# Prioritized Buffer Control in Two-tier 360 Video Streaming

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- Motivation and Technical Challenges
- □ Two-Tier 360V Streaming Solution
- Prioritized Buffer Control in Two-Tier 360V Streaming
- System Settings and Evaluations
- Experimental Results
- Conclusions and Future Work



# **Motivation**

#### Virtual Tour:



Sport:



# Show:

Gaming:

#### Entertainment:







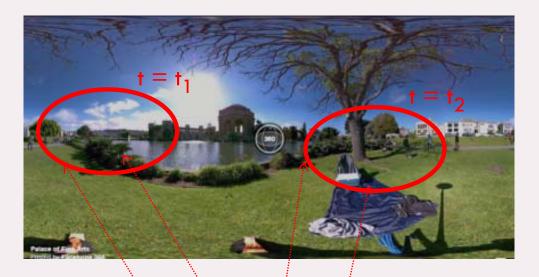




# **Technical Challenges**

# Challenge 1:Bandwidth Requirements

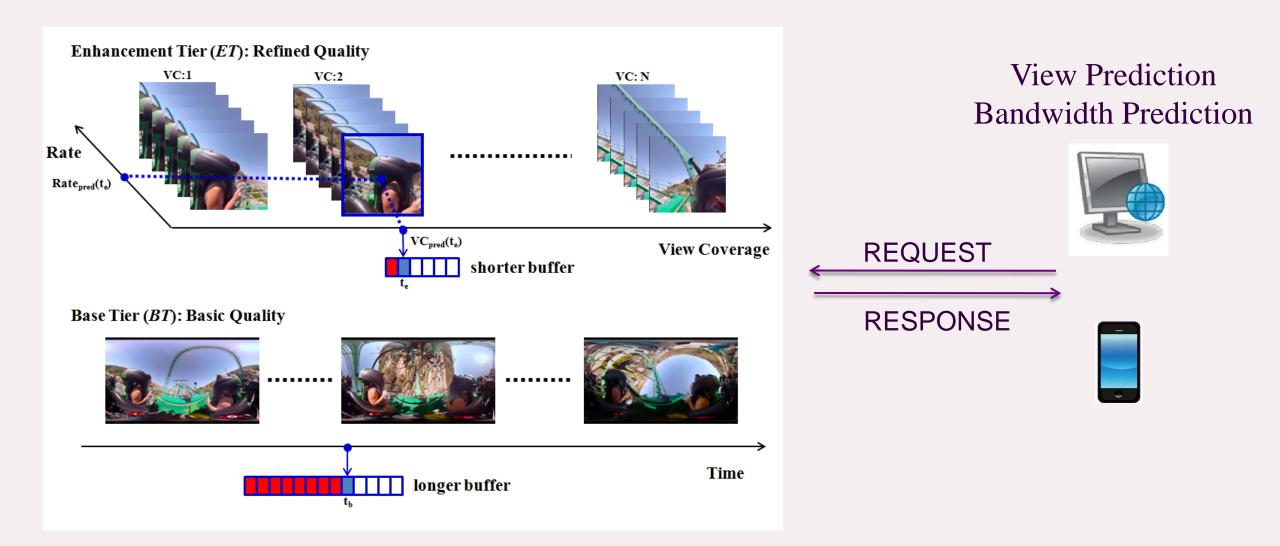
Challenge 2:
 User View Direction Dynamics





- Base tier streams chunks covering the entire 360 degree view in low quality with a long prefetching buffer.
- Enhancement tier streams chunks covering the predicted
  FoV with a short prefetching buffer.
- When the predicted FoV is correct and the enhancement tier chunks arrive on time, the viewer sees high quality.
- □ Otherwise, the viewer sees low quality.

# **Two-Tier 360V Streaming System**



**LAB** 

NYU TANDON SCHOOL OF ENGINEERING

# **Prioritized Buffer Control**



## **Prioritized Buffer-Based 360 Video Streaming**

Prioritized base-tier (BT) downloading to ensure video playback continuity.

