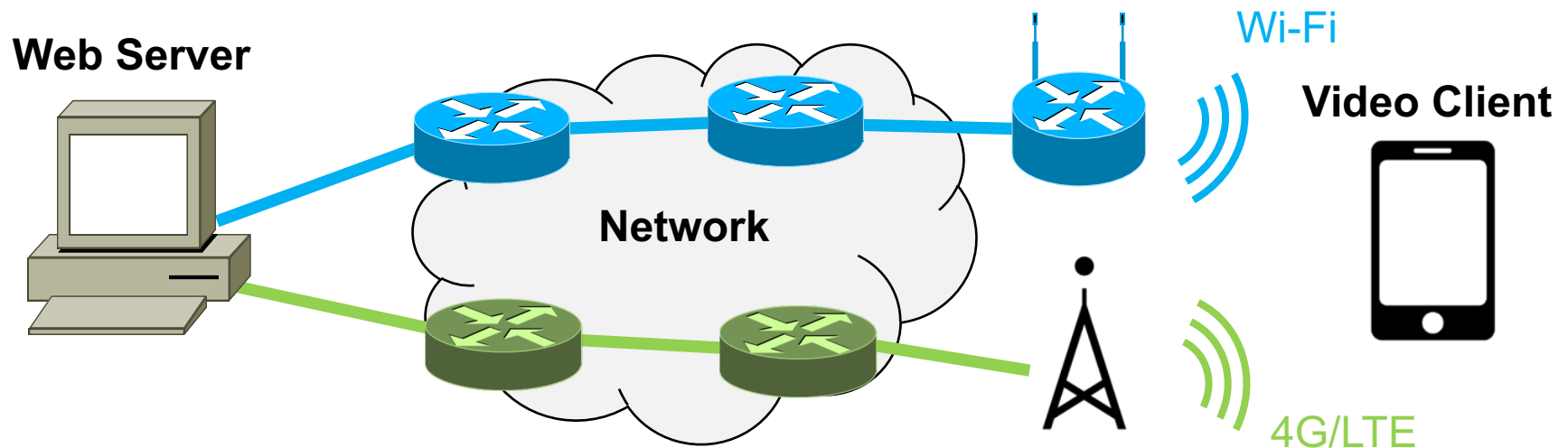


## ◆ Video streaming over mobile network

- High speed and broadband wireless access: 4G/5G/Wi-Fi
- Mobile devices have multiple high speed wireless communication interfaces

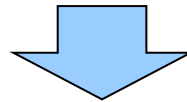


It is effective to use multiple interfaces for reliable and high quality communication

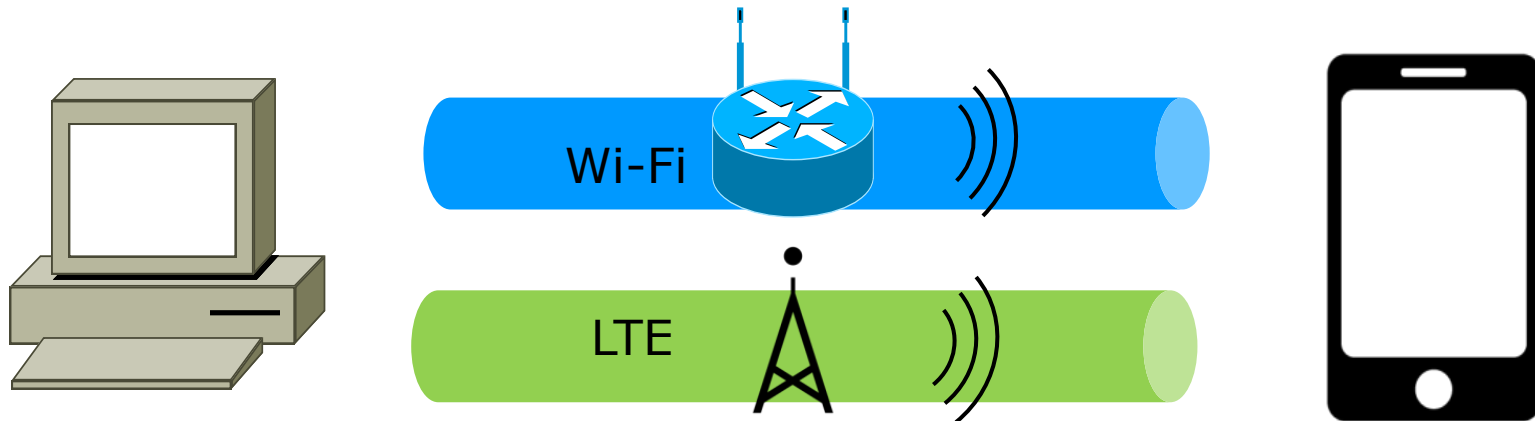


## ◆ Multipath TCP (MPTCP)

- It is possible to communicate using multiple paths simultaneously.



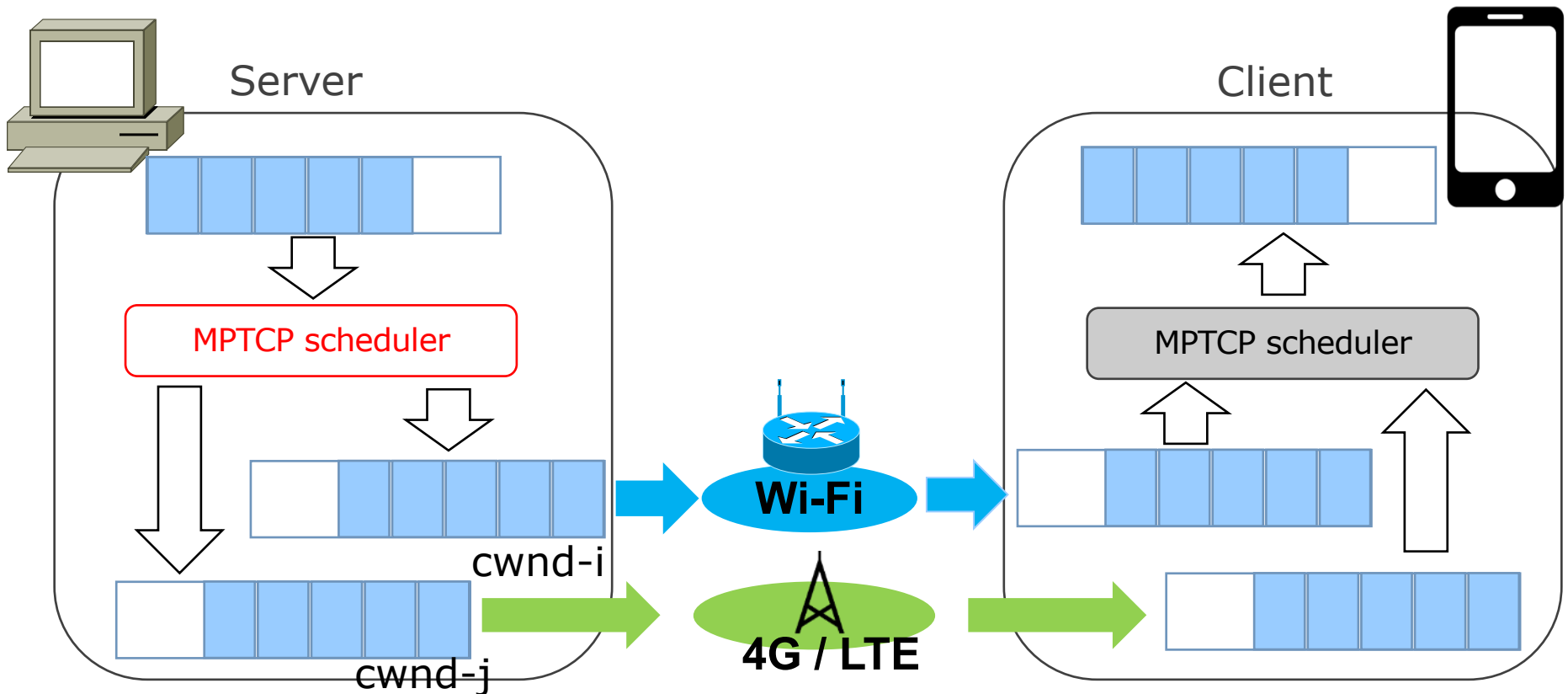
- MPTCP can improve the throughput for applications
- MPTCP can guarantee redundancy by providing multiple paths



# Video streaming over Multipath TCP



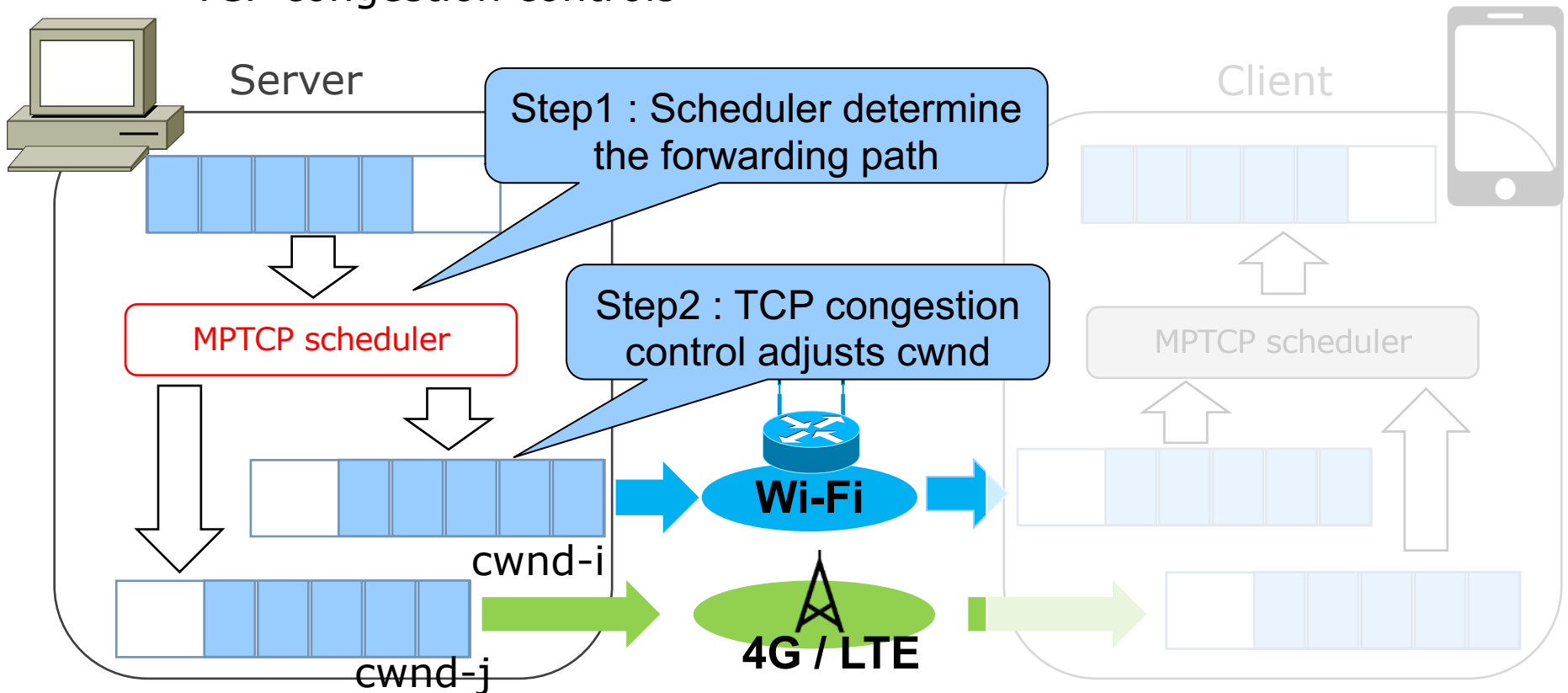
- ◆ The performance of MPTCP is determined by two important functions
  - MPTCP scheduler
  - MPTCP congestion control



# Video streaming over Multipath TCP



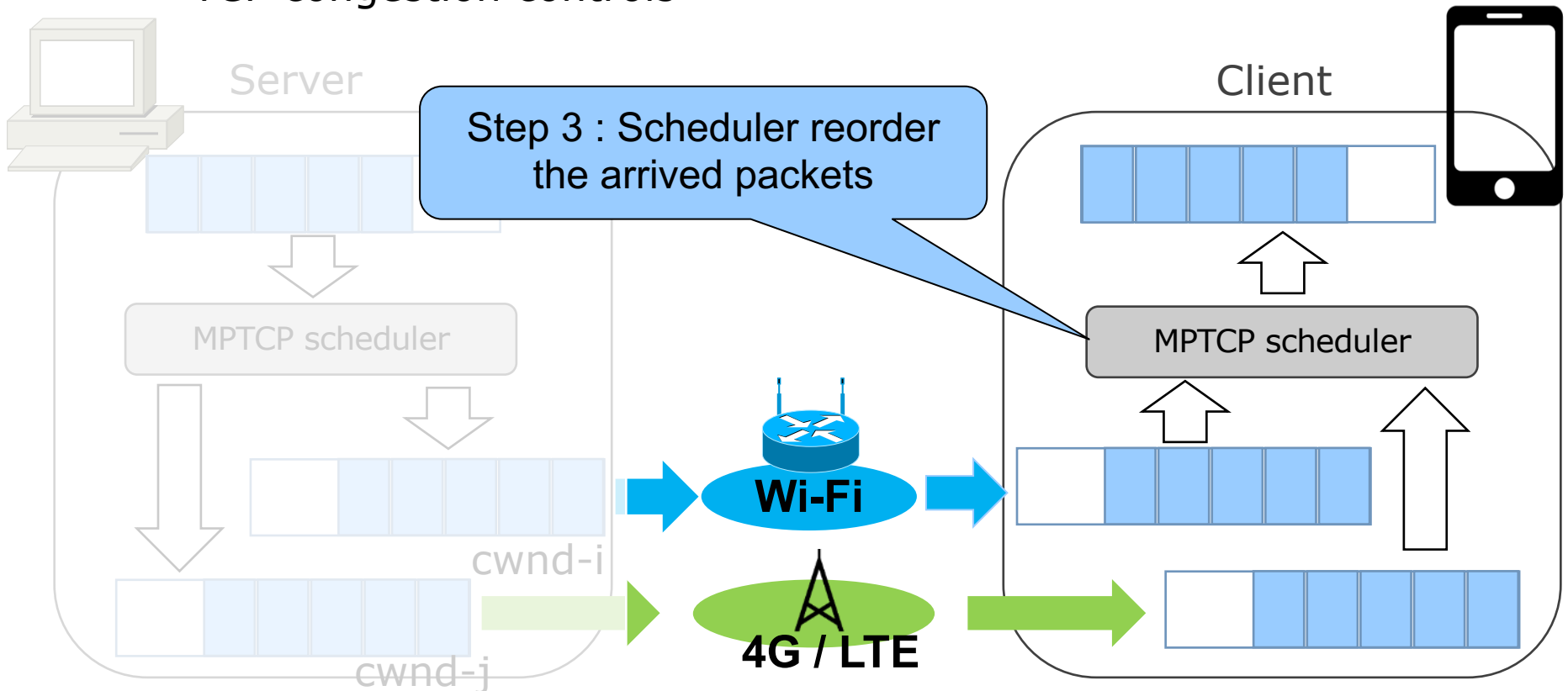
- ◆ MPTCP scheduler
  - determines a path to forward packets
- ◆ MPTCP congestion control
  - adjusts congestion window (cwnd) size as well as conventional TCP congestion controls



# Video streaming over Multipath TCP



- ◆ MPTCP scheduler
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  - adjusts congestion window (cwnd) size as well as conventional TCP congestion controls



