

# Analyze And Predict the Perceptibility of UHD Video Contents.

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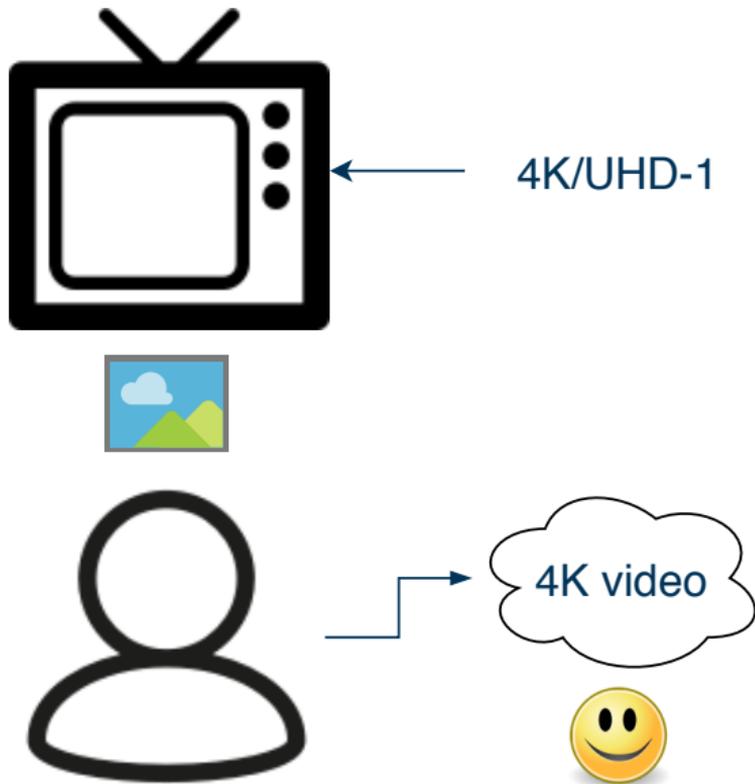
based on HVEI/EI 2019 paper: <https://bit.ly/2EE4xmi>

March 4, 2019

# Motivation – UHD vs. HD

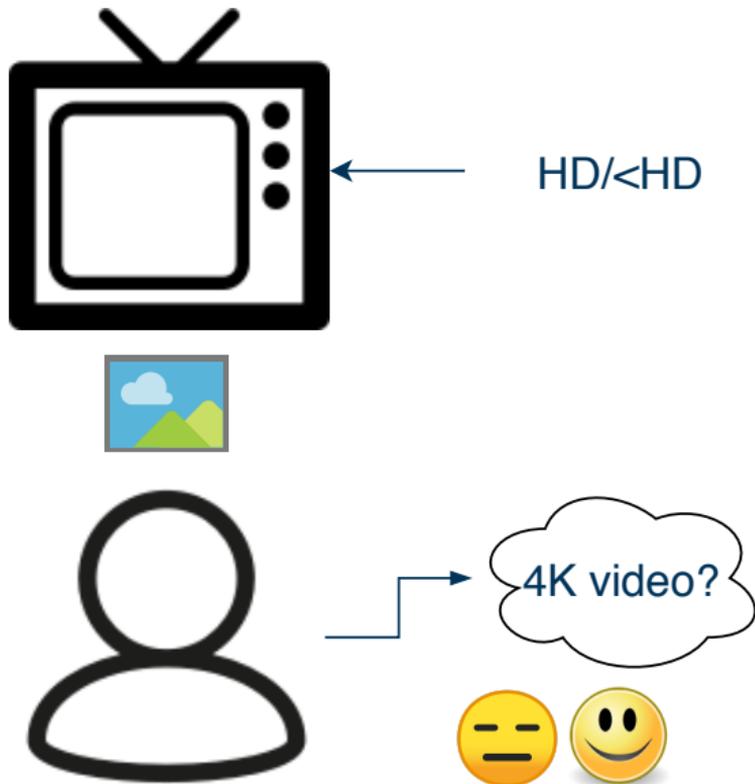
- ▶ increasing display density and resolutions, e.g. 4K, 8K [18]
- ▶ video streaming with higher resolutions, e.g. Netflix [16]
- ▶ is there a –perceptual– real benefit of UHD over HD?