If  $q^b(t) < q^b_{ref}$ , <u>ALWAYS</u> sequentially download base-tier chunks until sufficient

Proportional-Integral (PI) control-based enhancement-tier (ET) downloading to utilize residual bandwidth  $t_{t}^{(s)}$ 

Control Signal: 
$$u(k) = K_p \left( q^e \left( t_k^{(s)} \right) - q_{ref}^e \right) + K_I \sum_{t=0}^{\infty} \left( q^e(t) - q_{ref}^e \right)$$

Target Request Rate:  $\hat{R}(k) = \min\left[(u(k) + 1, ), \frac{\Delta(k)}{\tau}\right] \cdot \hat{b}(k)$ 

 $K_p K_I$  P-I-controllers

 $\langle q_{ref}^{b}, q_{ref}^{e} \rangle$  BT and ET target buffer lengths  $\langle q^{b}(t), q^{e}(t) \rangle$  BT and ET dynamic buffer lengths  $\hat{b}(k)$  Predicted bandwidth

- $\Delta(k)$  Remaining time of chunk k before display deadline
  - $\tau$  Video chunk duration

# **Prioritized Buffer Control**



## **Prioritized Buffer-Based 360 Video Streaming**

 $q^{e}(t)$  should be determined to balance the system robustness against network variation and the prediction accuracy.

In this work,  $q^{e}(t)$  is chosen based on video rendering rate metric:

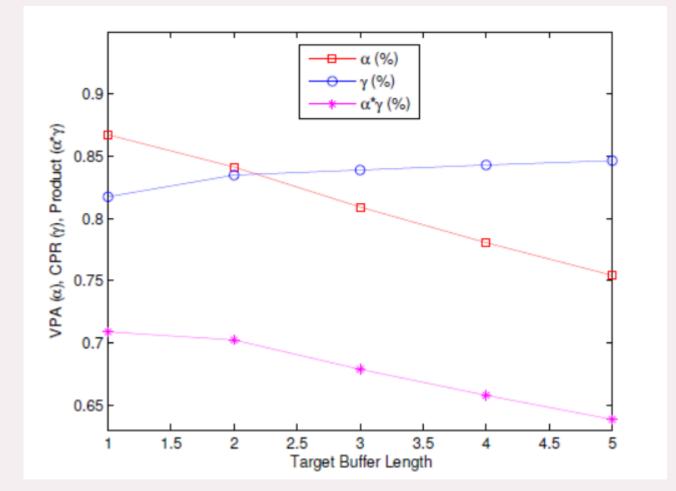
$$R_{VRR}(q_{ref}^{e}) = \frac{R_b}{A_b} + \alpha \cdot \gamma \cdot \frac{R_e}{A_e}$$

- $R_b$   $R_e$  BT and ET chunk bit-rates
- $A_b$   $A_e$  BT viewing area (i.e., 360V full scope), ET viewing area (i.e., FoV coverage area)
  - α View Prediction Accuracy (VPA), i.e., the average overlapping ratio between the predicted view coverage and user's actual FOV.)
  - $\gamma$  Chunk Pass Rate (CPR), i.e., the likelihood that a requested chunk can be delivered before its display deadline.

# **Prioritized Buffer Control**



### **Prioritized Buffer-Based 360 Video Streaming**



The ET target buffer length that maximizes the product of *VPA* and *CPR* should maximize the delivered video rendering rate, and therefore maximize the user end average video quality.



# **System Settings and Evaluations**

## Videos:



Two test videos are used: "MegaCoster" and "Amsterdam"

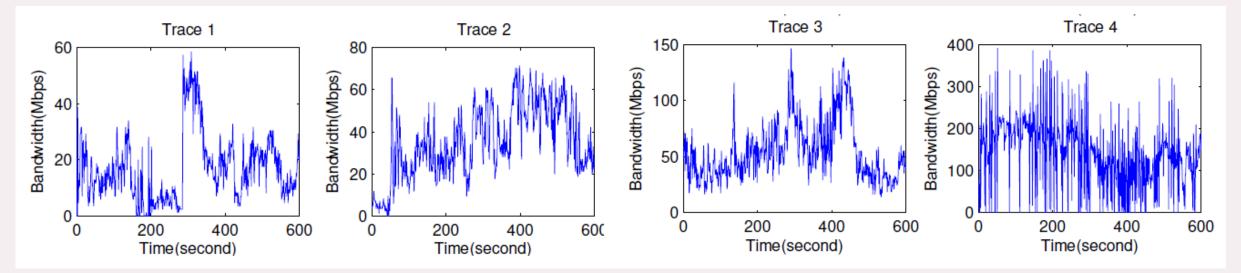
Each chunk is horizontally partitioned into 12 overlapping *ET* viewports and vertically partitioned into 3 overlapping *ET* viewports, each covering  $120 \times 90$ degrees.

The *ET* chunks encodes the difference signal between original 360 video and the *BT* low-rate video in three different bitrate settings  $R_1$ ,  $R_2$  and  $R_3$ .