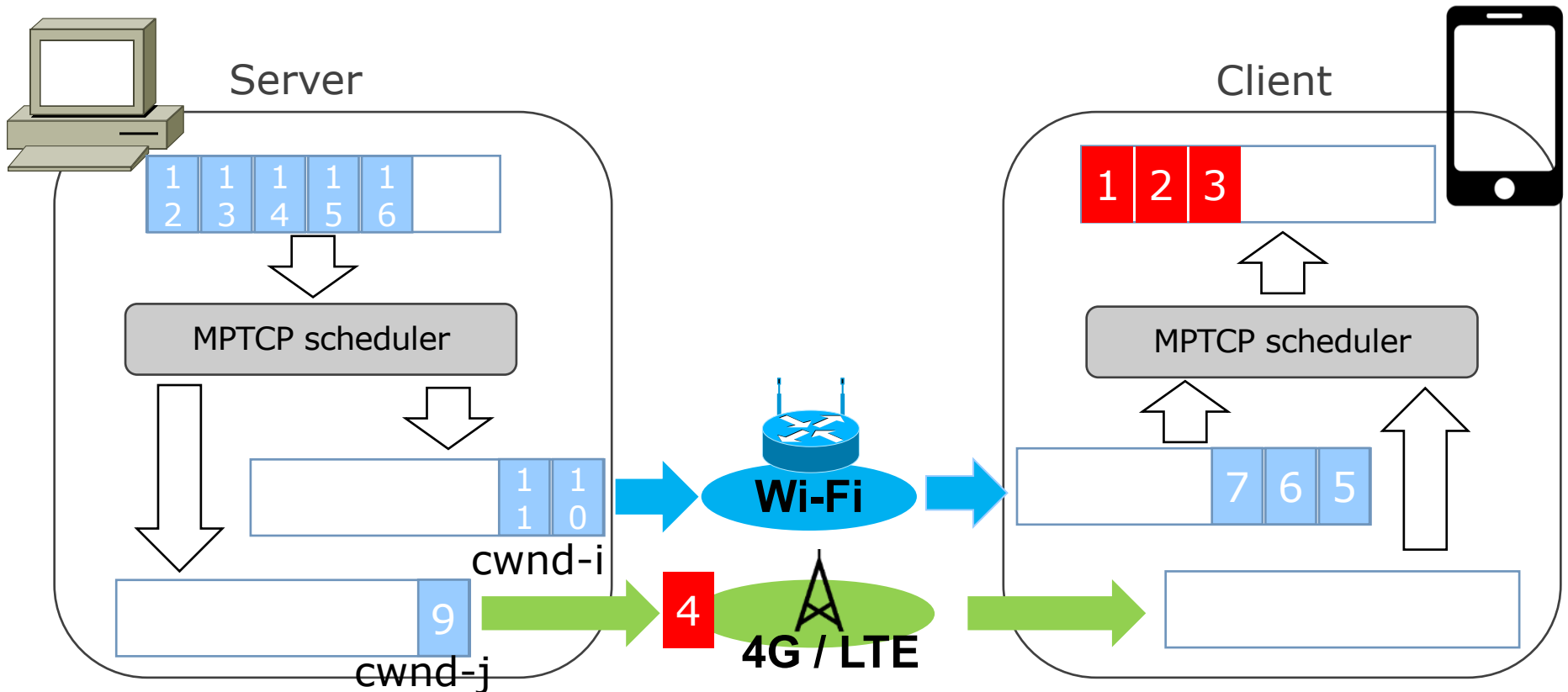


# Head of Line Blocking



## ◆ Head of Line Blocking(HOL blocking)

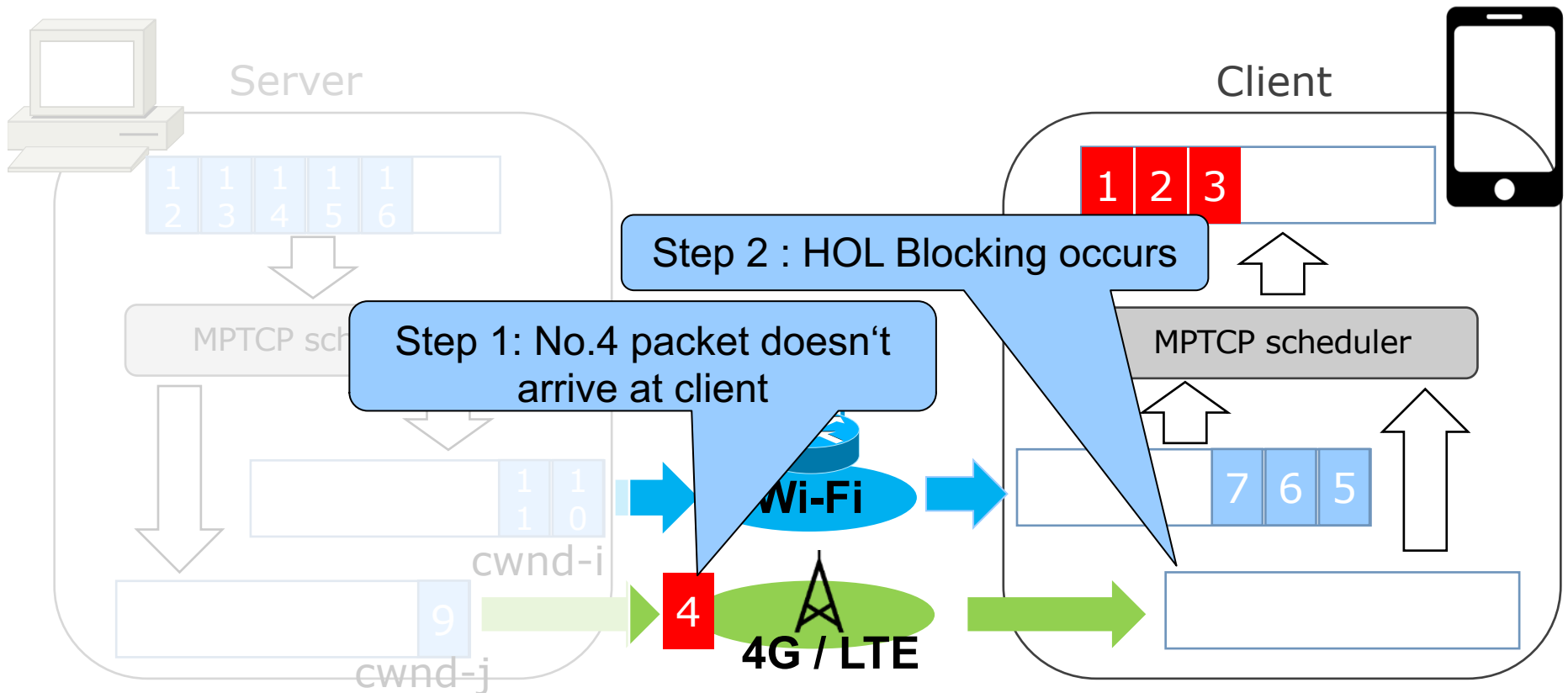
- HOL blocking occurs when data already delivered at the receiver is waiting for additional packets that are blocked at another sub-flow, potentially causing incomplete or late frames to be discard at the receiver.



# Head of Line Blocking



- ◆ At the receiver, incomplete video frames due to HOL blocking are discarded and degrade the video quality.





- ◆ Important factors in video streaming over MPTCP
  - Determination of a path to forward packets for **MPTCP scheduler**
  - **Congestion control** for each sub-flow
- ◆ **We combine the conventional and proposed schedulers with various congestion controls of MPTCP in experiments.**
- ◆ We consider the optimal combination for MPTCP video streaming



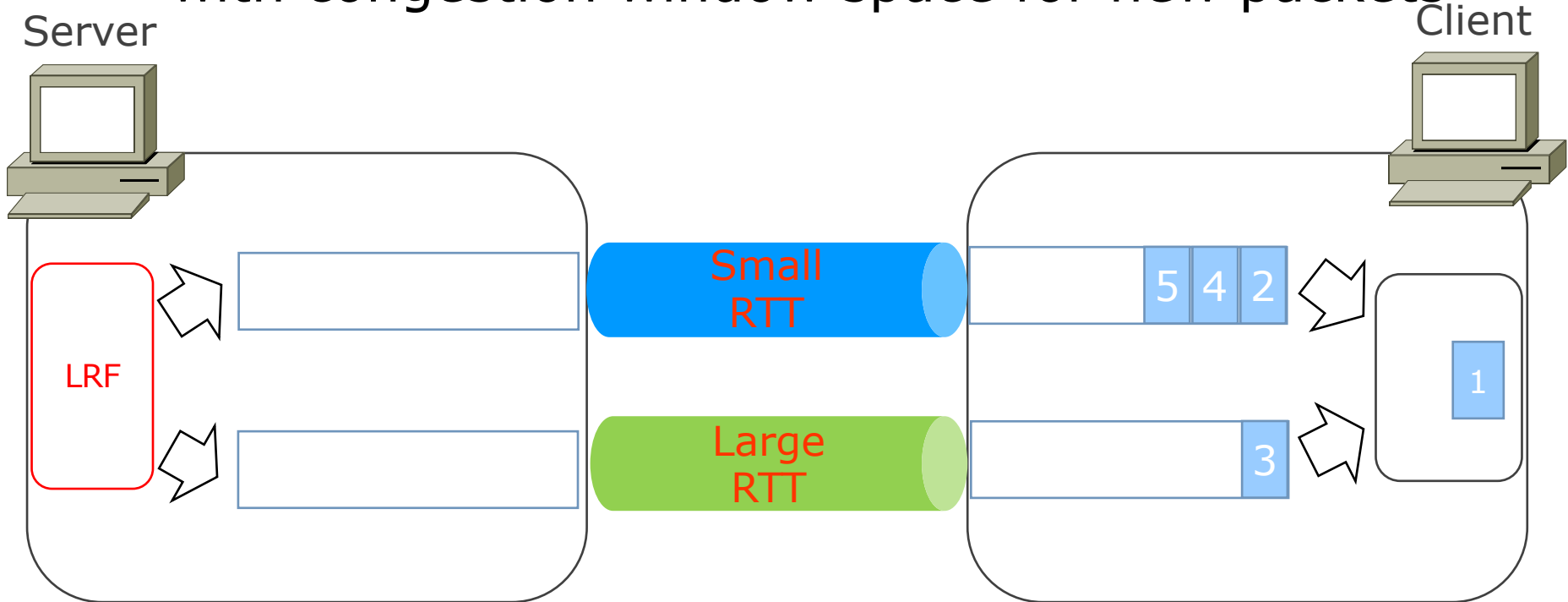
- ◆ Default Scheduler (Linux implementation)
  - Low RTT First (LRF)
    - selects the path with smaller RTT
- ◆ Proposed schedulers
  - Throughput-based
    - Largest Packet Credits (LPC)
    - Largest Estimated Throughput (LET)
  - Reducing sub-flow switching-based
    - Greedy Sticky (GR-STY)
    - Throughput Sticky (TP-STY)
    - Throughput RTT Sticky (TR-STY)

# LRF scheduler



## ◆ Low RTT First (LRF) scheduler

- MPTCP default scheduler (Linux implementation)
- selects the path with smallest RTT among paths with congestion window space for new packets

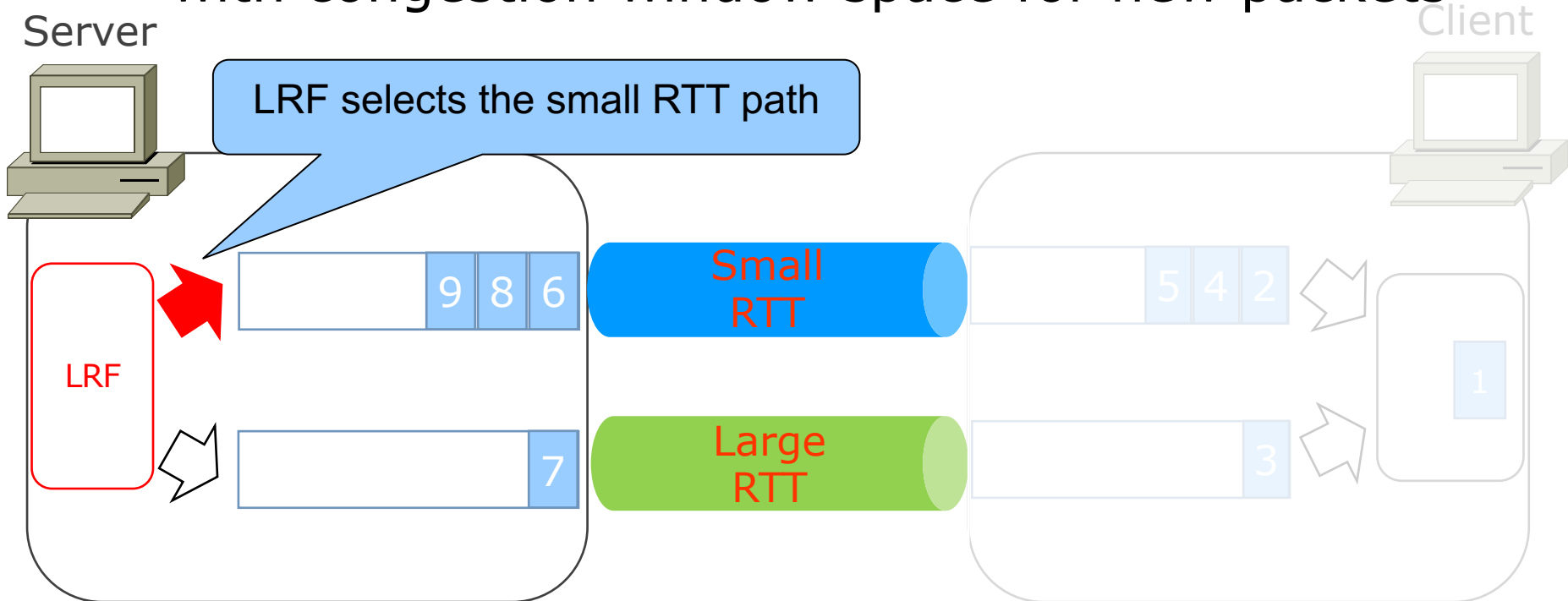


# LRF scheduler



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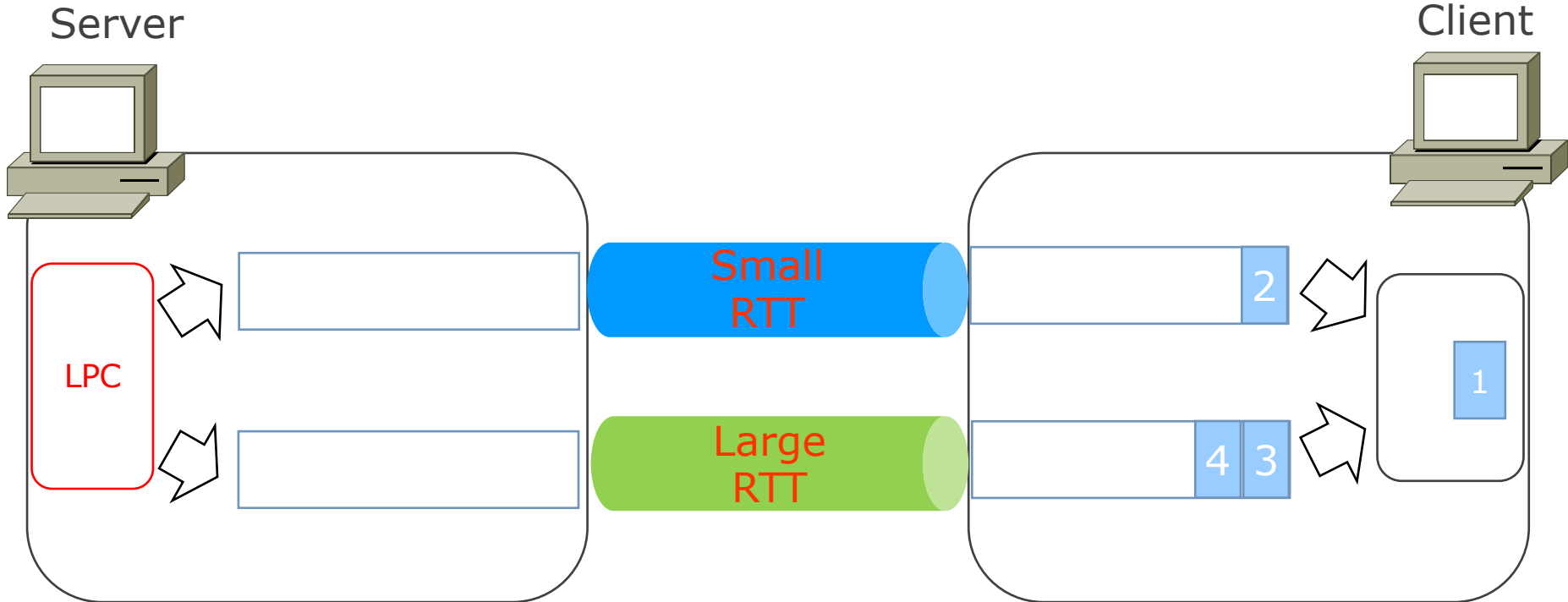


# LPC scheduler



## ◆ Largest Packet Credits (LPC) scheduler

- Among the sub-flows with space in their congestion window  $cwnd$ , this scheduler selects the one with largest available space

