#### Towards High Resolution Image and Video Quality Assessment in the Crowd

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#### Motivation

- $\blacktriangleright$  Lab studies  $\rightarrow$  time-consuming and expensive
- ▶ Non-feasibility of lab studies due to external factors, e.g. COVID-19
- ▶ Need for large groundtruth for video quality model development
- Applicability of crowdsourcing studies for quality assessment
  - Focus: high-resolution images/videos UHD-1/4K
  - $\circ~$  Adaptation of the test design
  - $\circ~$  Comparison with lab test required

# Proposed Approach

#### ► Challenges

- $\circ~$  Lack of control on the appropriate hardware for seamless playout and display device
- $\circ~$  Varying test environment (lighting, viewing distance): not handled in this study

#### Potential solutions

- $\circ~$  Displaying the crop of the most salient regions in a scene
- Alternatives to playing out lossless versions of videos, e.g.: choose a transcoding setting that doesn't affect the visual quality of the encoded video

#### Proposed approach

- Images: use different patches
- Videos
  - ▶ Display a pre-defined center crop of losslessly upscaled videos (AVPVS) → to handle varying display devices in crowdsourcing context (c.f. [1])
  - ► Encode the pre-defined center crop of AVPVS using H.264 with a pre-defined CRF → handle lack of appropriate playout hardware

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#### High-Resolution Image Quality Assessment

- $\blacktriangleright$  Source images: 39 UHD-1/4K frames extracted from UHD-1/4K videos cropped to 2160  $\times$  2160, different genres
- Encoding: 1-pass HEVC CRF encoding (HEVC chosen as it outperforms JPEG)
- ▶ Processed images: 371 images encoded with H.265
- ► Test methodology: ACR (*ITU-T* 2014)
- ▶ # Participants in lab test: 21

# Crowdsourcing Test

- $\blacktriangleright~2160\times2160$  image sampled into 4 1080  $\times$  1080
- ▶ Test duration: ≈15 minutes
- Pre-test questionnaire
  - Age range; self-judged visual acuity on an ACR-scale
  - Device type used in test (Phone, Tablet, Laptop, Desktop)
  - Test environment ("Alone in a quiet room", "Some noise and distractions" and "Significant noise and distractions")
- ► Each participant rated 150 randomly selected patches out of 1484 patches
- ► No training phase

### Crowdsourcing Test Results

▶ Most participants: environment with "less distractions"

▶ Majority subjects: age range: 18 - 39 years

▶ # Participants: 238 (recruited via university mailing lists)

► Average ratings per patch: 17

# Lab vs. Crowd Test Comparison (1)





▶ Participants in crowd test more critical

## Lab vs. Crowd Test Comparison (2)

P:0.97, S:0.98, K:0.87, rmse:0.502

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Correlation: lab and crowd tests: 0.97

#### Lab vs. Crowd Test Comparison (3)



▶ SOS analysis:  $a_{lab} = 0.197$  and  $a_{crowd} = 0.216$ 



#### Short-term Video Quality Assessment

#### Dataset - Overview

test\_1 of AVT-VQDB-UHD-1 (Rao et al. 2019)

- ▶ 540*p* center crop
- Lab test for comparison
  - $\,\circ\,$  Source videos: 6 different videos; each: 10 s ; 3840  $\times$  2160; 60 fps
  - Codecs used: H.264, H.265, VP9
  - $\circ~$  Encoding resolutions: 360p to 2160p
- ▶ Total number of processed video sequences (PVS): 180
- ▶ Participants in lab test: 29
- Outliers in lab test: 0 (Pearson correlation (PCC) > 0.75)

# Crowdsourcing Platform and Subject Recruitment

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▶ Used tool: AVrateVoyager<sup>1</sup>

- Subject recruitment
  - $\circ~>90\%$  of subjects recruited from university body (staff+students) via email lists
  - $\circ~$  Remaining participants from people known to authors

<sup>&</sup>lt;sup>1</sup>https://github.com/Telecommunication-Telemedia-Assessment/AVrateVoyager

