

# Application Layer QoS Metrics To Aid Network Performance Monitoring And Diagnostics For Encrypted Traffic

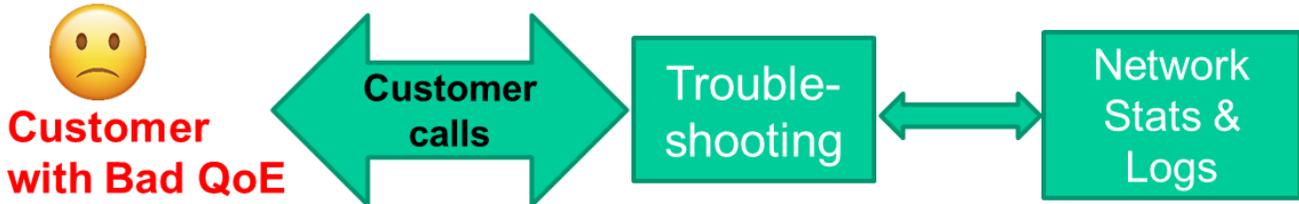
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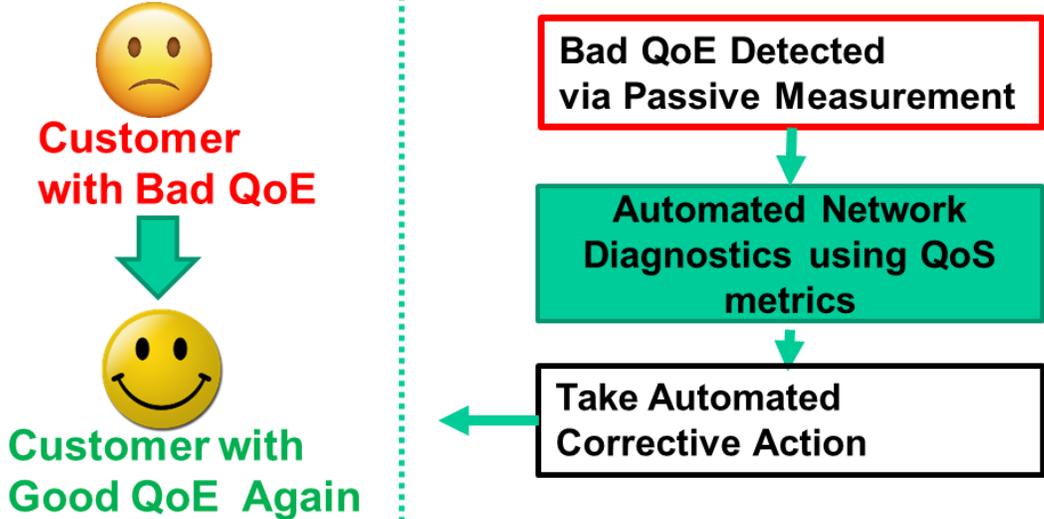
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# Motivation

## Current Approach: Reactive Customer Service



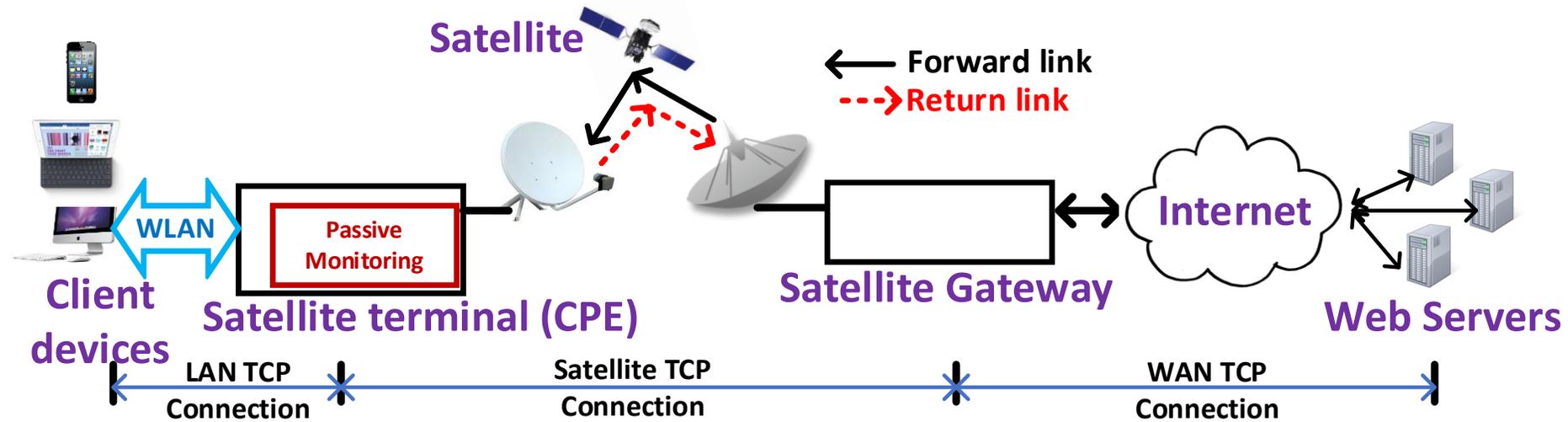
## Proposed Approach: Proactive Customer Service via Automated Network Diagnostics



