#### Adaptive Streaming of Interactive Free Viewpoint Videos to Heterogeneous Clients

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### Introduction





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### Free-viewpoint Video



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### Multi-view Plus Depth (MVD)

Left Reference View (Texture + Depth)



Example: 2-view plus depth

Right Reference View (Texture + Depth)







Synthesized View 1

1 Synthesized View 2

Synthesized View 3











## FVV Streaming is Challenging

#### FVV streaming

- multiple video streams (multiple views, multiple components)
- rendered frames are the result of a view synthesis process from received components

#### Complex rate adaptation

- quality of rendered video stream is dependent on the qualities of component streams used as references in the view synthesis process
- changes in components' bit rates do not equally contribute to the quality of the synthesized video



### Problem

Given current viewpoint position and available network bandwidth

- which reference views should be requested?
- which representations for each (texture and depth) component should be downloaded?

Objective:

• Maximize quality of rendered virtual views at the client side



### **Proposed Solution**

#### Two-step approach

- Determine set of reference views to be requested from server in order to render target viewpoint
- Decide on the representations for the segments of the scheduled views' components
- Terminology





### Reference View Scheduling

#### Predict + Pre-fetch

- periodically record user's viewpoint position
- use navigation path prediction techniques to extrapolate future position
- pre-fetch additional reference view if necessary



### Reference View Scheduling

- Viewpoint position prediction
  - Dead reckoning
- Steps:
  - View switching velocity  $v(t) = (x(t) x(t \Delta))/\Delta$
  - Smoothing

$$v'(t) = \theta \cdot v(t) + (1 - \theta) \cdot v'(t - \Delta)$$

• Prediction

$$x(t+\tau) = x(t) + v(t) \cdot \tau$$





#### Virtual View Distortion Model





### Virtual View Quality-Aware Rate Adaptation

#### • Use virtual view quality models to guide the rate adaptation process

- Empirical models  $\rightarrow$  (M 1)KL<sup>4</sup> decode-synthesize iterations
- Analytical models → faster to obtain, less overhead, near optimal quality
- Relation between reference views quality/bitrate and quality of synthesized virtual view

$$D_v = \lambda D_t^L + \mu D_d^L + \nu D_t^R + \xi D_d^R + c$$



### Virtual View Quality-Aware Rate Adaptation

- For each supported virtual view position
  - Solve system of linear equations to obtain model coefficients

$$\begin{pmatrix} D_{t\ 1}^{L} & D_{t\ 1}^{R} & D_{d\ 1}^{L} & D_{d\ 1}^{R} & 1 \\ D_{t\ 2}^{L} & D_{t\ 2}^{R} & D_{d\ 2}^{L} & D_{d\ 2}^{R} & 1 \\ \vdots & \vdots & \vdots & \vdots & \vdots \\ D_{t\ n}^{L} & D_{t\ n}^{R} & D_{d\ n}^{L} & D_{d\ n}^{R} & 1 \end{pmatrix} \begin{pmatrix} a_{0} \\ a_{1} \\ a_{2} \\ a_{3} \\ a_{4} \end{pmatrix} = \begin{pmatrix} D_{v1} \\ D_{v2} \\ \vdots \\ D_{vn} \end{pmatrix}$$

• Signal model coefficients in extended MPD file



#### **Rate Adaptation**

#### Given:

- Estimated channel bandwidth
- Set of virtual viewpoint positions for scheduled virtual view range(s)
- Find optimal operating point p\* which minimizes average distortion over all virtual viewpoint positions

• such that  $R(p^*) \leq R_c$ 

```
1 p^* \leftarrow \phi, D_{\min} \leftarrow \infty
 2 foreach p \in \mathbf{P} do
          if R(p) \leq R_c then
 3
                D_{\text{sum}} \leftarrow 0
 4
                for i \leftarrow 0 to K do
 5
                    \alpha \leftarrow A(i)
 6
                 D_{\text{sum}} \leftarrow D_{\text{sum}} + D(p, \alpha)
 7
                D_{\text{avg}}(p) \leftarrow D_{\text{sum}}/K
 8
                if (D_{avg}(p) < D_{min}) then
 9
                   D_{\min} \leftarrow D_{\mathrm{avg}}(p)p^* \leftarrow p
10
11
12 if p^* == \phi then
13 p^* \leftarrow \text{lowest quality representations}
14 return p^*
```