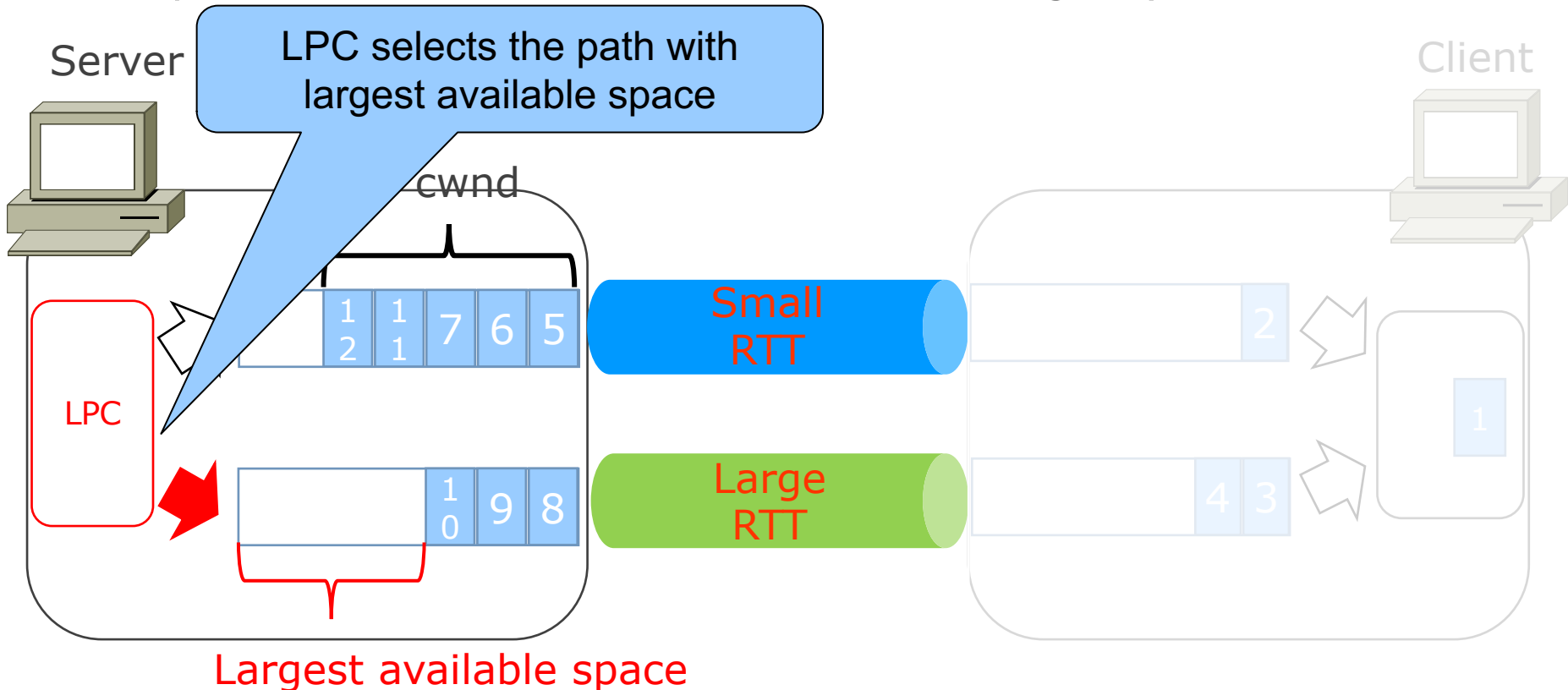


# LPC scheduler



## ◆ Largest Packet Credits (LPC) scheduler

- Available space consists of the number of packets allowed by current cwnd size subtracted from the number of packets that have not been acknowledged yet



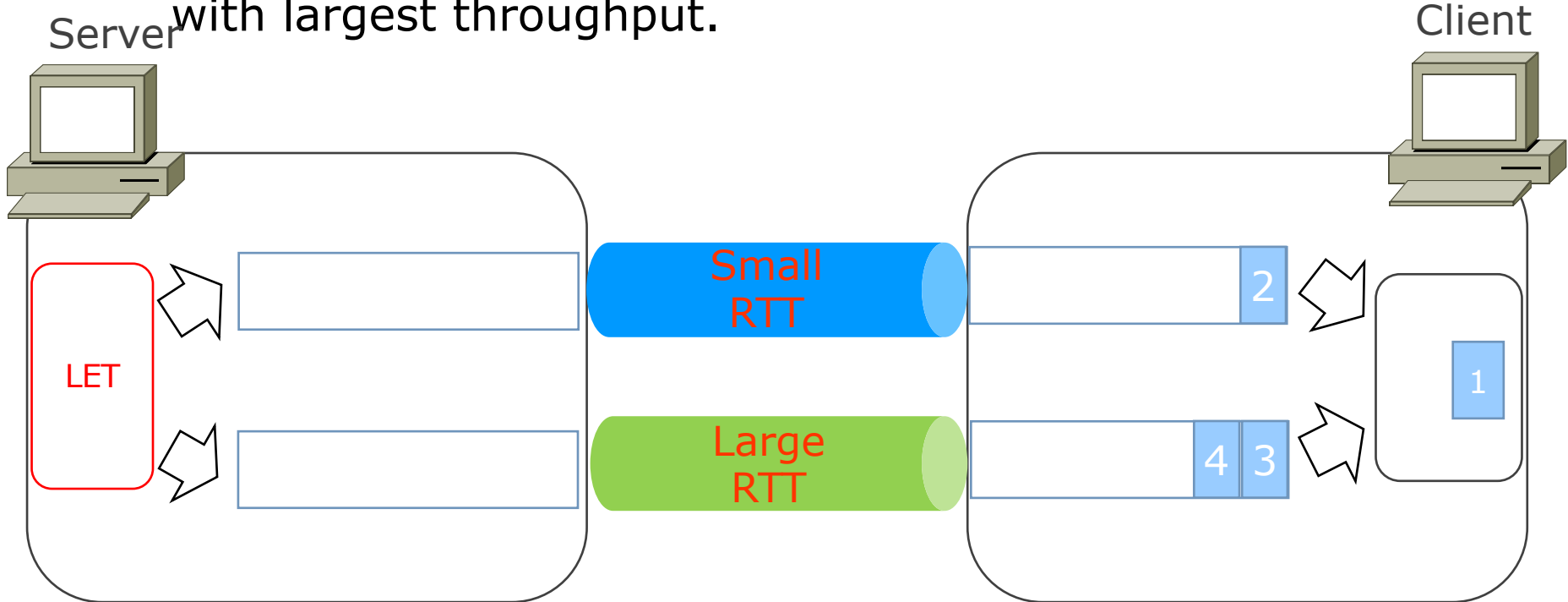


# LET scheduler



## ◆ Largest Estimated Throughput (LET) scheduler

- Among the sub-flows with large enough cwnd to accommodate new packets, this scheduler selects the one with largest throughput.

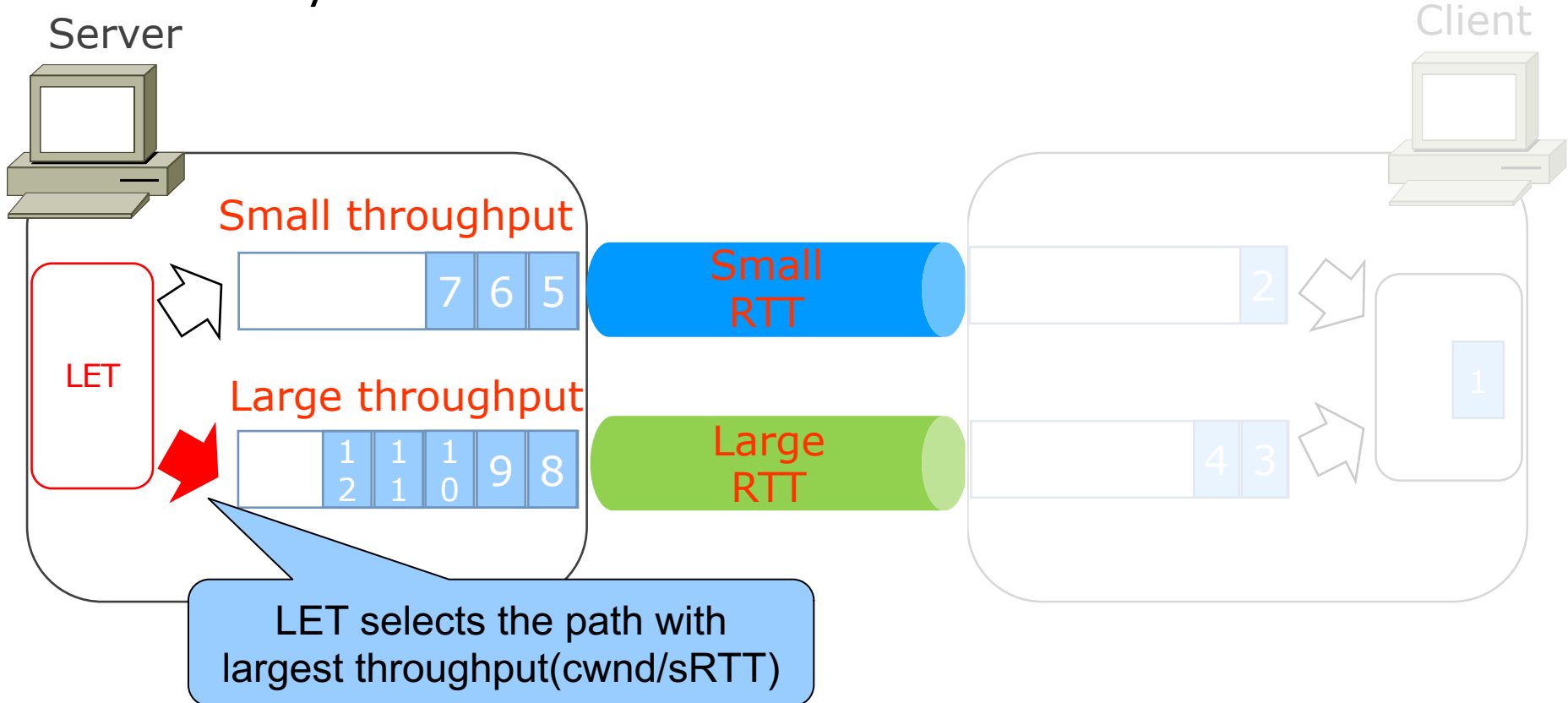


# LET scheduler



## ◆ Largest Estimated Throughput (LET) scheduler

- the estimated throughput is each sub-flow as  $cwnd/sRTT$

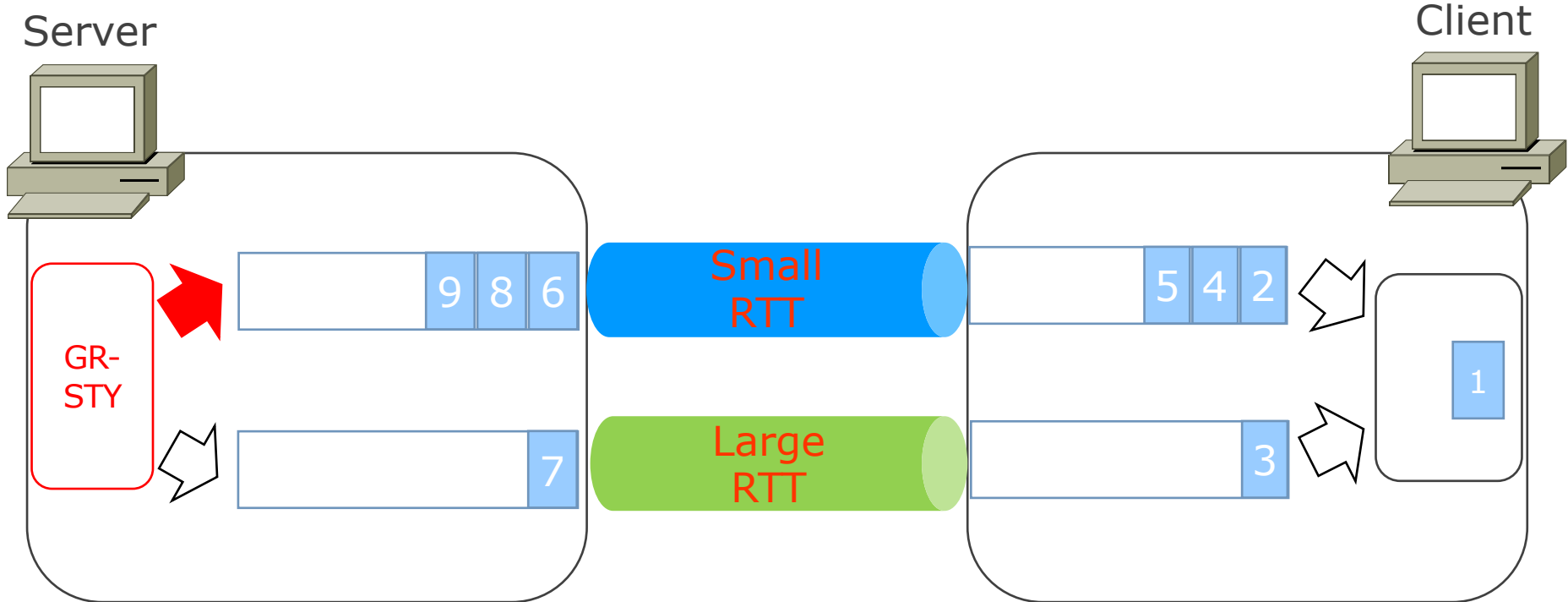


# GR-STY scheduler



## ◆ Greedy Sticky (GR-STY) scheduler

- selects the path with smallest RTT as same as LRF
- But, once a path is selected, GR-STY stays on a path for as long as there is available window space

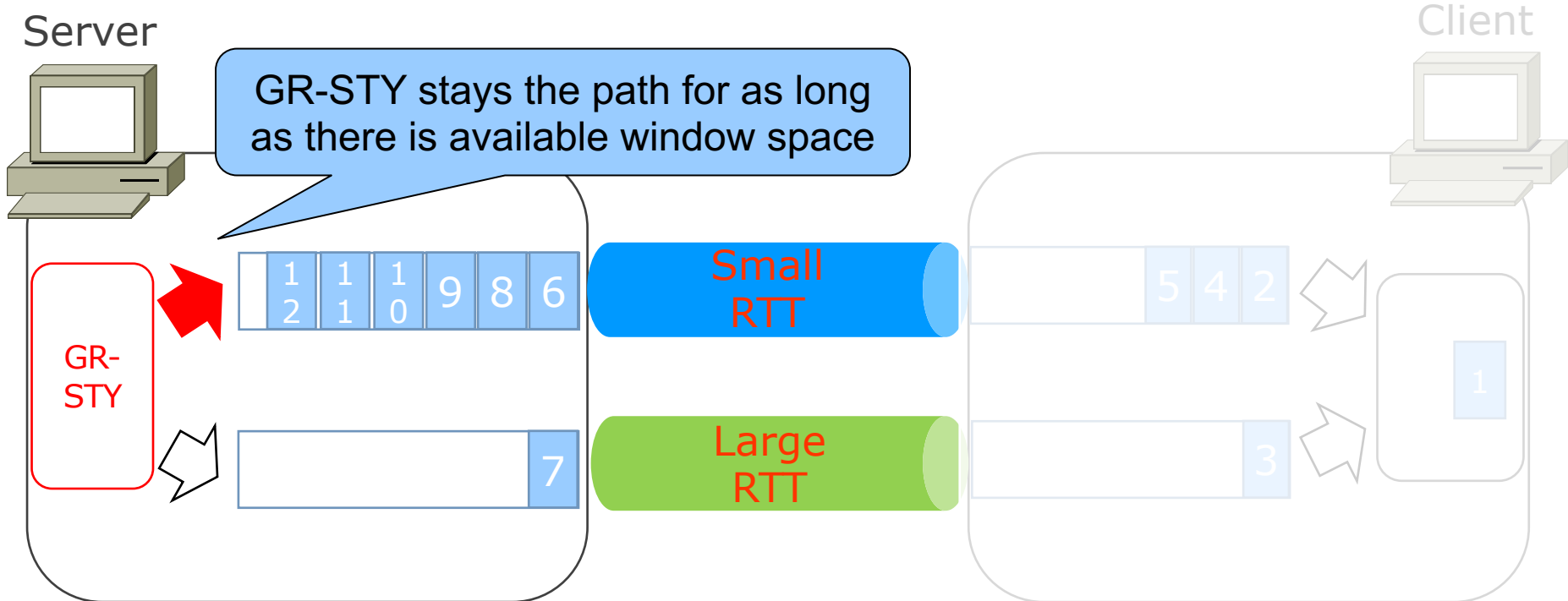


# GR-STY scheduler



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- selects the path with smallest RTT as same as LRF
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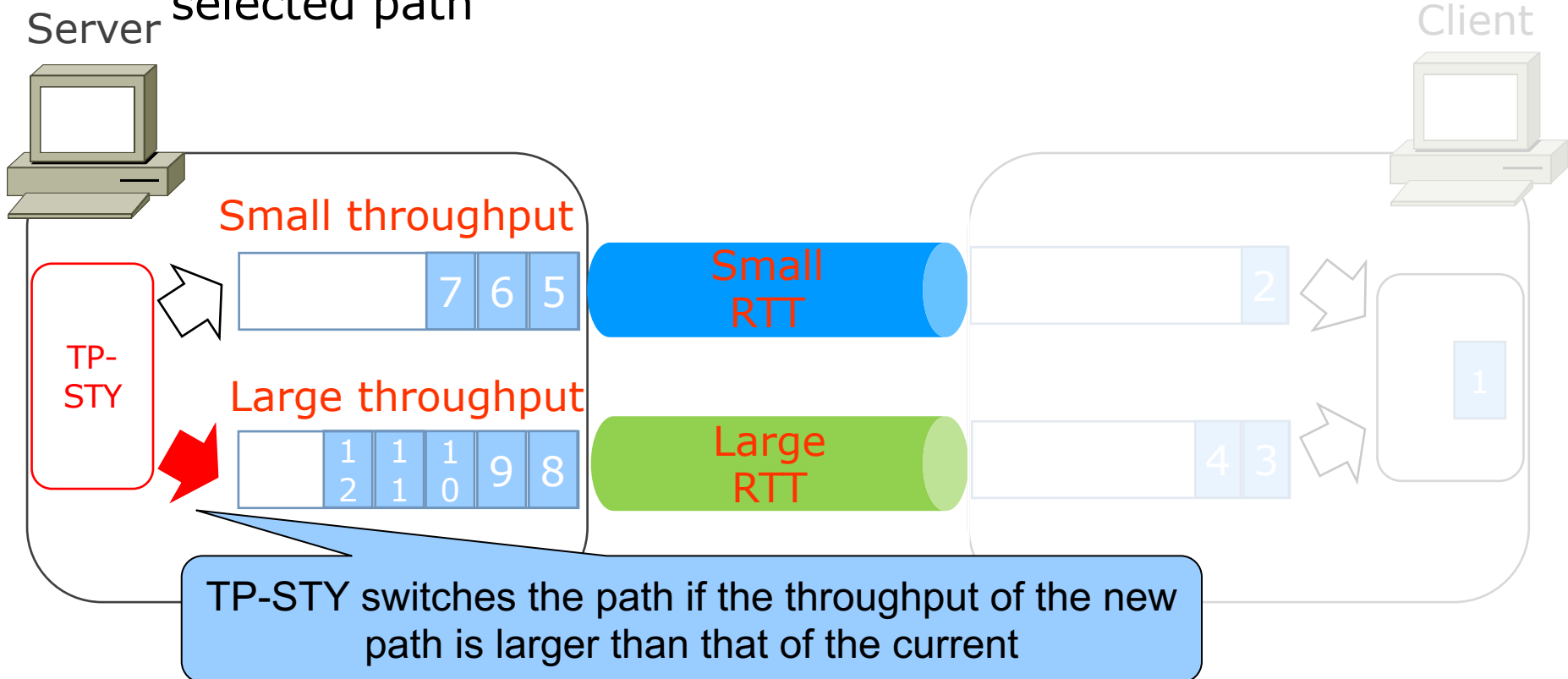