# Existing Approaches

- ISPs monitor a huge list of metrics focusing on various aspects and different components of the networks.
  - Hardly any metrics that capture impact of network conditions on user applications and their quality of experience (QoE)
- Carry out active measurements on a subset of test terminals
  - Cannot be used for monitoring or detecting performance degradations.
  - Not feasible for a larger scale and for a continuous manner in a real operational network
  - May not detect network degradation experienced by customers at the time of measurement
- Follow a bottom-up manner, which starts with the metrics capturing the lower layer performance

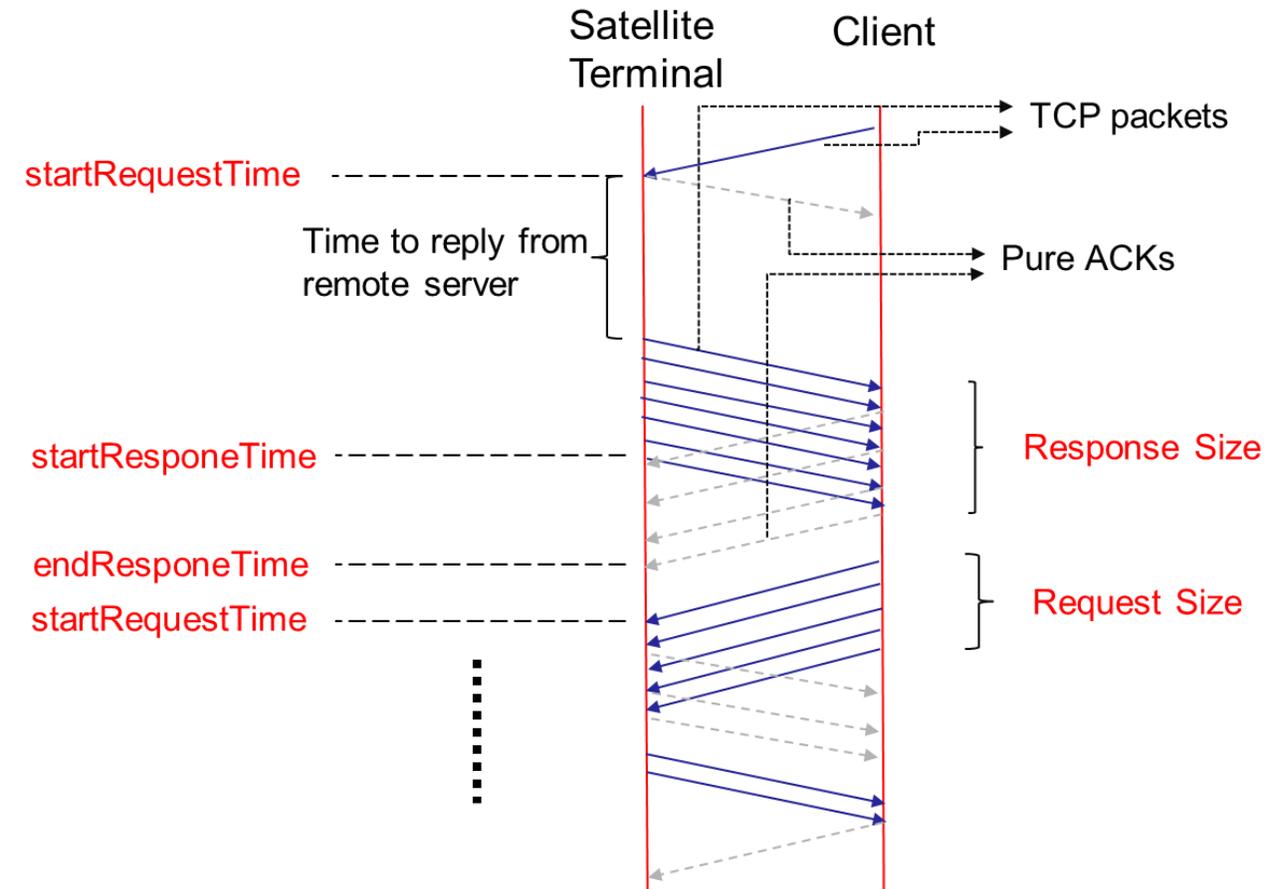
# Continuous Passive Monitoring of Application Layer QoS Metrics