→ short recap of state of the art



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  - ▶ real world:  $\geq 5.5$  display height, Noland and Truong [17]
  - ▶ UHD vs HD: Berger et al. [2]
    - 1 subjective test: ACR approach, encoded videos
    - border of visual perception reached: hard to see a difference
  - ▶ → **two research questions:**
    - what is a suitable test method for UHD and HD comparison of uncompressed video material?
    - can videos be classified according to their UHD perceptibility?
- test methods and setup

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- ▶ classical ACR: Berger et al. [2]
- ▶ video stripes (half low resolution, other half higher resolution):  
Li et al. [13], Van Wallendael et al. [20]
- ▶ quality slider
- ▶ side-by-side test
- ▶ side-by-side on one screen
- ▶ temporal change of two resolutions
- ▶ ...

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# Stripe Method – *STRIPES*



- ▶ extension of one stripe method; total  $n = 12$  stripes
- ▶ question: has A or B higher quality?

Example Video

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Example Video

# Temporal switching Method – TEMP

Stimulus A



Stimulus B



- ▶ specialized version of the ITU-R BT.500-13 [8]
- ▶ no manual change, comparable with *STRIPES*

Example Video

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Stimulus B



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Example Video

- ▶ 20 videos: uncompressed footage; 10 s 4:2:2, 3840x2160, 60 fps
- ▶ selection based on SI-TI diversity (small, mid, high)
- ▶ up- and down-scaling: Lanczos-3-algorithm; good quality: Li et al. [13]
- ▶ considered resolution pairs: UHD-1 vs HD; UHD vs. 900p, UHD vs. 720p
- ▶ Panasonic VIERA TX-65CXW804 65 " screen; ITU-R BT.500-13 [8]
- ▶ viewing distance  $1.5 \cdot$  screen height.
- ▶ used tool: AVRateNG [12]<sup>1</sup> → **later more**

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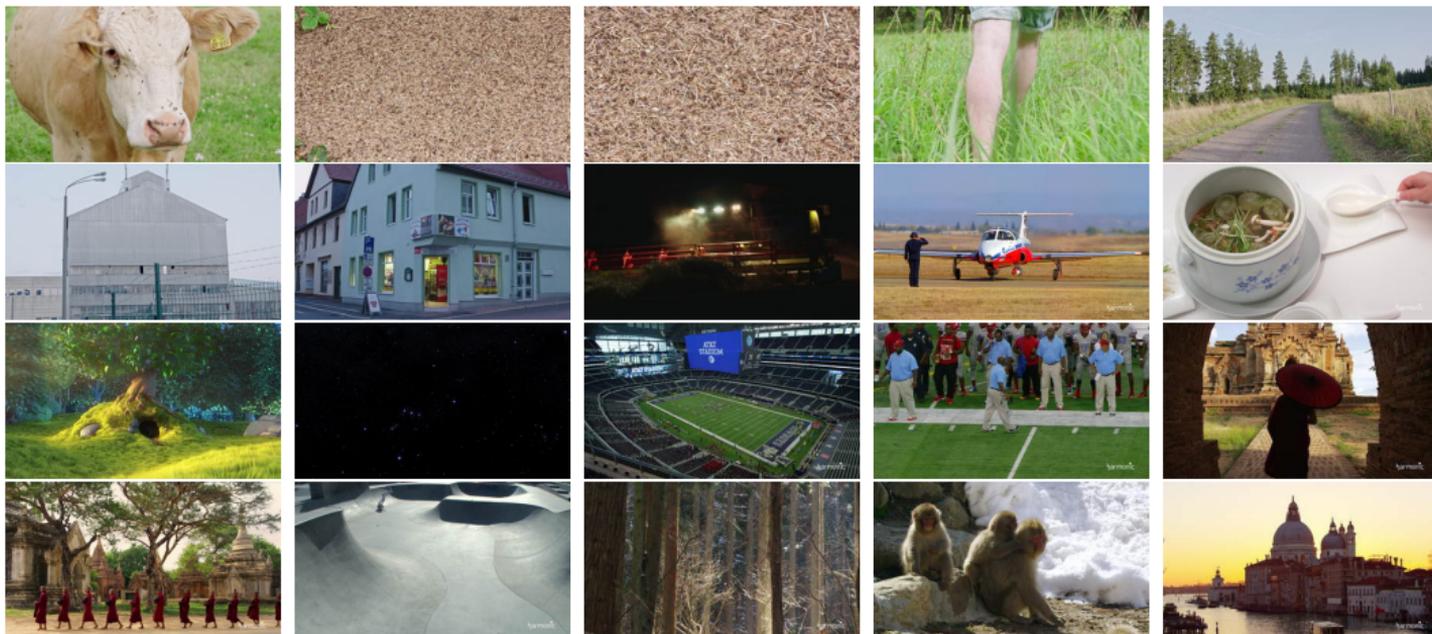
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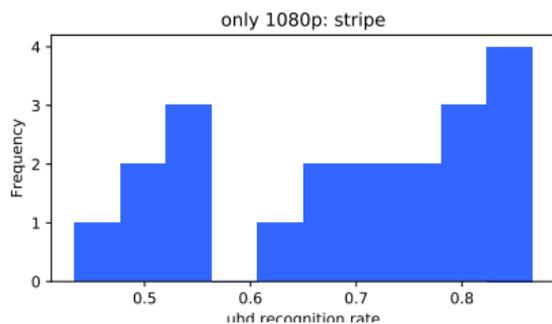
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# Used Videos in the Test