# TP-STY scheduler



## ◆ Throughput Sticky (TP-STY) scheduler

- selects the path with smallest RTT as same as LRF
- But, a new path is selected only if the throughput of the new path is larger than the throughput of the currently selected path

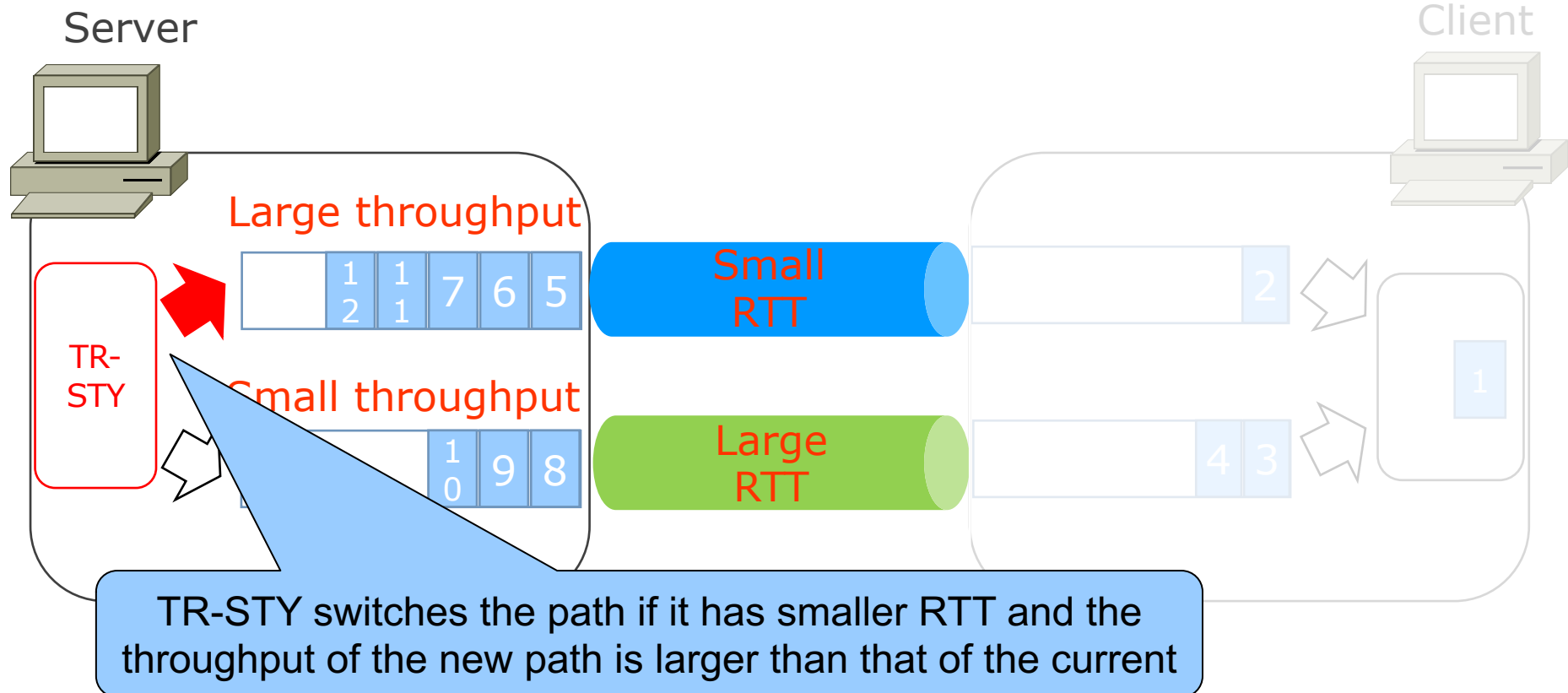


# TR-STY scheduler



## ◆ Throughput RTT Sticky (TR-STY) scheduler

- selects the path with smallest RTT as same as LRF
- But, in addition to TP-STY, TR-STY switches the new path has smaller RTT than the current one





## ◆ Uncoupled congestion controls

- determine congestion window size independently for each subflow
- Cubic
  - Loss-based algorithm, Linux standard
  - Use the cubic function to adjust cwnd
- Compound
  - Loss-based and delay-based algorithm
  - Determine the window size by the sum of dwnd and cwnd

## ◆ Coupled congestion controls

- determine the congestion window size by considering the entire connection.
- Linked Increase Algorithm(LIA),  
Opportunistic Linked Increase Algorithm(OLIA),  
Balanced Linked Adaptation Algorithm(BALIA)

# Coupled Congestion Control



- ◆ **Linked Increase Algorithm(LIA)**
  - Loss-based algorithm with traffic load balancing of multiple paths
  - New Reno is used in each sub-flow, and the congestion window size increase / decrease method (AIMD: Additive increase multiplicative decrease) is adopted.
  - Load balancing is performed by increasing cwnd for paths with low RTT and decreasing cwnd for paths with large RTT.
- ◆ **Opportunistic Linked Increase Algorithm(OLIA)**
  - Loss-based algorithm with TCP friendliness
  - Estimate the number of bytes sent between the last two packet losses and adjust the congestion window size.
- ◆ **Balanced Linked Adaptation Algorithm(BALIA)**
  - Loss-based algorithm with TCP friendliness and responsiveness



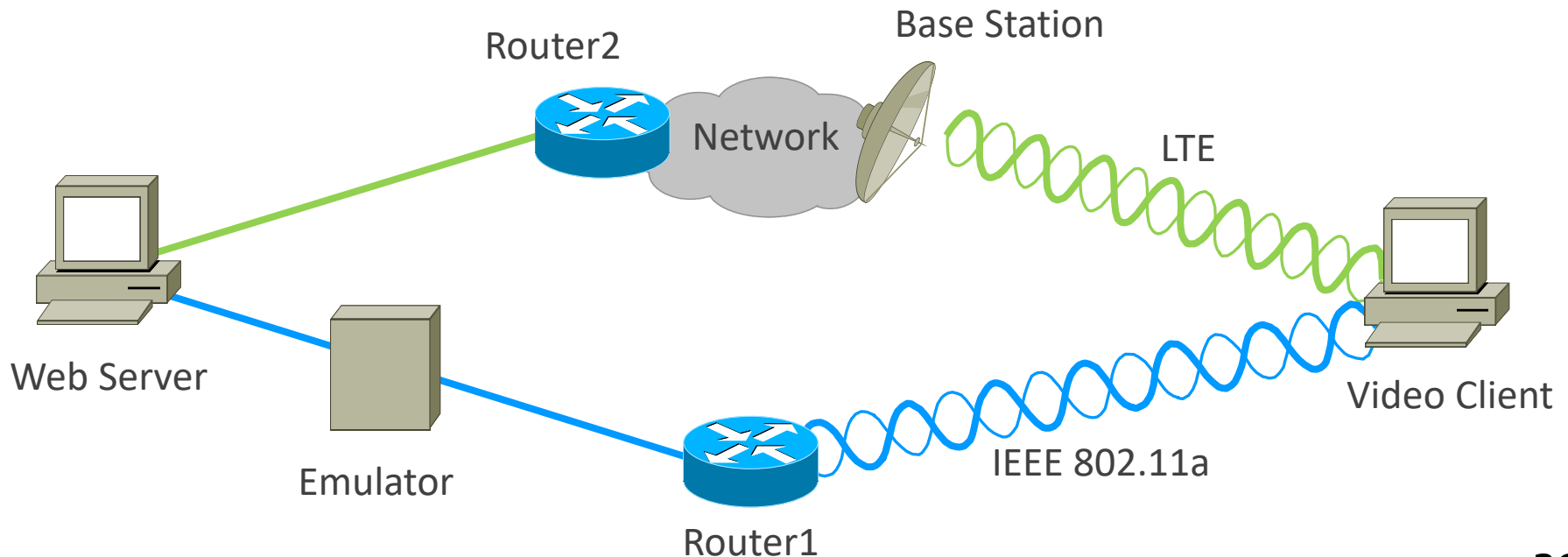


- ◆ We analyze video performance vis-à-vis TCP variants and path schedulers
- ◆ We utilize verification experiments to evaluate the video performance for various combinations of TCP and schedulers

# Experimental Environment



- ◆ HTTP apache video server is connected to two routers
- ◆ VLC video client is connected to LTE base station and router1
- ◆ We set emulator between server and router1



# Video/network Settings



## Table 1: Video Settings

Video size	409 Mbytes
Video Rate	5.24 Mb/s
Playout time	10mins 24s
Encoding	MPEG-4
Video Codec	H.264/AVC
Audio Codec	MPEG-4 AAC

## Table 2: MPTCP Settings

MPTCP Schedulers	LRF(default) LPC, LET GR-STY, TP-STY, TR-STY
MPTCP Variants	<ul style="list-style-type: none"><li>• Uncoupled<ul style="list-style-type: none"><li>• Cubic</li><li>• Compound</li></ul></li><li>• Coupled<ul style="list-style-type: none"><li>• LIA</li><li>• OLIA</li><li>• BALIA</li></ul></li></ul>

# Experimental Scenarios



- ◆ We use network emulator
  - We set delay and packet loss for Wi-Fi path only

scenarios	path	delay	Packet loss	RTT
A	LTE Wi-Fi	0ms 20ms	0%	RTT 80ms RTT 40ms
B	LTE Wi-Fi	0ms 30ms	0%	RTT 80ms RTT 60ms
C	LTE Wi-Fi	0ms 30ms	0% 6%	RTT 80ms RTT 60ms
D	LTE Wi-Fi	0ms 40ms	0%	RTT 80ms
E	LTE Wi-Fi	0ms 40ms	0% 6%	RTT 80ms

# Scenarios A



- ◆ Scenario A is baseline scenario, where Wi-Fi path is good quality

scenarios	path	delay	Packet loss	RTT
A	LTE Wi-Fi	0ms <b>20ms</b>	0%	RTT 80ms RTT 40ms
B	LTE Wi-Fi	0ms	0%	RTT 80ms RTT 60ms
C	LTE Wi-Fi	0ms 30ms	0% 6%	RTT 80ms RTT 60ms
D	LTE Wi-Fi	0ms 40ms	0%	RTT 80ms
E	LTE Wi-Fi	0ms 40ms	0% 6%	RTT 80ms

Scenario A with small RTT

# Scenarios B and C



- ◆ Scenario B is a slightly larger Wi-Fi path delay
- ◆ Scenario C is a Wi-Fi link with medium delay suffers a 6% packet loss degradation

scenarios	path	delay	Packet loss	RTT
A	LTE Wi-Fi	0ms 20ms	0%	RTT 80ms RTT 40ms
B	LTE Wi-Fi	0ms <b>30ms</b>	0%	RTT 80ms RTT 60ms
C	LTE Wi-Fi	0ms <b>30ms</b>	0% <b>6%</b>	RTT 80ms RTT 60ms
D	LTE	0ms	0%	RTT 80ms
E	Wi-Fi	40ms	0%	RTT 80ms

Scenario B with middle RTT  
Scenario C with middle RTT and 6% packet loss

# Scenarios D and E



- ◆ Scenario D is a Wi-Fi path delay large enough
- ◆ Scenario E is a Wi-Fi link with large delay also suffers a 6% packet loss degradation

scenarios	path	delay	Packet loss	RTT
A	LTE Wi-Fi	0ms 20ms	0%	RTT 80ms RTT 40ms
B	LTE Wi-Fi	0ms 20ms	0%	RTT 80ms RTT 60ms
C	LTE Wi-Fi	0ms 20ms	0% 6%	RTT 80ms RTT 60ms
D	LTE Wi-Fi	0ms <b>40ms</b>	0%	RTT 80ms
E	LTE Wi-Fi	0ms <b>40ms</b>	0% <b>6%</b>	RTT 80ms

Scenario D with large RTT  
Scenario E with large RTT and 6% packet loss



## ◆ Video Performance

### ■ Picture discard

- Number of frames discarded by the video decoder

### ■ Buffer underflow

- Number of buffer underflow events ad video client buffer

- ◆ The number of trials is 5 and the average value is calculated.



# Scenario A : video performance

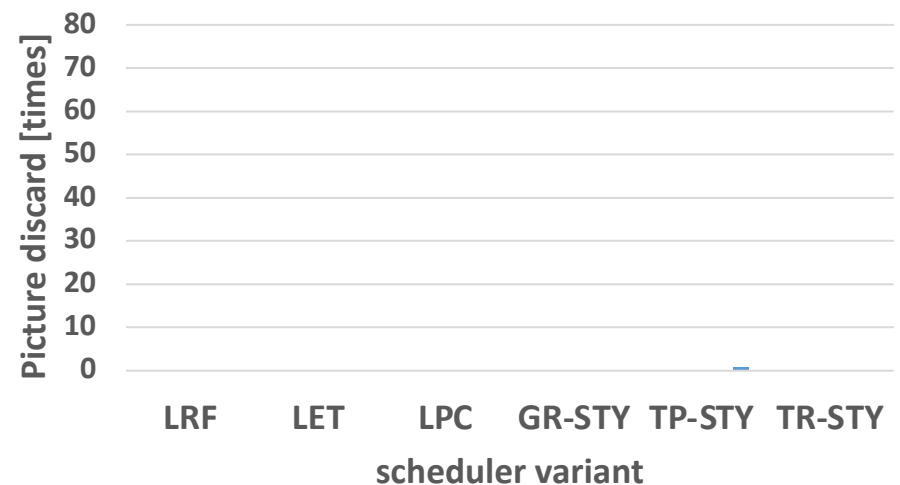
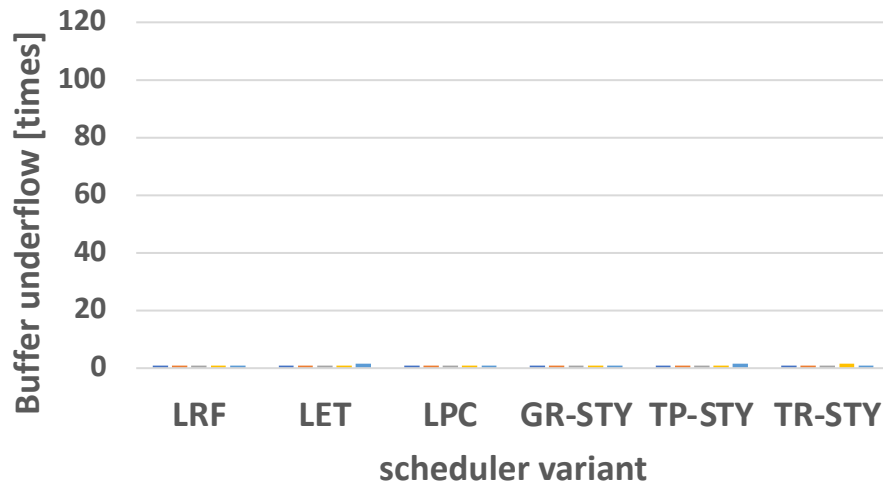