- Does not require cooperation from users, instrumentation of user devices, and measurements hooks from the server or client applications

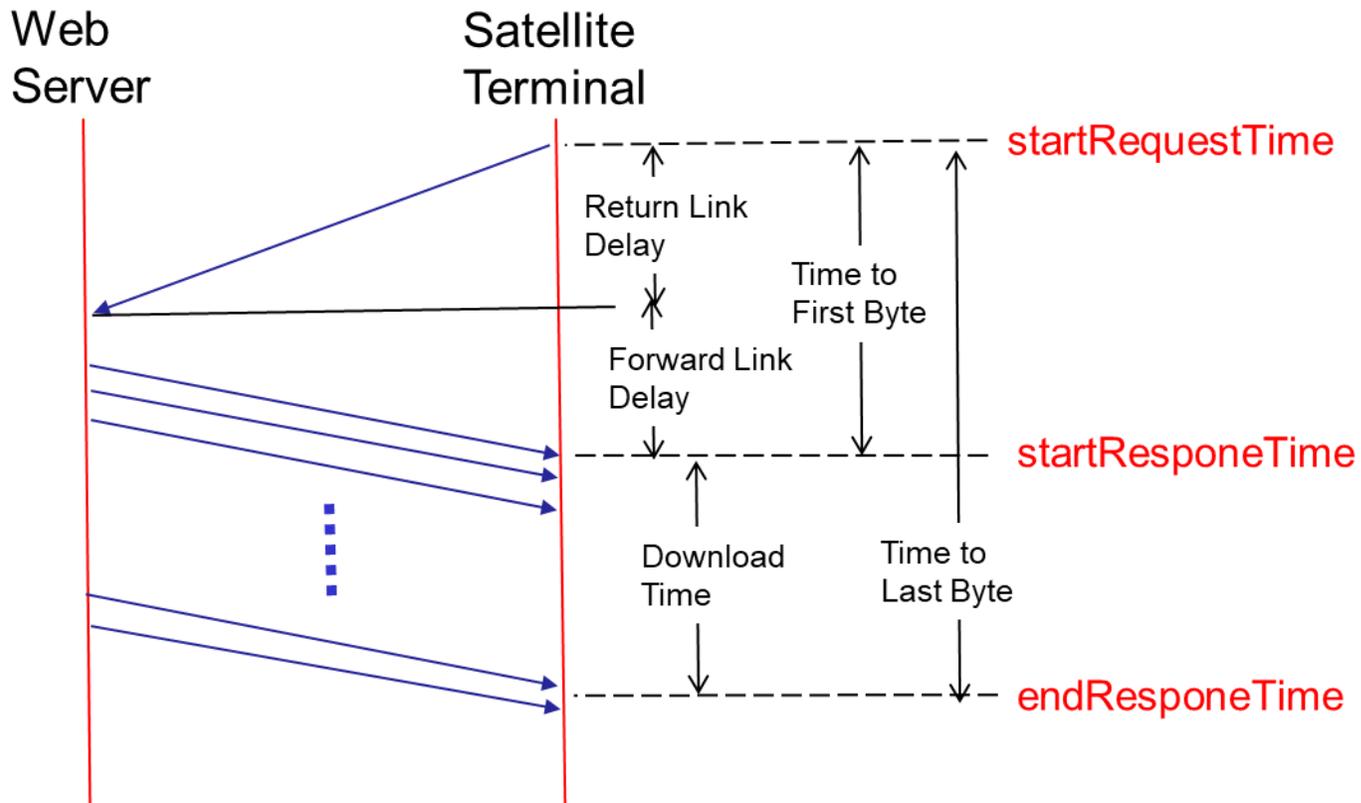


# Estimating Application Characteristics from TCP Layer Information for HTTPS



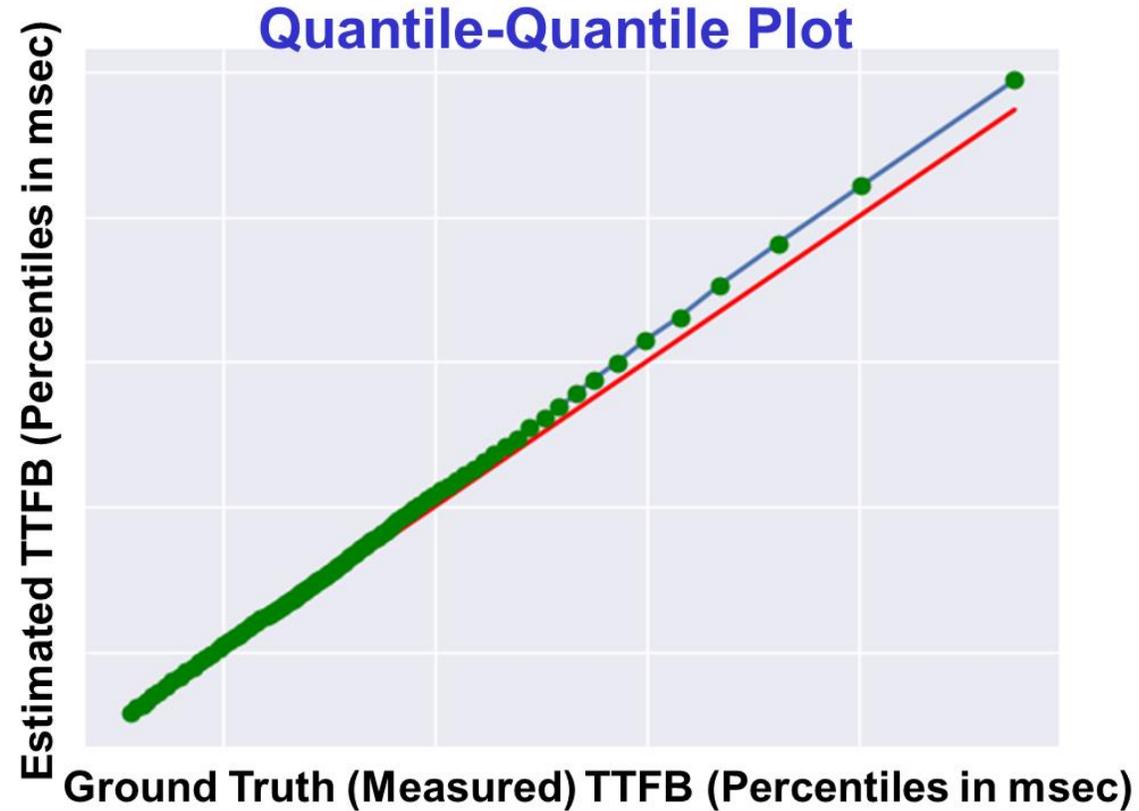
- Identify key events that are indicative of application layer behavior
- Use TCP state machine statistics for a TCP connection, or TCP header fields of packet exchanges in both directions
- Estimate start and end times and sizes of HTTP request and HTTP responses.

# Application Layer QoS metrics



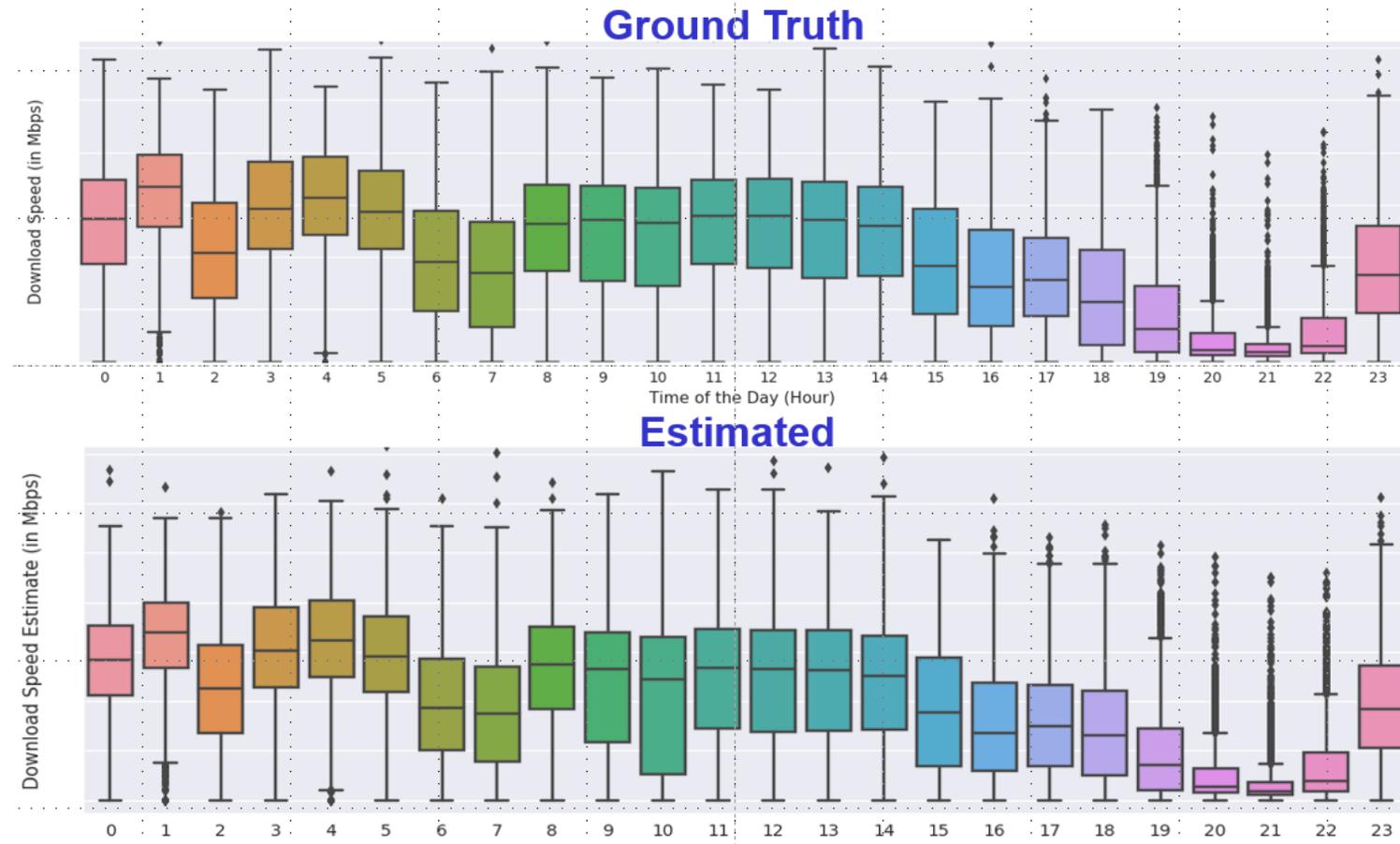
- Time to first byte (TTFB)
  - Time difference between the start of a HTTP request and the start of a HTTP response corresponding to the request, received at the satellite terminal
  - Impact interactive web browsing QoE
- Time to last byte (TTLB)
  - Time difference between the start of a HTTP request and the end of a HTTP response corresponding to the request, received at the terminal
  - Impact video streaming QoE
- Application layer download speed (DS)
  - Size of a response in bits divided by Time To Download for the response in seconds.
  - Impact bulk download QoE