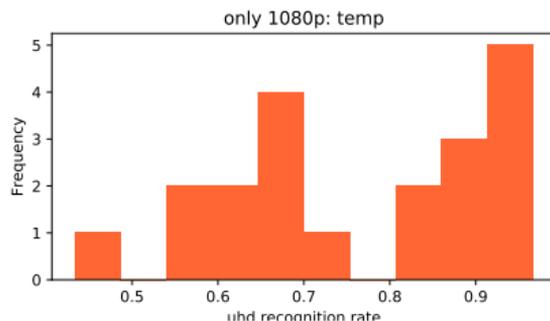


- ▶ 10 videos from harmonic.com [4], big buck bunny [3], BennuProRes [15]
- ▶ 8 self recorded sequences

- ▶ 60 participants for both tests
- ▶ UHD-recognition rate: # of cases where UHD correctly identified
- ▶ **focus on UHD vs. HD**, good results for UHD vs. 900p/720p



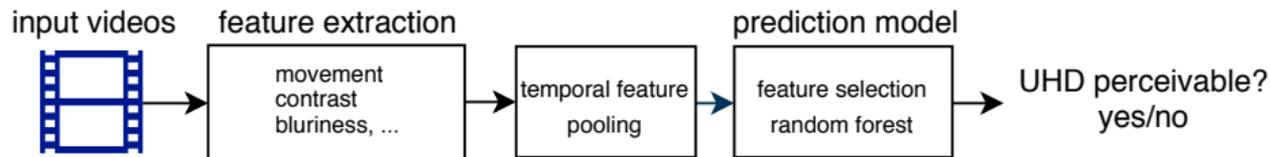
*STRIPES*



*TEMP (better)*

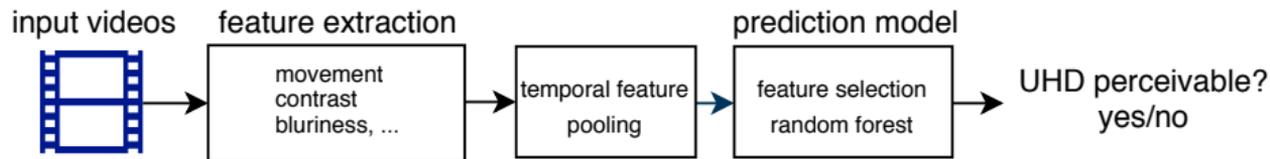
→ content is UHD recognizable, if UHD-recognition rate  $\geq 80\%$ ; 10 videos