## ◆ Path properties

- Wi-Fi: RTT=40ms, Loss= 0%
- LTE: RTT= 80ms, Loss = 0%

## ◆ Figures report on video streaming buffer underflow and picture discard performance

## ◆ Video performance is excellent



■ Cubic ■ Compound ■ LIA ■ OLIA ■ BALIA

Buffer underflow

■ Cubic ■ Compound ■ LIA ■ OLIA ■ BALIA

Picture discard

# Scenario A : throughput

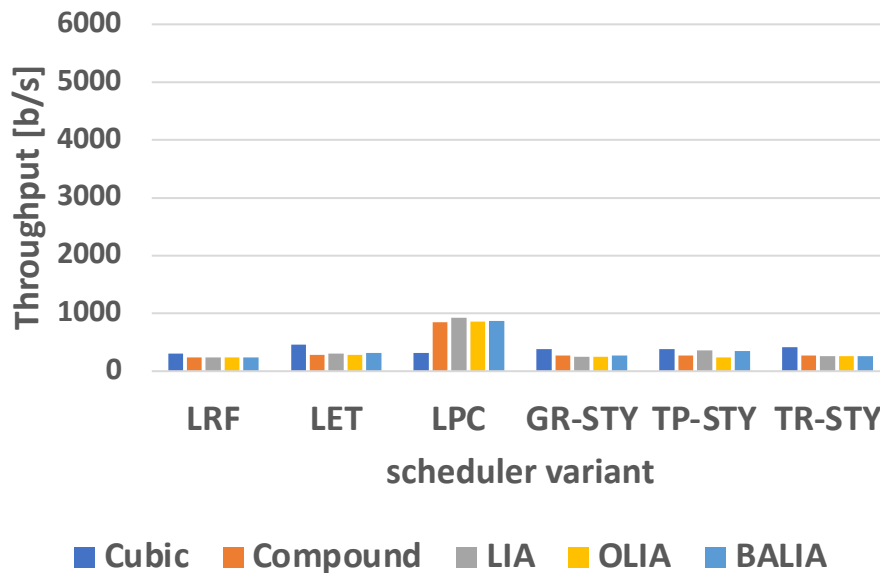


## ◆ Path properties

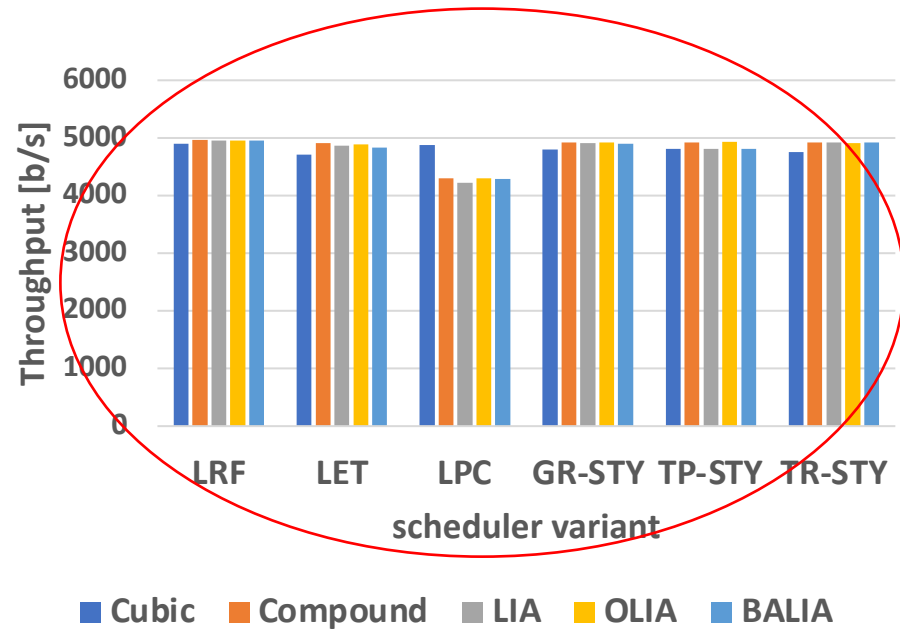
- Wi-Fi: RTT=40ms, Loss= 0%
- LTE: RTT= 80ms, Loss = 0%

## ◆ Figures report of LTE and Wi-Fi throughput

## ◆ We can see that Wi-Fi path is most used



Throughput LTE



Throughput Wi-Fi

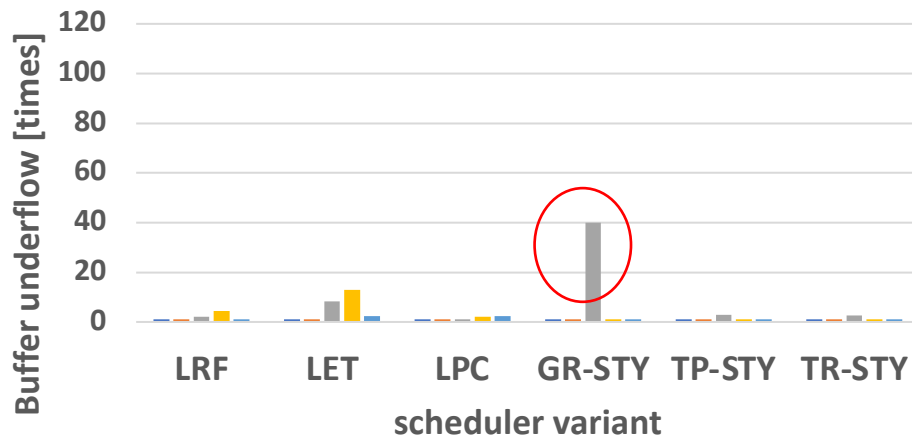
# Scenario B : video performance



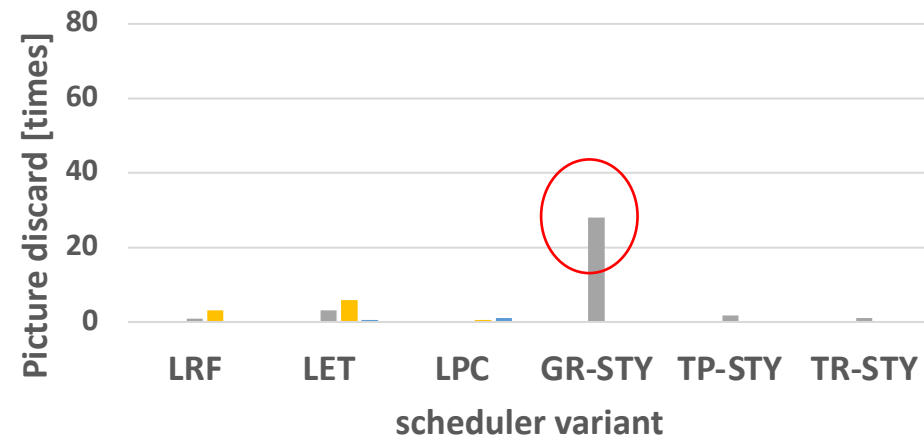
## ◆ Path properties

- Wi-Fi: RTT=60ms, Loss= 0%
- LTE: RTT= 80ms, Loss = 0%

◆ In scenario B, Even though most TCP variant and path scheduler perform well, LIA under GR-STY results in video degradation



Buffer underflow



Picture discard

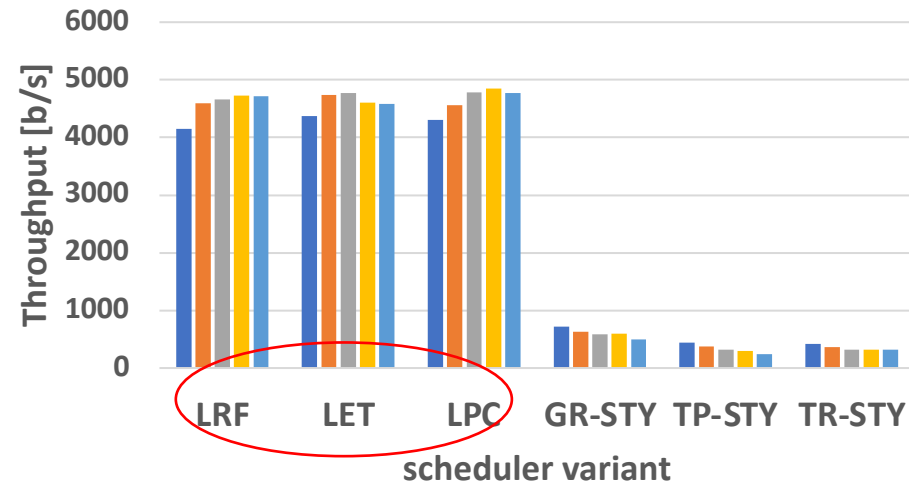
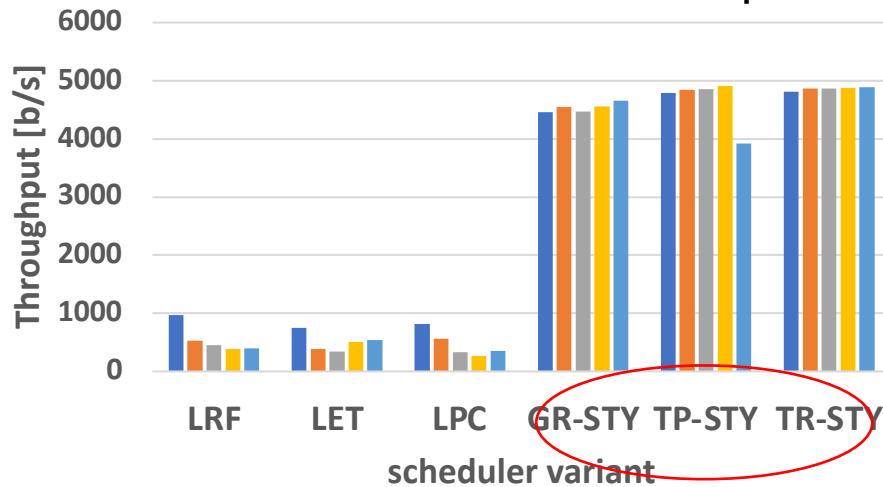
■ Cubic ■ Compound ■ LIA ■ OLIA ■ BALIA

■ Cubic ■ Compound ■ LIA ■ OLIA ■ BALIA

# Scenario B : throughput



- ◆ Path properties
  - Wi-Fi: RTT=60ms, Loss= 0%
  - LTE: RTT= 80ms, Loss = 0%
- ◆ In scenario B, We see that path schedulers drive the usage of one path versus the other, independent of the TCP variant.
- ◆ LRF, LET, LPC utilize Wi-Fi path mostly, STY scheduler use LTE path.
- ◆ This shows how sensitive path selection is to delay differentials



■ Cubic ■ Compound ■ LIA ■ OLIA ■ BALIA

■ Cubic ■ Compound ■ LIA ■ OLIA ■ BALIA

Throughput LTE

Throughput Wi-Fi

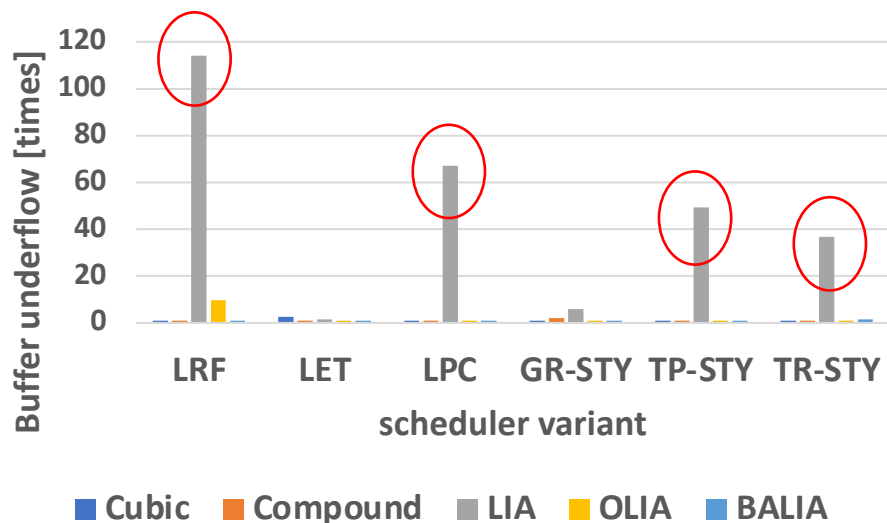
# Scenario C : video performance



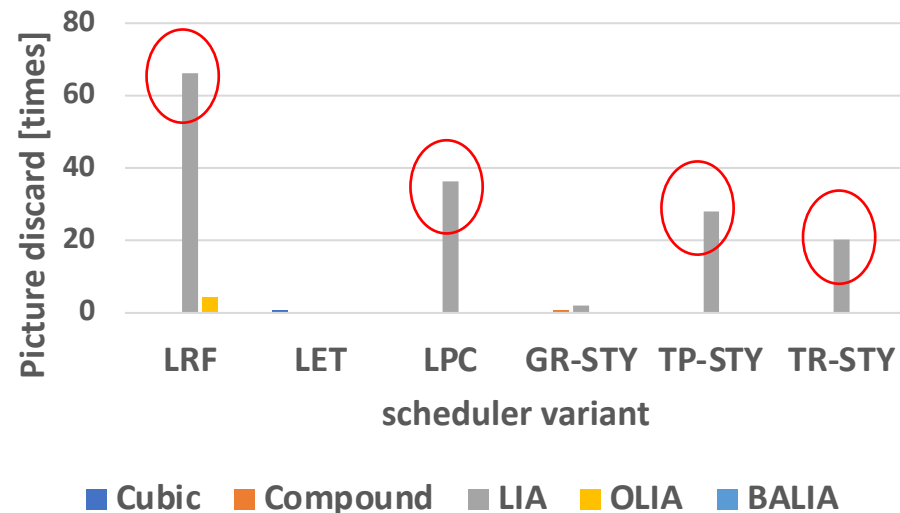
## ◆ Path properties

- Wi-Fi: RTT=60ms, Loss= 6%
- LTE: RTT= 80ms, Loss = 0%

◆ In scenario C, We see that a wide variety of performances vis a vis path scheduler/TCP variant combinations



Buffer underflow



Picture discard

# Scenario C : throughput

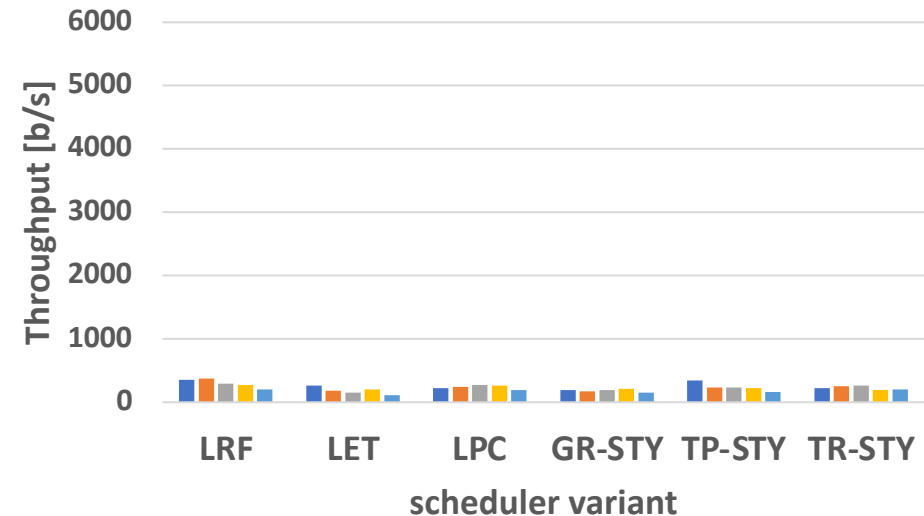
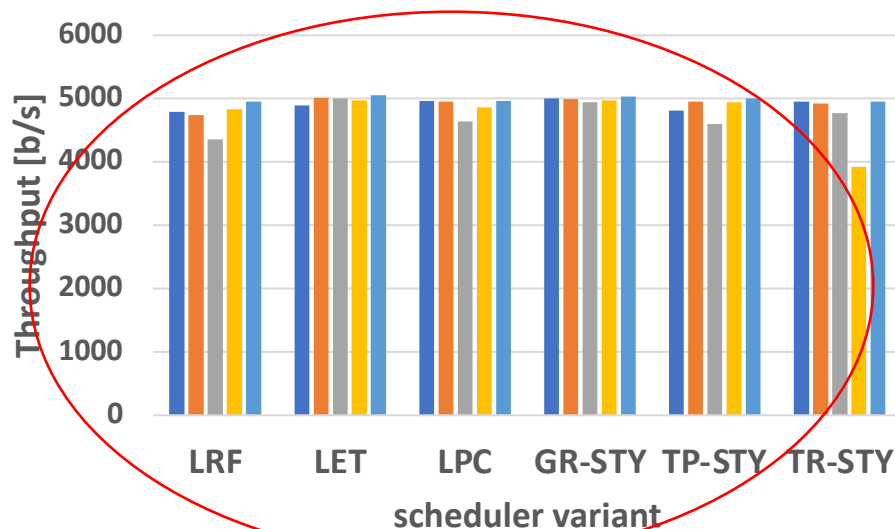


## ◆ Path properties

- Wi-Fi: RTT=60ms, Loss= 6%
- LTE: RTT= 80ms, Loss = 0%

## ◆ In scenario C, LTE path is mostly used.

◆ This is because the Wi-Fi path has packet loss, so the window size does not increase, the RTT is large, but the LTE path with low loss is used.