# Validating Estimated Application Layer QoS Metrics: TTFB



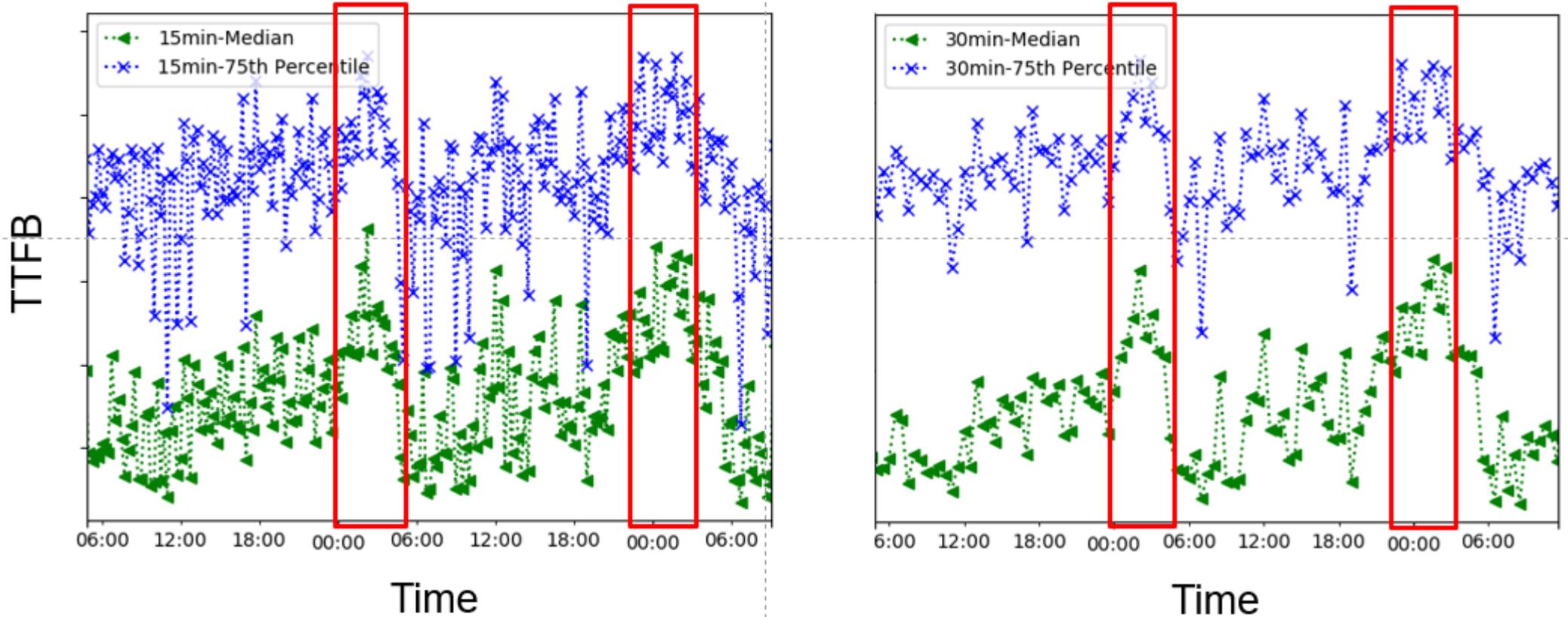
- Overall, the estimated TTFB values closely follow the distribution of the ground truth TTFB.
- Estimates more accurately for smaller TTFB values, but overestimates the ground truth for higher TTFB values