#### System Architecture





# **MVD** Signaling

#### Extended MPD file

**Camera Parameters** 

Per segment index virtual view quality models

Components of captured (reference) views

<CameraParameters ...>

</CameraParameters>

<VVRDModel ...>

</VVRDModel>

<Period> <AdaptationSet ...> </AdaptationSet> <AdaptationSet ...> </AdaptationSet> </Period>



### Extended MPD

#### Camera Parameters

<CameraParameters> <View id="0"> <IntrinsicParam fx="2241.26" fy="2241.26" cx="701.5" cy="514.5" /> <ExtrinsicParam rotation="1,0,0,0,1,0,0,0,1" translation="5,0,0" /> <ZRange zNear="448.2512" zFar="11206.2803" /> </View> </CameraParamters>



### Extended MPD

#### Virtual view quality models in MPD

```
<VVRDModel metric="psnr">
<SegmentVVRDModel segId="11">
 <VVRange id="1" 1="3" r="5">
   <VVParam alpha="0.25" a0="0.24" a1="0.27" a2="0.08" a3="0.03"
        a4="11.99" />
   <VVParam alpha="0.50" a0="0.23" a1="0.22" a2="0.05" a3="0.05"</pre>
        a4="14.07" />
   <VVParam alpha="0.75" a0="0.24" a1="0.19" a2="0.02" a3="0.07"
        a4="14.06" />
 </VVRange>
</SegmentVVRDModel>
</VVRDModel>
```



### Extended MPD

#### Reference Streams Quality

<AdaptationSet mimeType="video/mp4" codecs="avc1.640828"> <Viewpoint schemeIdUri="urn:mpeg:dash:mvv:2014" value="0"/> <Role schemeIdUri="urn:mpeg:dash:v+d:2014" value="t"/> <Representation bandwidth="128000" avgPSNR="34.1" avgSSIM="0.959" > <SegmentList duration="1"> <Initialization sourceURL="oblivion\_128\_t0\_init.mp4"/> <SegmentURL media="oblivion\_128\_t0\_seg1.m4s"/> </SegmentList> </Representation> </AdaptationSet>



### Streaming Client Components





### Screenshot

#### Implemented using C++

- libdash
- FFmpeg
- GPAC

#### Actor-based concurrency

message passing

#### Indicators:

- Segment and frame buffer levels
- Viewpoint position



Successfully parsed MPD at: http://www.my-dash.com/cafe/cafe-qp-100op.mpd



### Evaluation

#### Three MVD video sequences: Kendo, Balloons, and Café

#### For each MVD video

- Three cameras from the set of captured views (texture and depth)
- Component streams encoded using CBR and VBR at different quality levels
- Three virtual view positions within each virtual view range
- Virtual view quality models for all supported virtual view positions
- Two quality models for each virtual view position (100 and 40 OPs)
- Subjective and objective evaluation experiments
  - Proposed rate adaptation vs. equal allocation [Su et al. '15]



#### **Evaluation Testbed**





#### Results: Fixed Network Bandwidth

• Balloons (view 2) - CBR





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#### Results: Variable Network Bandwidth

• Kendo (view 2) - VBR





### Subjective Assessment

- Double-stimulus continuous quality-scale (DSCQS)
  - 17 participants (12 males and 5 females)
  - 23-33 years old
  - 12 test conditions
    - 3 video content
    - 2 encoding configurations
    - 2 bandwidth capacities
  - 60" LG 4K Ultra HD 240Hz display





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### Conclusions

#### FVV streaming is interesting, but challenging to implement!

• Need to efficiently utilize available bandwidth to maximize quality

#### Virtual view quality-aware rate adaptation

Analytical quality models to reduce signaling overhead

#### Complete system for FVV streaming and empirical results



# **Questions?**



### Virtual View Quality



\* A. Vetro, A. Tourapis, K. Müller, and T. Chen, "3D-TV content storage and transmission", IEEE transactions on broadcasting, vol 57, no 2, pp. 384–394, June 2011



### FVV Streaming

Renderer

Storage



Coding

Depth

Estimation

&

Correction

**Client-side rendering** 

View

**Synthesis** 

Decoding



#### References

- [AMR] <u>http://www.alliedmarketresearch.com/3d-display-market</u>
- Gartner] <u>http://www.digitaltrends.com/cool-tech/gartner-predicts-vr-growth-over-2016-and-2017</u>
- IDC] <u>http://www.idc.com/getdoc.jsp?containerId=prUS41199616</u>
- [Su et al. '15] T. Su, A. Sobhani, A. Yassine, S. Shirmohammadi, and A. Javadtalab, "A DASH-based HEVC multi-view video streaming system," *Journal of Real-Time Image Processing*, pages 1–14, 2015.