■ Cubic ■ Compound ■ LIA ■ OLIA ■ BALIA

Throughput LTE

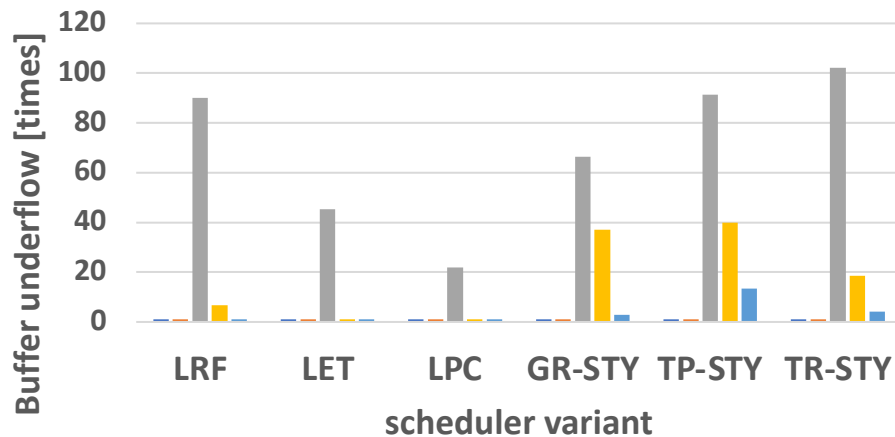
■ Cubic ■ Compound ■ LIA ■ OLIA ■ BALIA

Throughput Wi-Fi

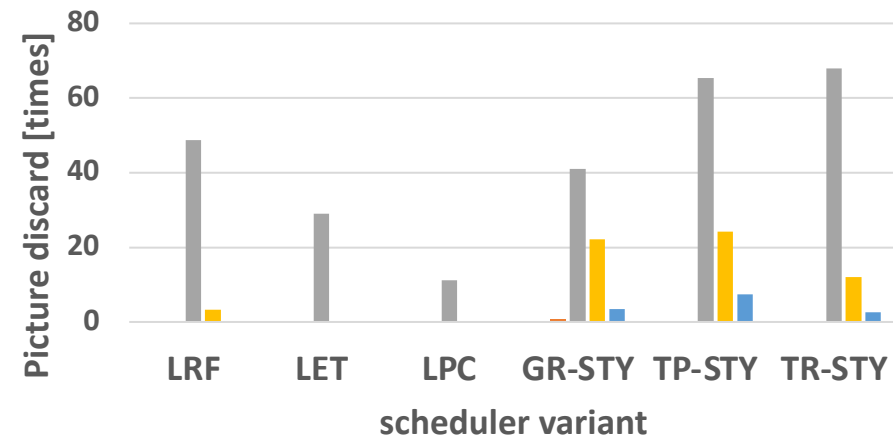
# Scenario D : video performance



- ◆ Path properties
  - Wi-Fi: RTT=80ms Loss= 0%
  - LTE: RTT= 80ms Loss = 0%
- ◆ In scenario D, LIA under all schedulers results in video degradation
- ◆ Also, OLIA under STY scheduler results in video degradation



Buffer underflow



Picture discard

# Scenario D : throughput

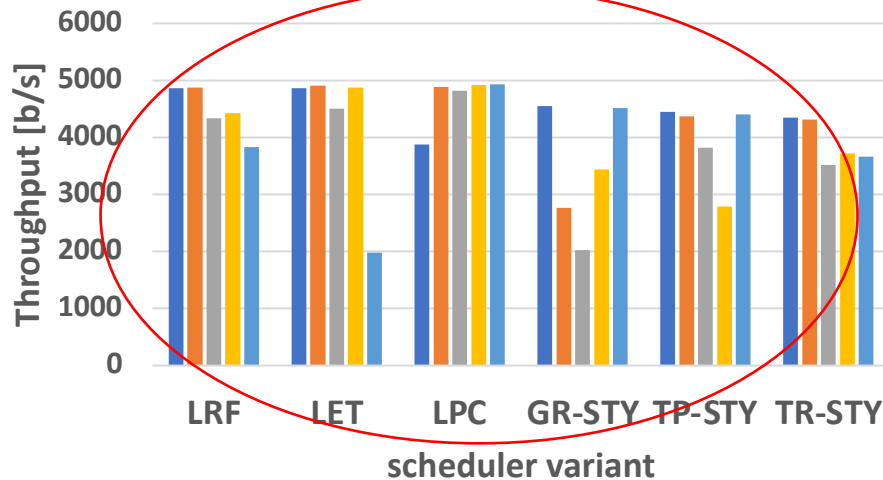


## ◆ Path properties

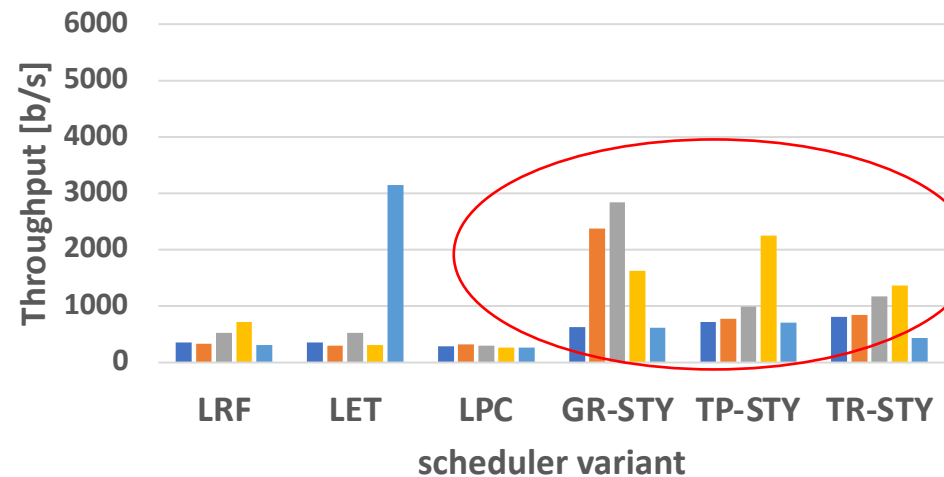
- Wi-Fi: RTT=80ms Loss= 0%
- LTE: RTT= 80ms Loss = 0%

◆ In scenario D, some video traffic still goes through Wi-Fi path

◆ If the RTT is similar, the number of path switching will increase and the video quality will degrade due to the occurrence of Head of line Blocking.



Throughput LTE



Throughput Wi-Fi



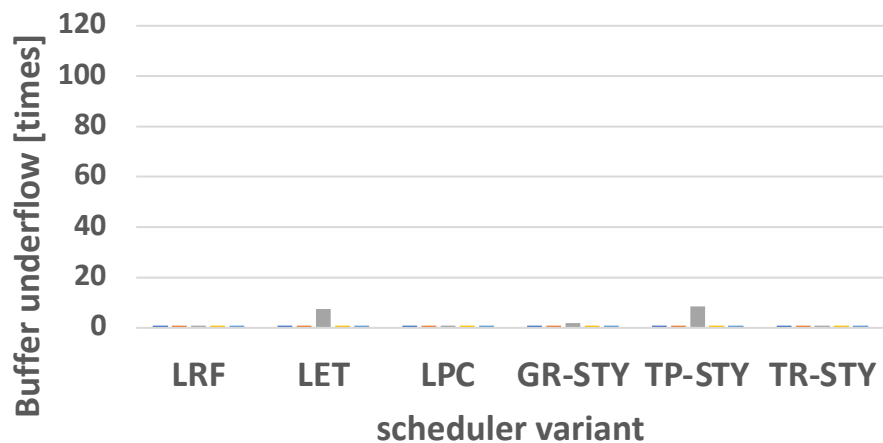
# Scenario E : video performance



## ◆ Path properties

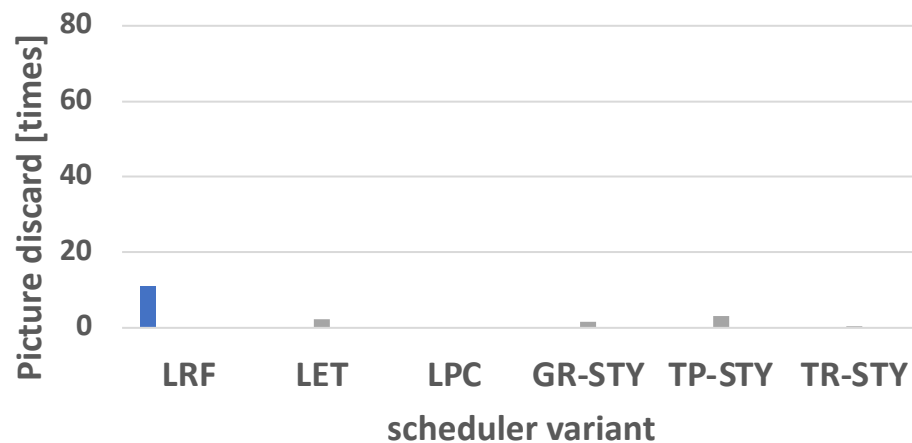
- Wi-Fi: RTT=80ms Loss= 6%
- LTE: RTT= 80ms Loss = 0%

## ◆ In scenario E, Video performance is excellent



■ Cubic ■ Compound ■ LIA ■ OLIA ■ BALIA

Buffer underflow



■ Cubic ■ Compound ■ LIA ■ OLIA ■ BALIA

Picture discard

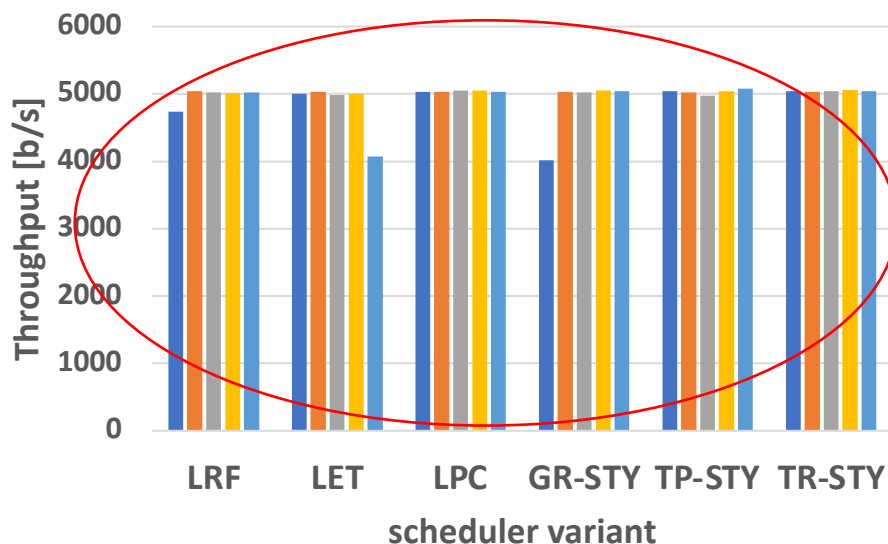
# Scenario E : throughput



## ◆ Path properties

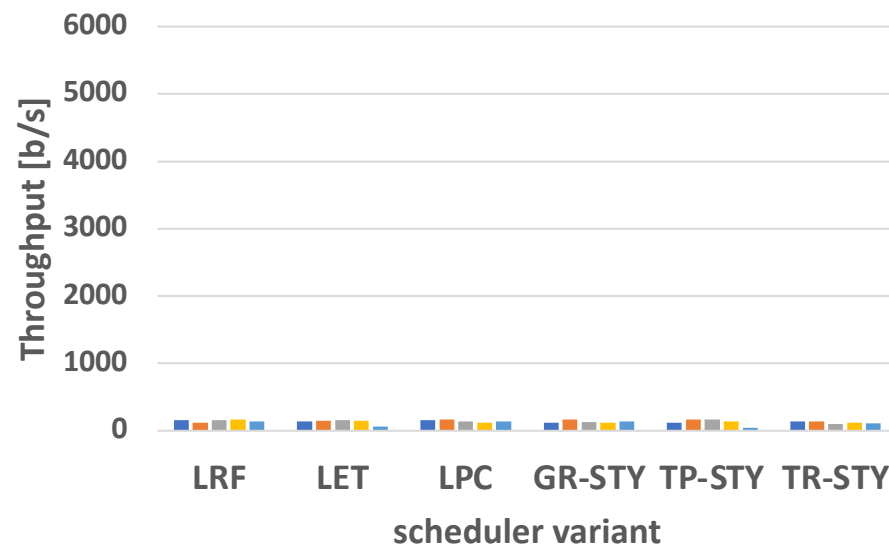
- Wi-Fi: RTT=80ms Loss= 6%
- LTE: RTT= 80ms Loss = 0%

◆ Even if the RTT is about the same, if there is packet loss in the Wi-Fi path, the window size will not increase and the Wi-Fi path will not be used.



■ Cubic ■ Compound ■ LIA ■ OLIA ■ BALIA

Throughput LTE



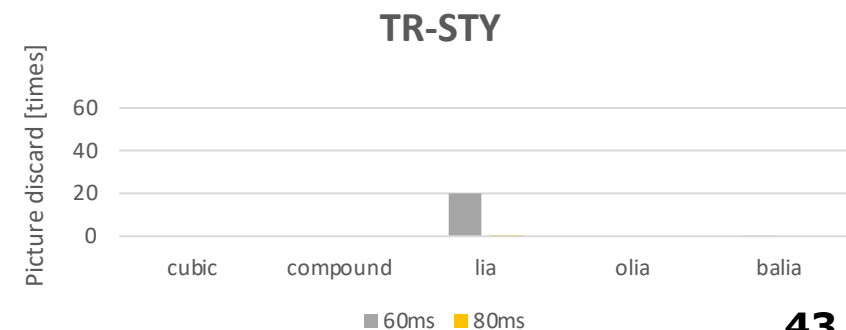
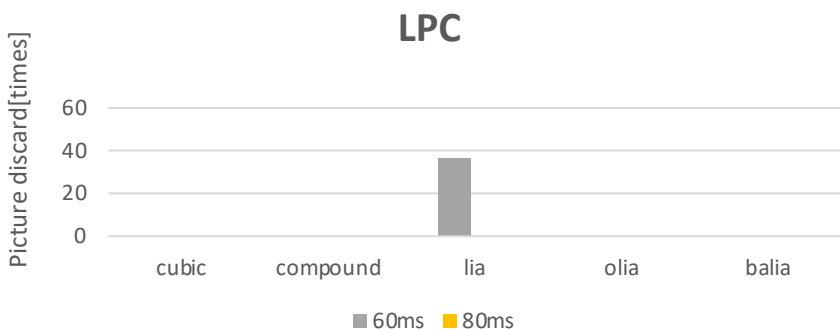
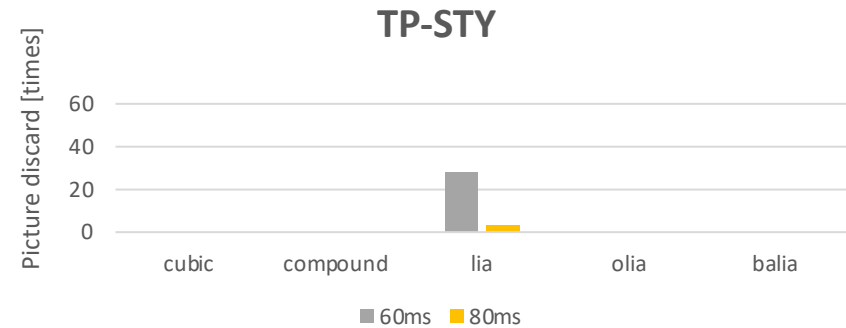
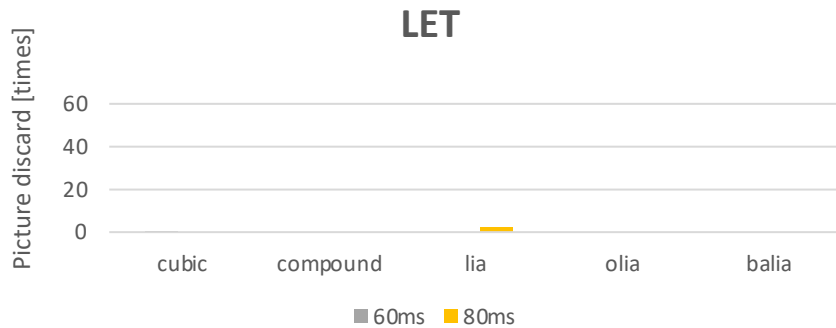
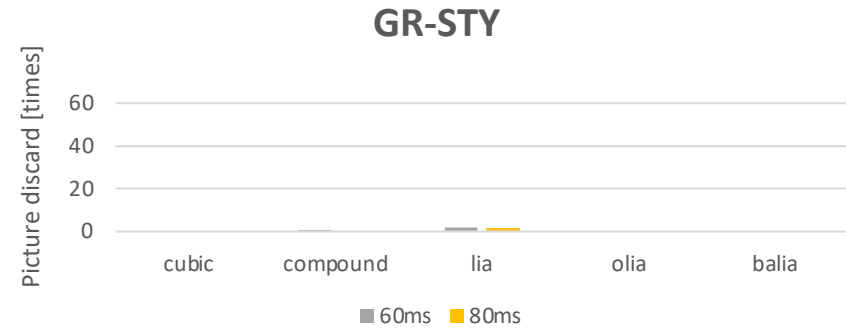
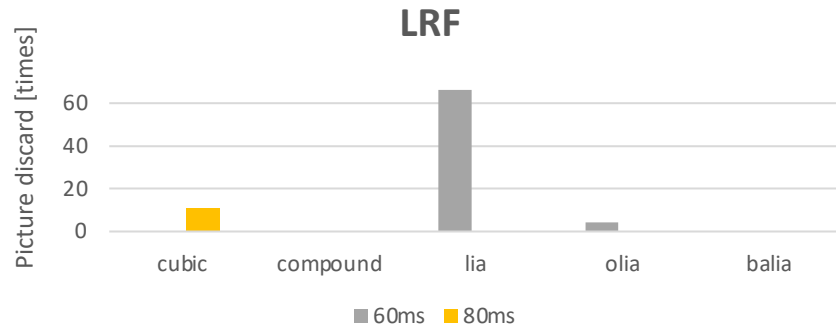
■ Cubic ■ Compound ■ LIA ■ OLIA ■ BALIA