# Validating Estimated Application Layer QoS Metrics: DS



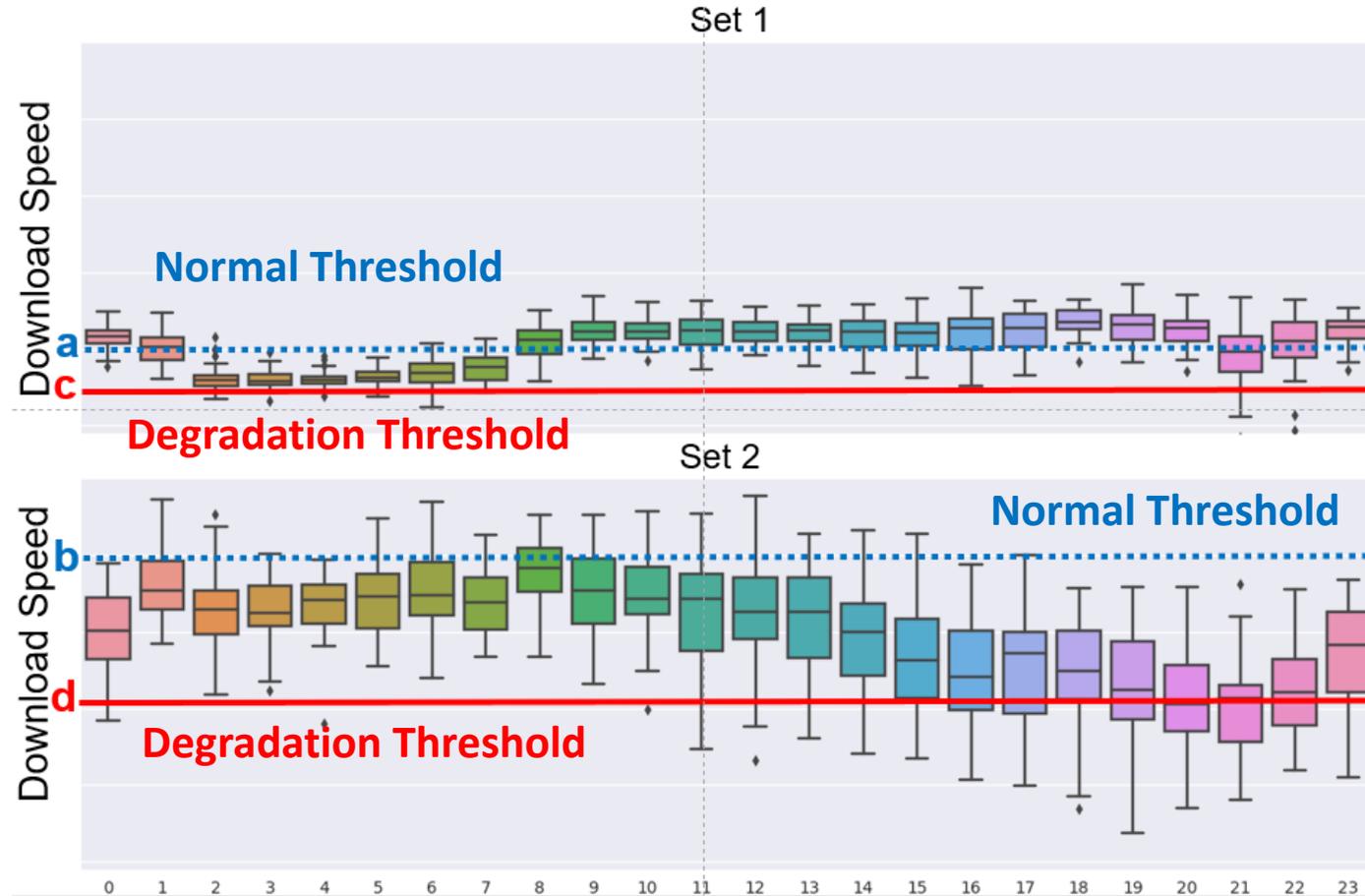
- Distribution of estimated DS is also close to that of ground truth DS