# **System Settings and Evaluations**

## Network Bandwidth Trace:



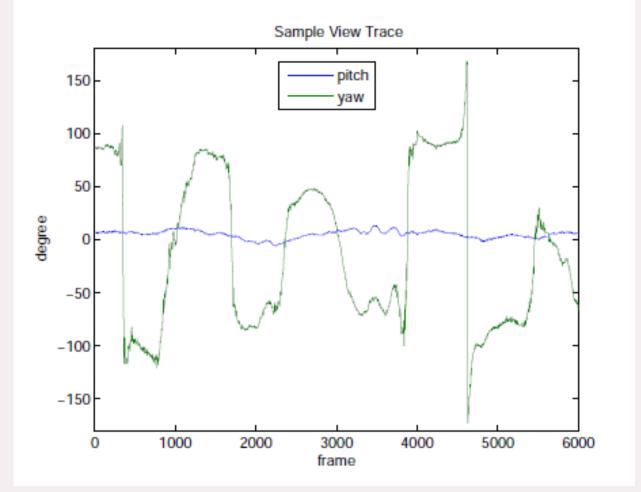
Sample Network Trace. Collected over a 3.5G HSPA<sup>[3]</sup> cellular network to represent the most typical bandwidth variations in a cellular environment. Scaled up to mimic the 4K-30Hz-8-bit 360 degree video bitrate range (e.g., up to 400 Mbps).

[3] E. Kurdoglu, Y. Liu, Y. Wang, Y. Shi, C. Gu, and J. Lyu. "Real-time Bandwidth Prediction and Rate Adaptation for Video Calls over Cellular Networks," IACM Multimedia Systems Conference, 2016.



# **System Settings and Evaluations**

# □ View Direction Trace Collection:



## Sample View Trace.

Collected From 4 users wearing a Google Cardboard with a Motorola Nexus-6 smart-phone playing our test 360 videos. Motion data (yaw, pitch, roll) captured through head tracker program.



**Bandwidth Prediction:** 

The sustainable transmission rate for the next chunk set to the average throughput for downloading the last received chunk (from either BT or ET).

□ View Prediction:

The desired viewport center for the incoming video chunk is linearly predicted based on the past 30 samples collected from the client.

# **Evaluation Metric**



# Delivered Video Rendering Rate (*VRR*)

$$VRR(n) = w_b \cdot R^b(n) + w_f \cdot R^e(n)$$

## $R^{b}(n) R^{e}(n)$ Delivered BT and ET bitrate for chunk n

- $w_b$  Overlapping portion of the desired FOV and the 360 view decoded from the BT (in our setting, 1/6)
- $W_f$  Overlapping portion between the ground-truth FOV per frame and the VC of the downloaded ET chunk.

# □ Video Freeze Ratio (*VFR*)

The percentage of total time that video buffer underflows (i.e. no bits are available for the user FOV at the display time).



Benchmark 1 (*BS1: All-360*): simulates the conventional
 DASH streaming framework, in which videos in the entire
 360 view range are pre-encoded using multiple rates.

Benchmark 2 (BS1: FoV Streaming): pre-codes view coverages with the same settings as our enhancement-tier only but coded directly with multiple rates.

# **Performance Evaluation**



Network Trace	1	1	1	2	2	2
Solution	BS1	BS2	TTS	BS1	BS2	TTS
RollerCoaster	2.8/12%	10.8/27%		5.9/4%	27.0/10%	21.1/4%
Amsterdam	2.8/12%	10.5/25%		5.9/4%	27.3/10%	22.3/3%
Network Trace	3	3	3	4	4	4
Solution	BS1	BS2	TTS	BS1	BS2	TTS
RollerCoaster	9.0/1%	40.2/2%	36.6/0%	23.0/0%	93.1/8%	108.0/0%
Amsterdam	9.0/1%	39.3/2%	36.1/0%	23.0/0%	91.5/7%	106.3/0%

Performance Comparisons: Average Video Rendering Rate (Mbps) / Video Freeze Ratio (%)

Compared with *BS1*, a 3.7x gain in delivered VRR is achieved on average.
 Much lower video freeze ratio compared with benchmark solutions.
 Demonstrated the potentials and advantages over conventional solutions.

- □ In this work, a two-tier 360V streaming framework with prioritized buffer control is proposed.
- The proposed framework simultaneously handles both network variations and user viewing direction dynamics.
- We plan to further optimize the network and view prediction methodologies and implement the end-to-end system and incorporate perceptual quality evaluation.