#### Test Procedure

- ▶ Test duration: ≈15 minutes
- Pre-test questionnaire
  - Age range; self-judged visual acuity on an ACR-scale
  - Device type used in test (Phone, Tablet, Laptop, Desktop)
  - Test environment ("Alone in a quiet room", "Some noise and distractions" and "Significant noise and distractions")

Checks

- Minimum device resolution: 720*p*
- ▶ Each participant rated 30 PVSs randomly selected out of the 180 PVSs
- No training phase

# Crowdsourcing Test Results

▶ Most participants: environment with "less distractions"

- ▶ Majority subjects: age range: 18 39 years
- $\blacktriangleright~\approx 18\%$  of subjects: device with a resolution of full-HD or higher
- ► # Participants: 175
- ▶ Outliers: 19 (PCC > 0.75 as used in lab test)
- ► Average ratings per PVS: 22.15

### Lab vs. Crowd Test Comparison (1)





Participants in crowd test more critical

# Lab vs. Crowd Test Comparison (2)

P:0.96, S:0.94, K:0.79, rmse:0.444

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► Correlation: lab and crowd tests: 0.96

#### Lab vs. Crowd Test Comparison (3)



▶ SOS analysis:  $a_{lab} = 0.240$  and  $a_{crowd} = 0.249$ 



#### **Overall Integral Quality Assessment**

#### Dataset - Overview

test\_2 of PNATS-UHD-1-Long (Ramachandra Rao et al. 2023)

- ► 720*p* center crop used
- ► Lab test for comparison
  - $\,\circ\,$  Source videos: 30 different videos; each: 2 min ; 3840  $\times\,2160$
  - Codecs used: H.264, H.265, VP9
  - $\circ$  Encoding resolutions: 360*p* to 2160*p*
  - $\circ~$  Other impairments: initial buffering, stalling, quality switching
- ▶ Total number of processed video sequences (PVS): 30
- ▶ # Participants in lab test: 31
- Outliers in lab test: 0 (Pearson correlation (PCC) > 0.75)

#### Test Procedure

- ► Used tool: AVrateVoyager<sup>2</sup>
- ▶ Test duration:  $\approx$ 15 minutes
- ▶ Pre-test questionnaire + checks: same as short-term video quality test
- ▶ Training phase: 1 video *rightarrow* showcasing all impairments
- ▶ Test phase: 5 PVSs randomly selected out of the 30 PVSs

<sup>&</sup>lt;sup>2</sup>https://github.com/Telecommunication-Telemedia-Assessment/AVrateVoyager

# Crowdsourcing Test Results

Participant recruitment via clickworkers

- ► # Participants: 100
- ▶ Most participants: environment with "less distractions"
- $\blacktriangleright\ < 10\%$  of subjects: device with a resolution of full-HD or higher
- ► Average ratings per PVS: 17.2

## Lab vs. Crowd Test Comparison (1)





▶ Participants in crowd test more critical

# Lab vs. Crowd Test Comparison (2)





► Correlation: lab and crowd tests: 0.96

# Lab vs. Crowd Test Comparison (3)



▶ SOS analysis [3]:  $a_{lab} = 0.221$  and  $a_{crowd} = 0.226$ 



▶ Proposed method to assess quality of high-resolution images and videos in crowd

Results show good correlation between lab and crowd tests

- High PCC; similar SOS parameter values
- Data publicly available

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# Thank you for your attention





#### ..... are there any questions?



#### Back-up

Crowdsourcing for Video Quality Assessment – Overview



- ▶ Best practices for crowdsourcing QoE testing (*Hoßfeld et al.* [2])
- Crowdsourcing as a viable alternative for perceptual assessment of image, video and audiovisual content (*Hosu et al.* [4], *Hosu et al.* [5], *Sinno et al.* [13])
- ▶ Keimel et al. [7], Ribeiro et al. [11]: Different crowdsourcing platforms
- Shahid et al. [12], Rainer et al. [8]: Crowdsourcing in HTTP-based adaptive streaming (HAS) context
- Uhrina et al. [14]: Investigation of feasibility of unpaid crowdsourcing approach as an alternative for lab-based tests; reports a correlation of > 0.92 between lab and "crowd" tests