# Short window for on-demand and active measurement



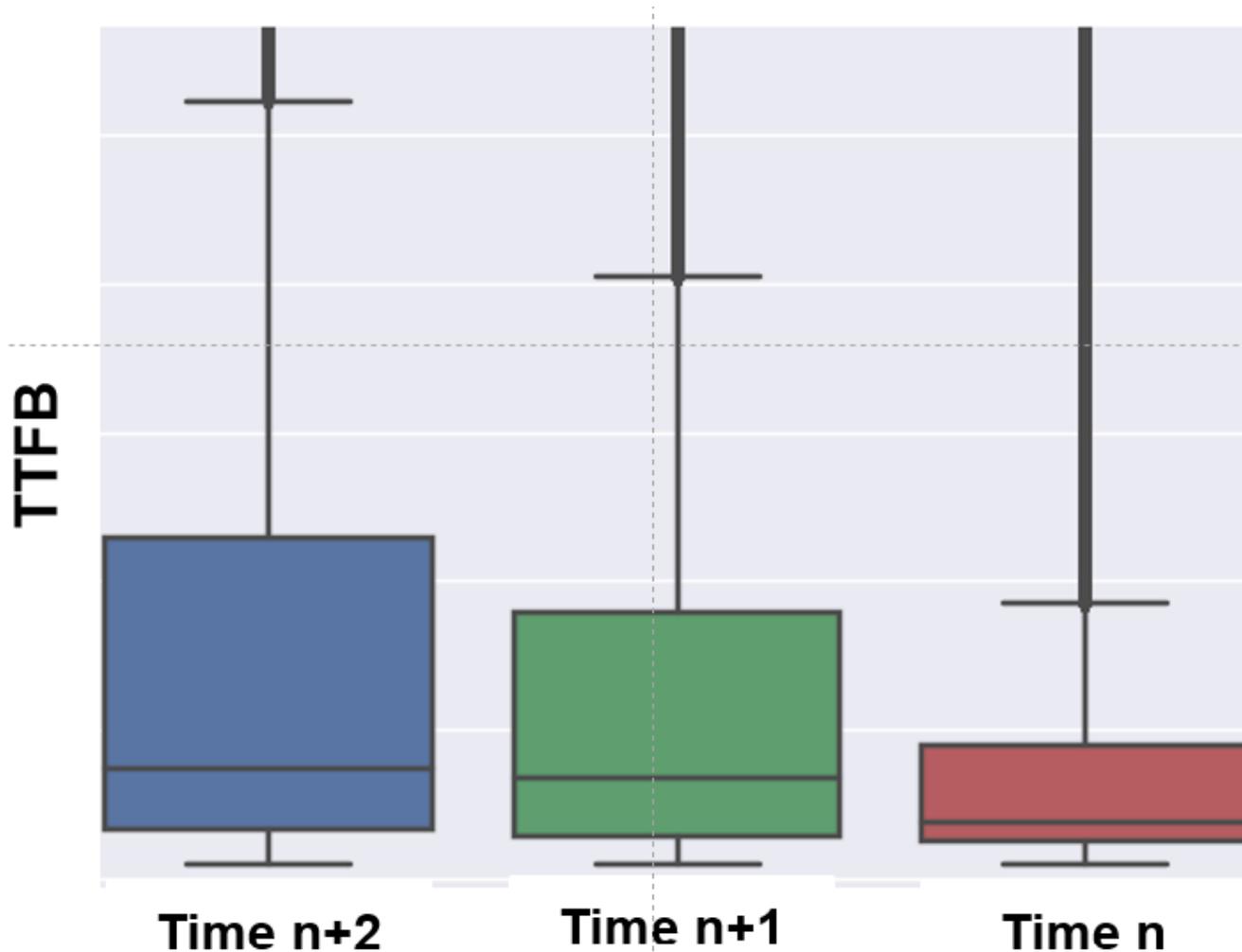
- Both median and 75th percentile of TTFB over the 15-minute window are sufficiently stable and similar to the values of the 30-minute window

# Detecting network performance degradation



- Two different thresholds represent two subscription plans with different data rates:  $a < b$  and  $c < d$
- Set 1 (Lower tier subscription)
  - Application layer DS meets or exceeds the target DS for most of the hours in the 24-hour period but comes close to degraded performance during 2-6 and 21-22 hours
- Set 2 (Higher tier subscription)
  - Target DS is rarely met but DS stay above degraded condition most of the time during the 24-hour period