Throughput Wi-Fi

# Results : evaluation



- ◆ Picture discard for **each scheduler** in scenario D and E
  - GR-STY and LET are good performance



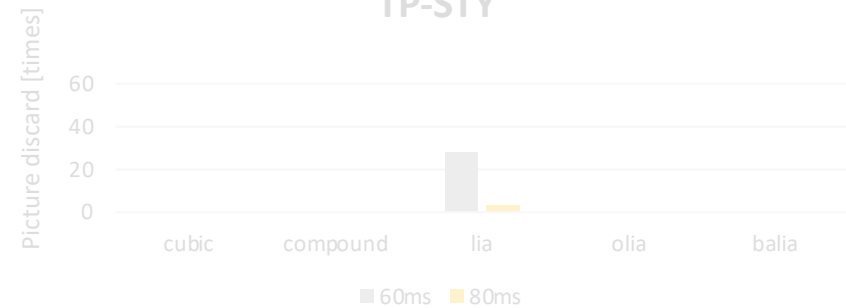
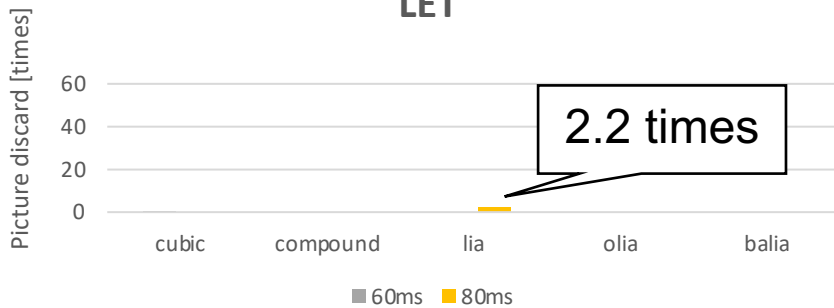
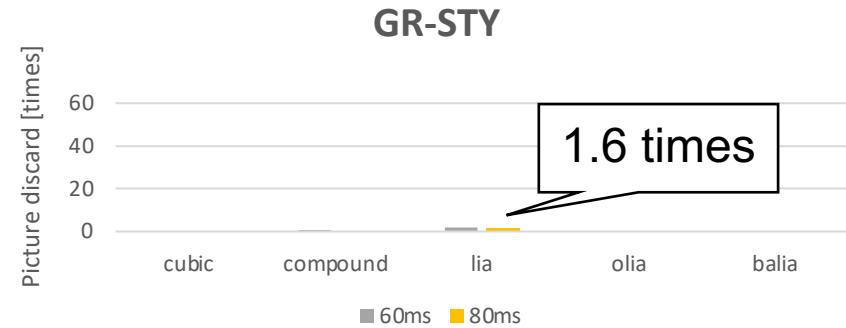
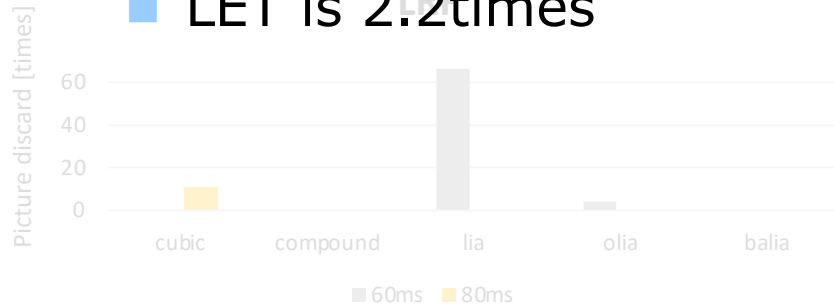
# Results : evaluation



◆ Picture discard for **each scheduler** in scenario D and E

■ GR-STY is 1.6times

■ LET is 2.2times

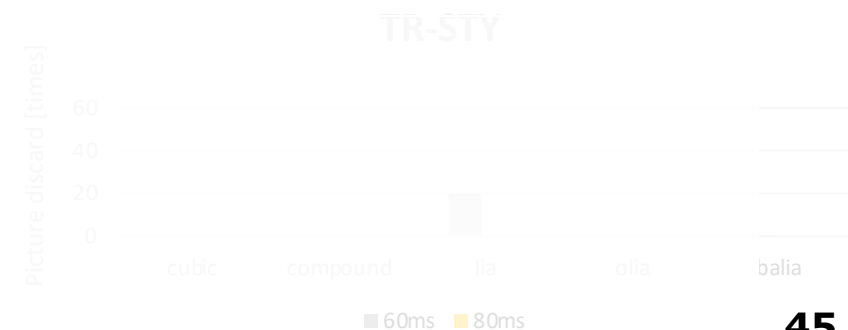
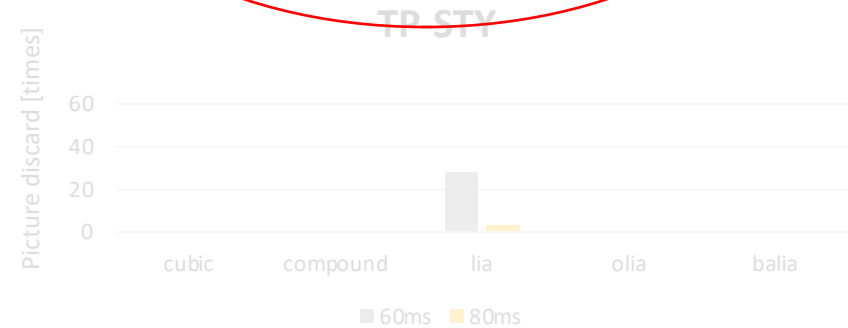
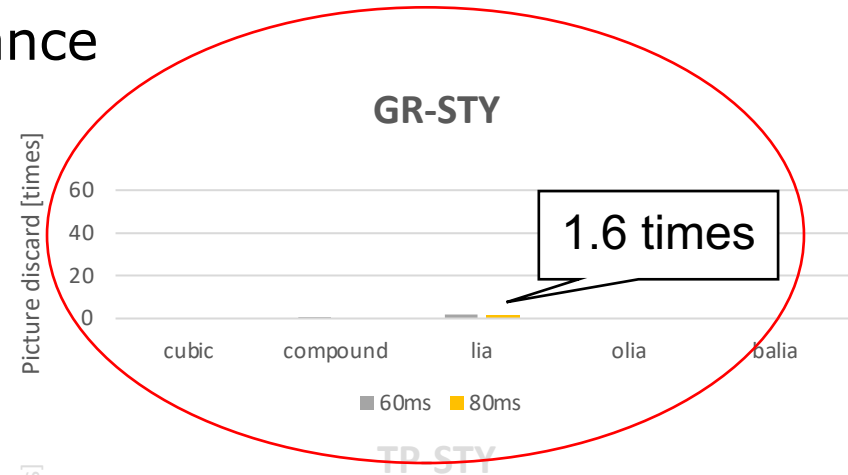
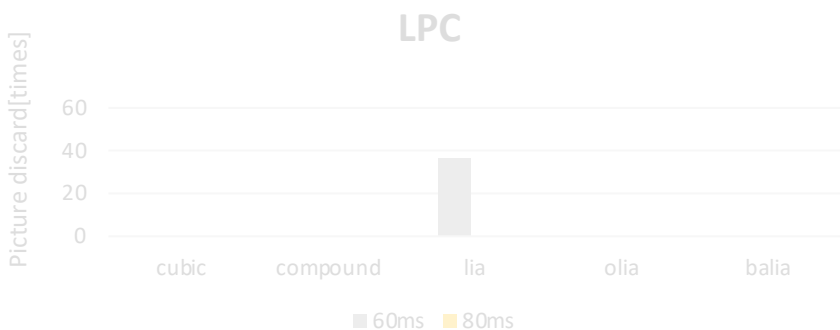
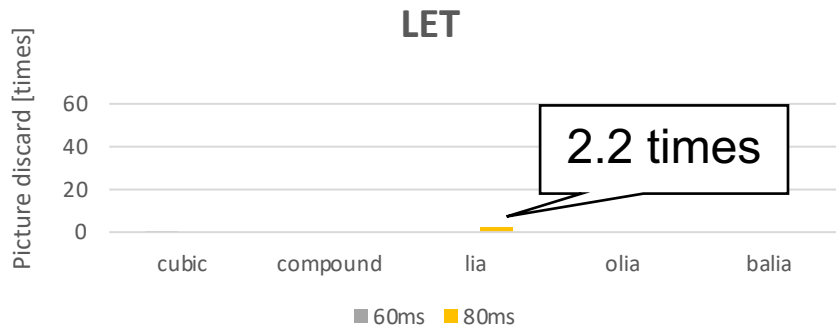
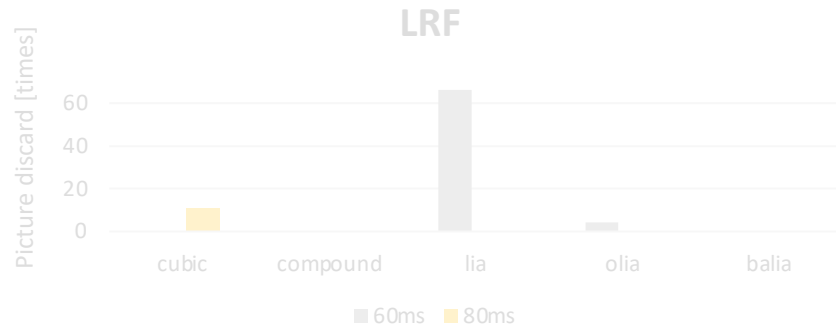