# Prediction of UHD perceptibility



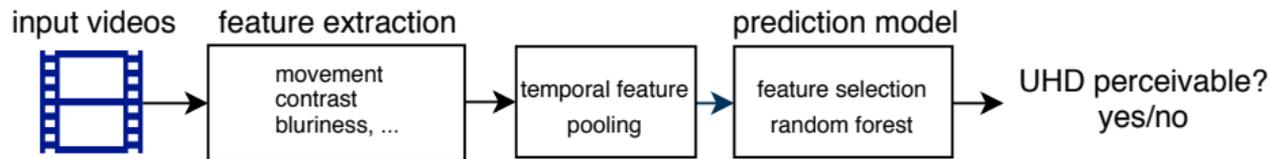
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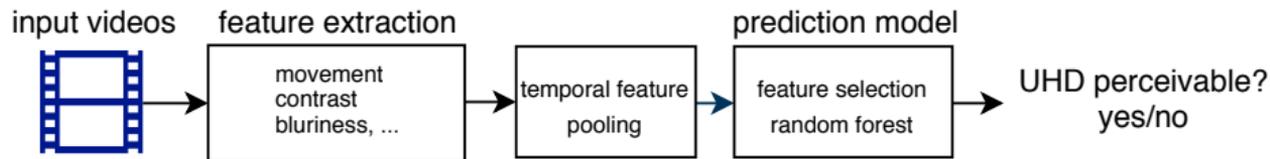
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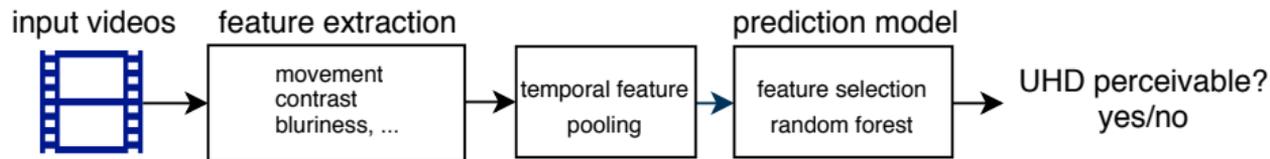
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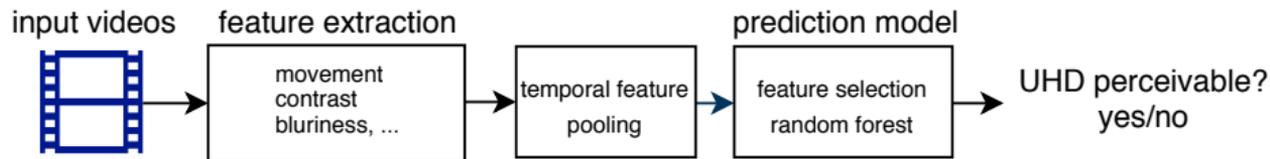
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# Evaluation– Synthetic Dataset

- ▶ 36 video segments
- ▶ down scaled to HD, upscaled again
- ▶ is this detectable?, check for our features

class	precision	recall	f1-score	support
0	0.77	0.92	0.84	36
1	0.90	0.72	0.80	36
avg / total	0.83	0.82	0.82	72

# Evaluation– subjective dataset

- ▶ using UHD-recognition rate from *TEMP* method,
- ▶ *STRIPES* similar results
- ▶ if UHD-recognition rate  $\geq 80\%$   $\rightarrow$  class=1

class	precision	recall	f1-score	support
0	1.00	0.30	0.46	10
1	0.59	1.00	0.74	10
avg / total	0.79	0.65	0.60	20

- ▶ conducted 2 tests for comparison of UHD and HD
  - **temporal switching** method better results than stripes
  - **50% of our videos**: UHD hard to distinguish with HD
- ▶ automated video classification: UHD vs. HD
  - **different + new features introduced** + machine learning pipeline
  - synthetic dataset: good, subjective dataset: good
  - usage: automated video source classification, streaming optimization
- ▶ open and next steps:
  - more subjective test data, extension of features
  - still a hard task

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Thank you for your attention



..... are there any questions?

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# Videos