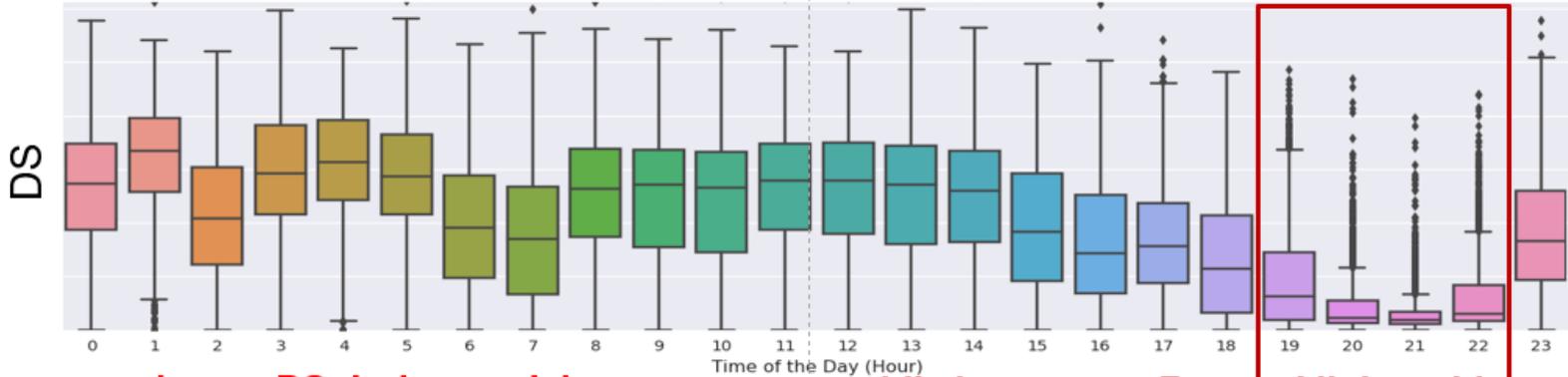
# Tracking trends in the network performance



- Evolution of TTFB values over three time periods from Time n, Time n+1 and Time n+2
- Increasing trend of the TTFB values indicates that the network performance is getting worse over time

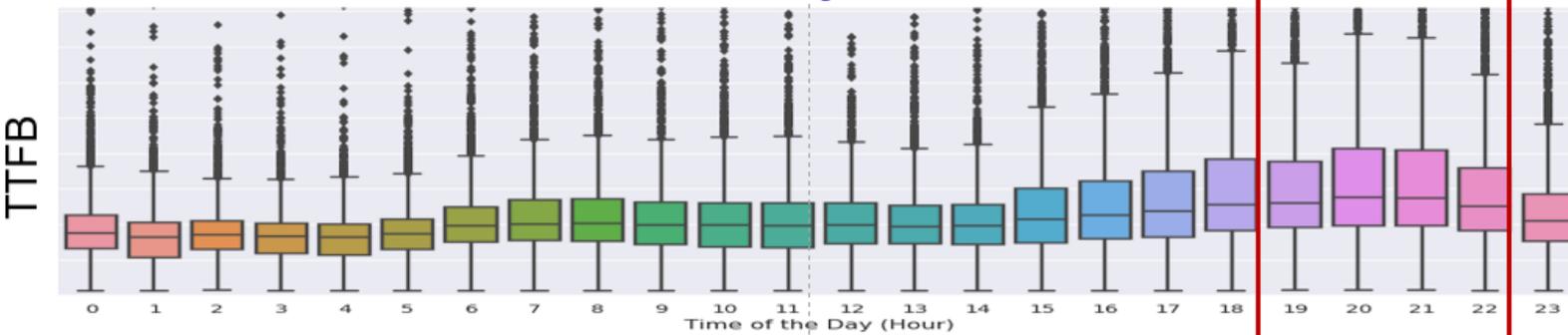
# Illustrative example of using DS and TTFB for network diagnostics

Application-Layer Download Speed QoS Metric



Lower DS during peak hours => Likely cause -> Forward link problem

Time To First Byte QoS Metric



TTFB only slightly higher during peak hours => Return link problem is unlikely cause

- Potential root cause of bad user's QoE can be degraded performance in forward link

# Conclusion

- A low complexity non-intrusive method is proposed to estimate application-layer Quality of Service (QoS) metrics experienced by end-users.
- Passively and continuously monitors user's traffic from a vantage point within the ISP network.
- Accurately capture the network conditions experienced by end user's devices or internet applications.
- Together with existing set of network statistics, provide more accurate network performance monitoring.
- Demonstrate that the metrics can be used for detecting degraded network performance and finding the root cause.
- Our top-down approach from user perspective complements the usual bottom-up technique using network component statistics and alerts.
- The concept can be extended to the new generation of encrypted traffic such as QUIC with more complex algorithms and with less accuracy.