# Results : evaluation



◆ Picture discard for **each scheduler** in scenario D and E

■ GR-STY has the best performance

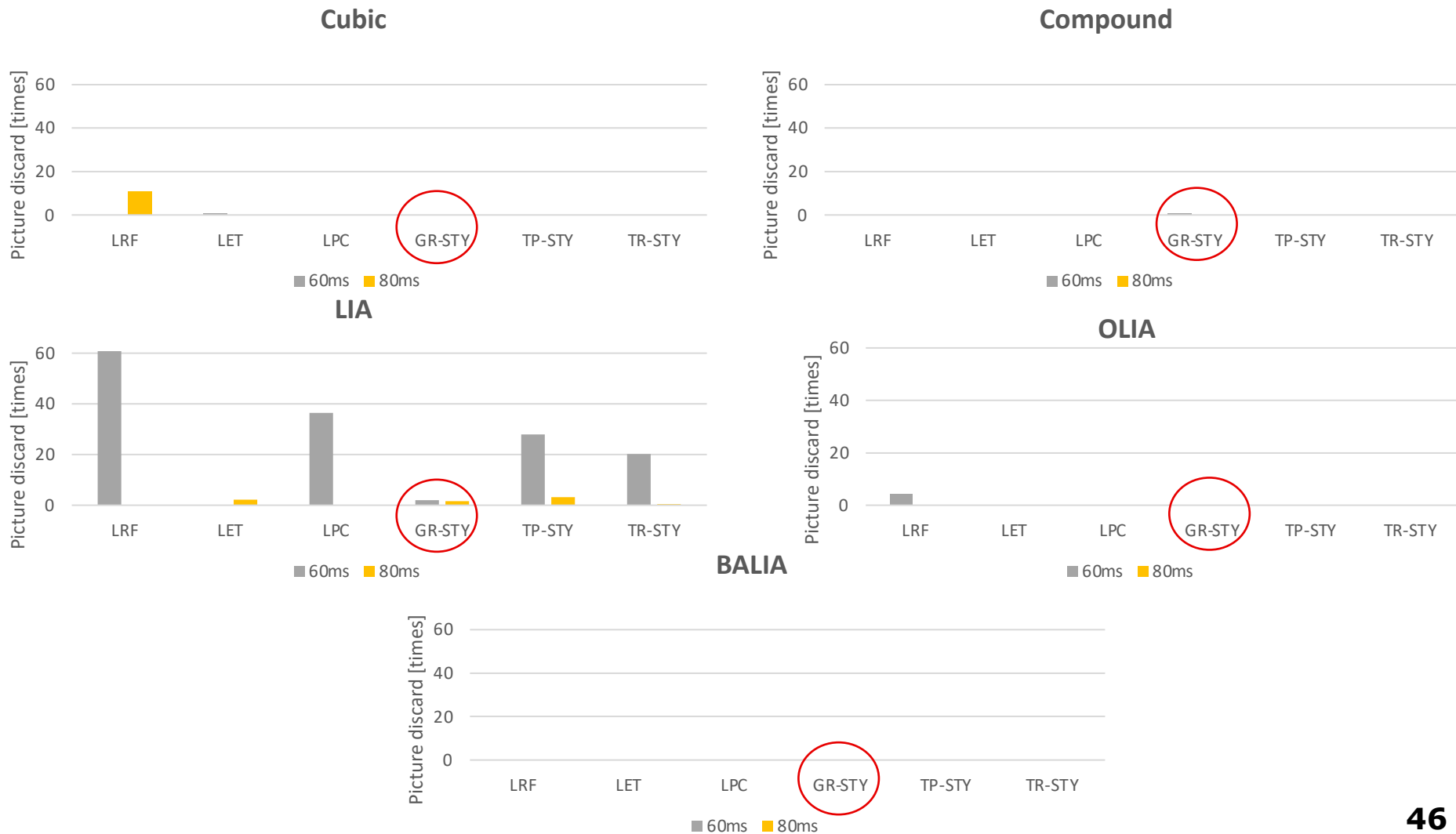


# Results : evaluation



## ◆ Picture discard for **each congestion control** in scenario D and E

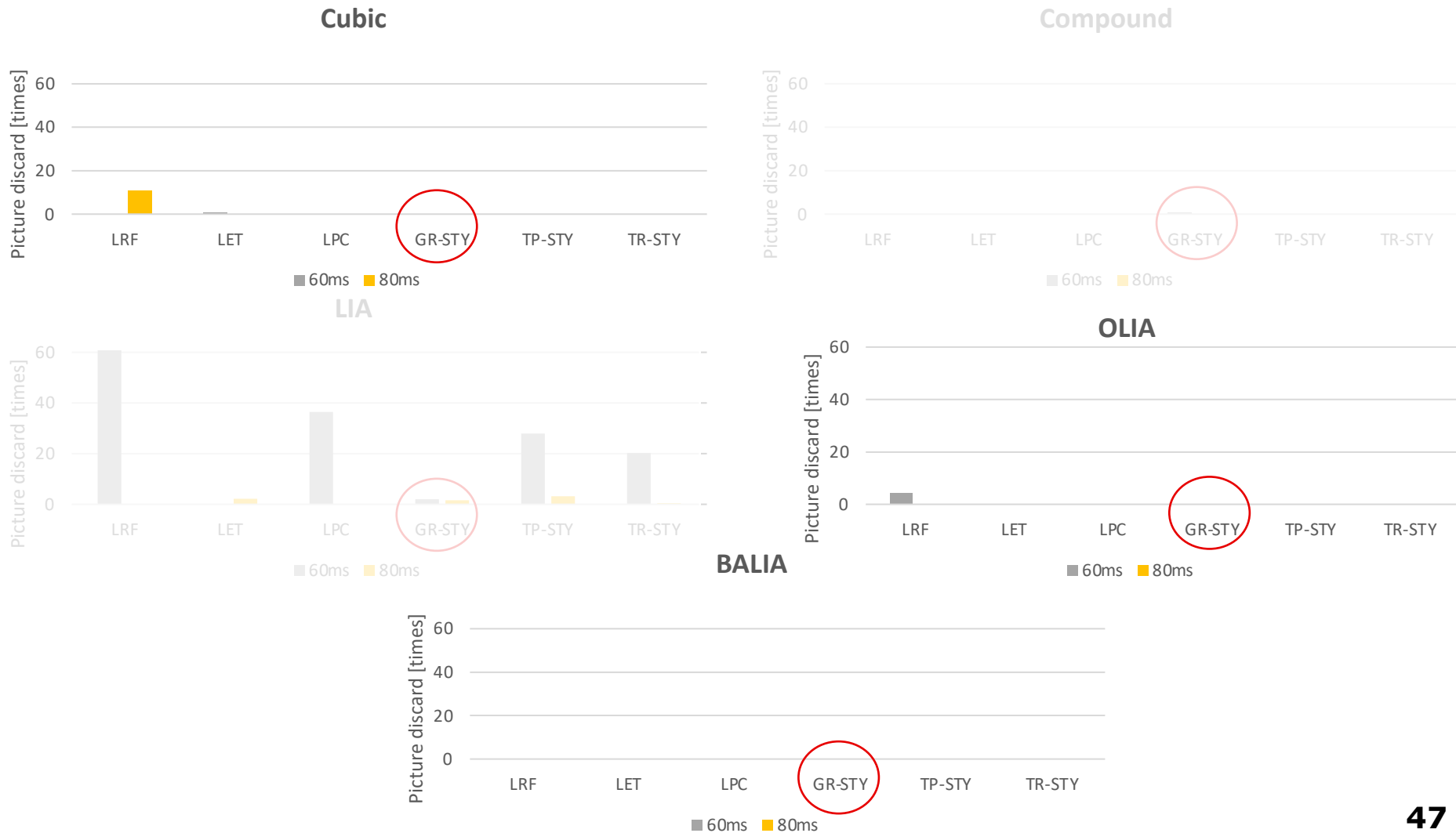
■ Focus on GR-STY



# Results : evaluation



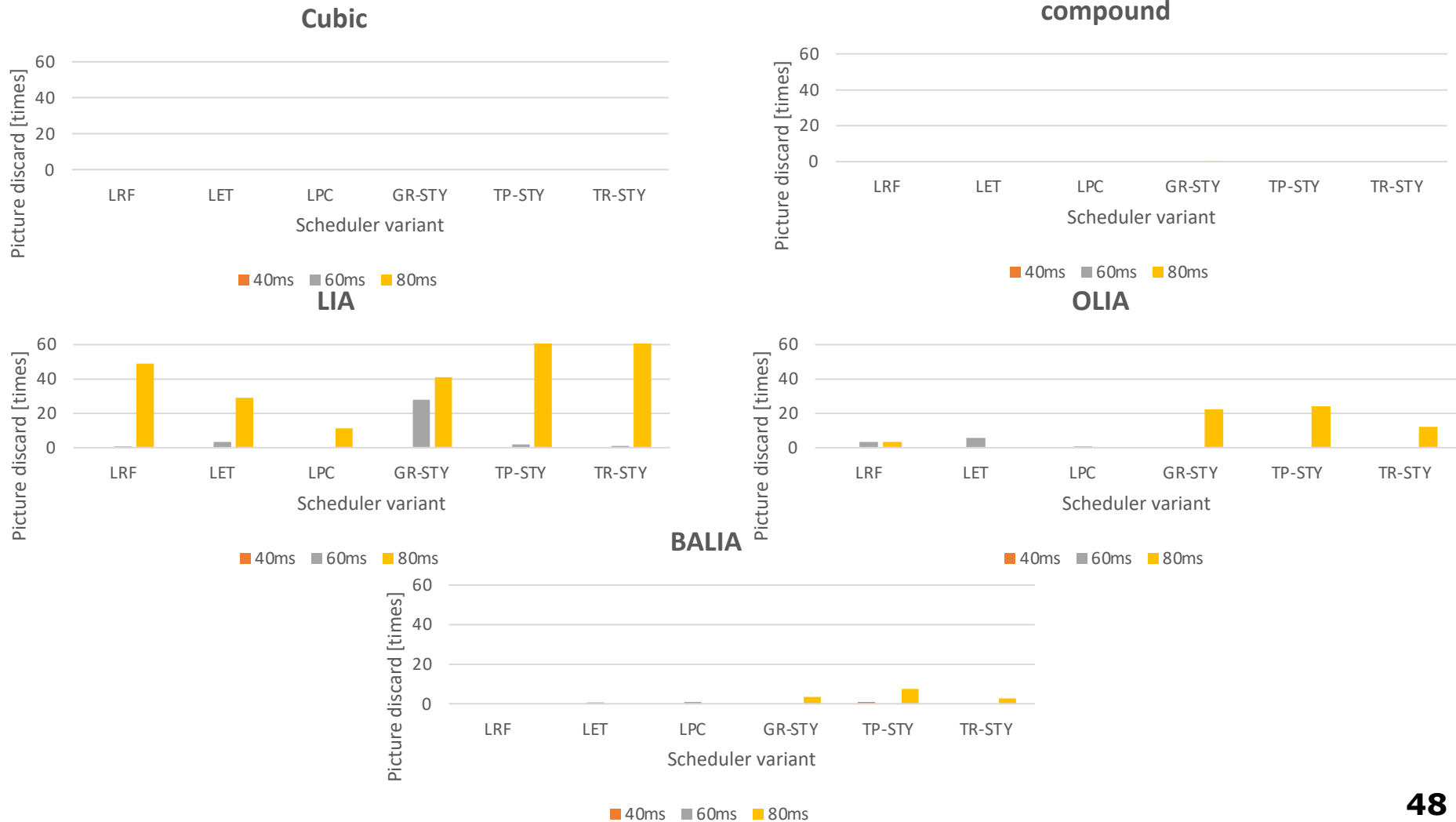
- ◆ Picture discard for **each congestion control** in scenario D and E
  - Cubic, OLIA and BALIA have the best performance



# Results : evaluation



- ◆ Picture discard for **each congestion control** in scenario A, B and C

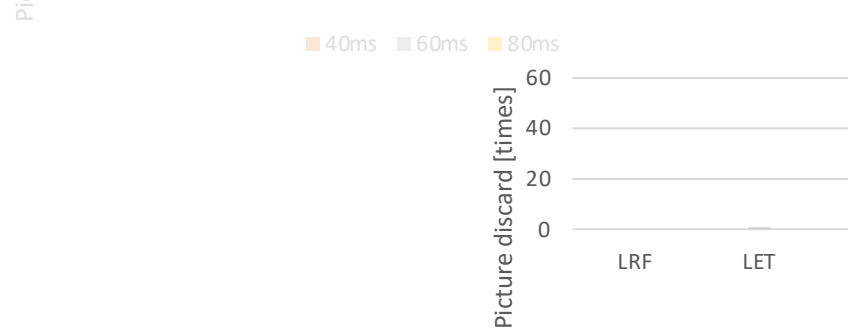
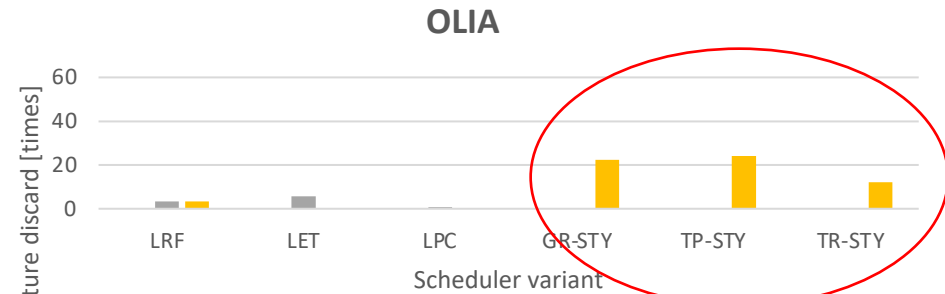
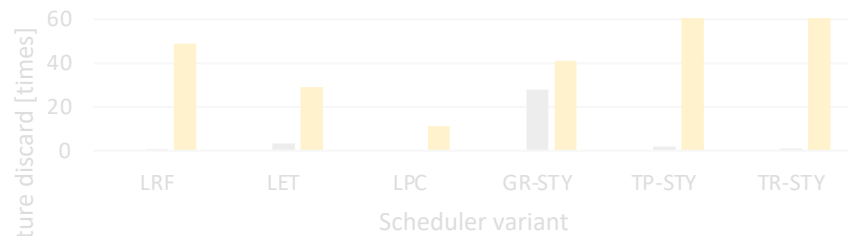
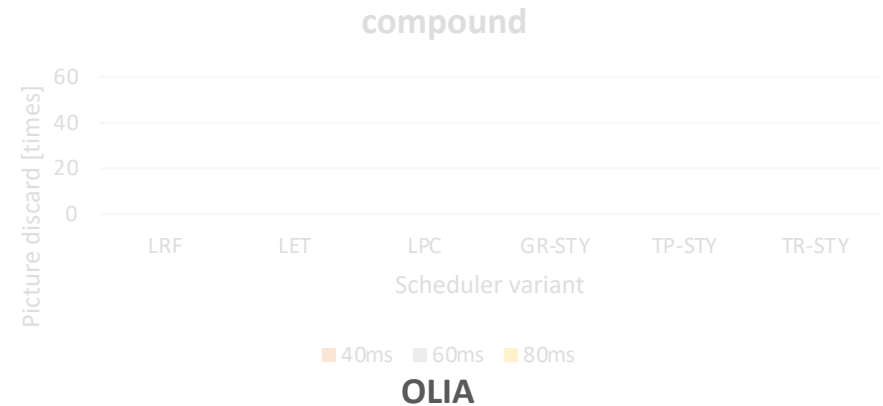
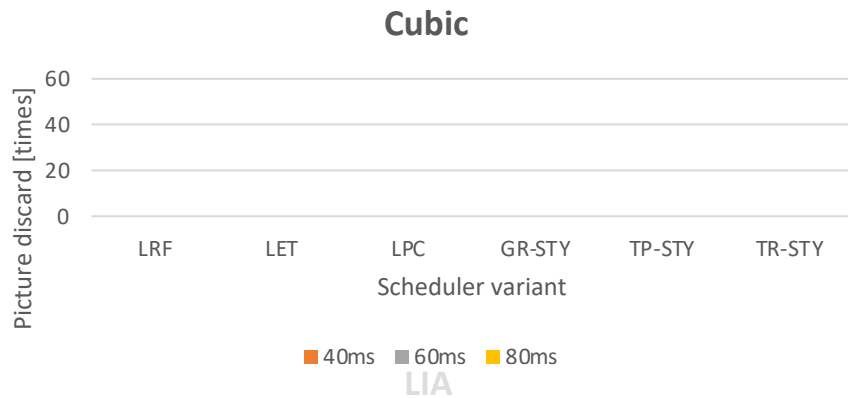




# Results : evaluation



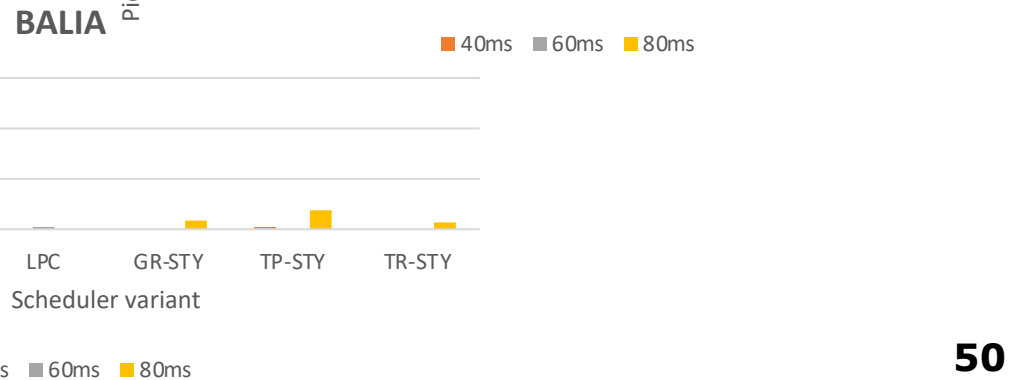
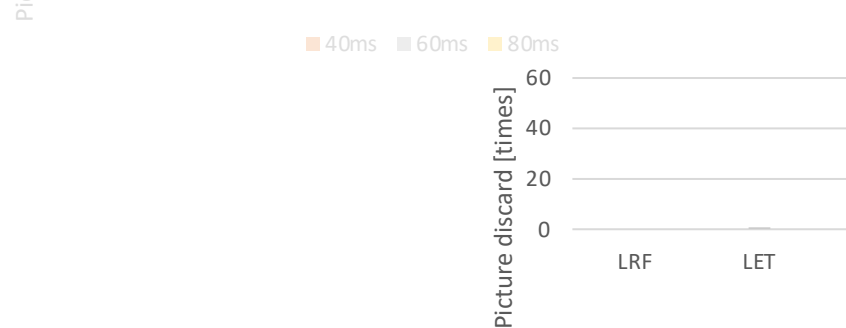
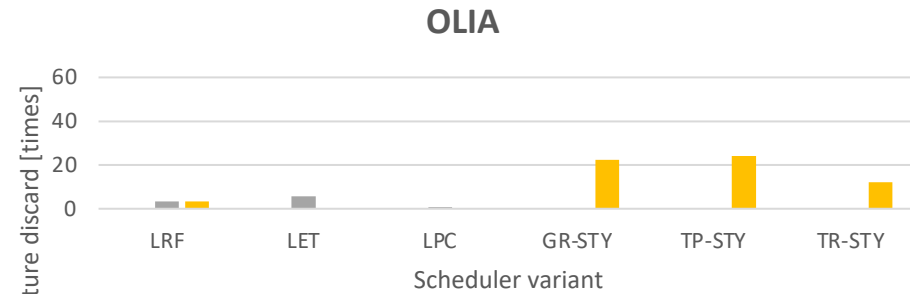
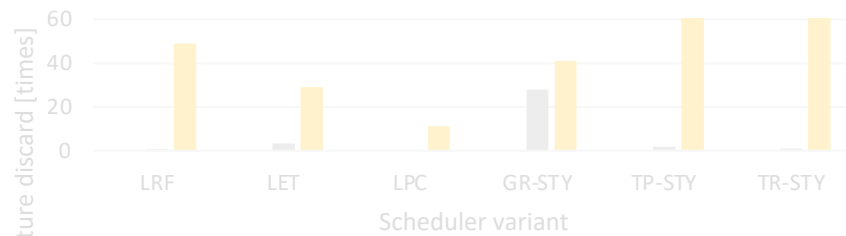
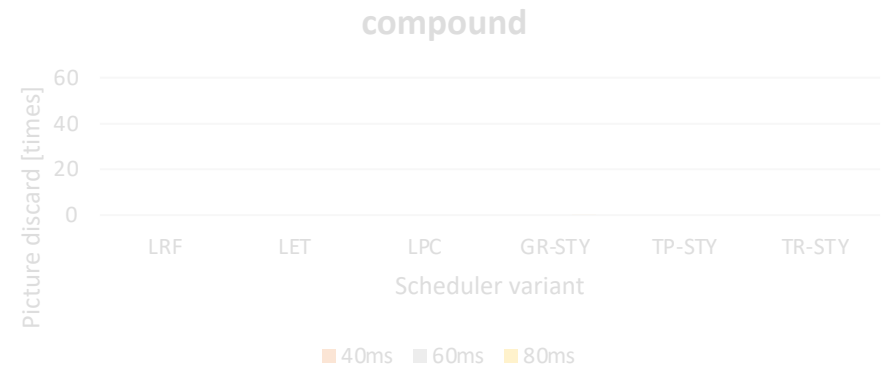
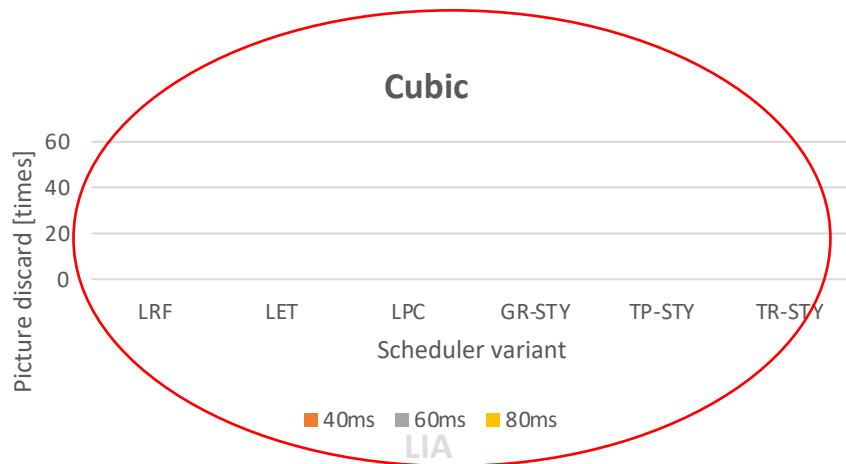
- ◆ Even though good performance of OLIA and BALIA in D and E, But bad performance of OLIA and BALIA



# Results : evaluation



◆ Cubic has the best performance in all scenarios



# Results : evaluation



- ◆ The best video streaming quality in the combination of **Cubic** and **GR-STY**
- ◆ We recommend that Cubic and GR-STY combination

# Conclusion



- ◆ In MPTCP video streaming, Head of Line Blocking occurs due to the difference in communication characteristics of each path, and the video quality is degraded
- ◆ Congestion control for each sub-flow and path scheduler are important factors for improving video quality.
- ◆ As the results, the combination of Cubic and GR-STY schedule is our recommended choice for MPTCP video streaming.