### Native Resolution Detection of Video Sequences

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# Image & Video Resolution

- Video resolution has long been an important aspect of video quality
- Video codecs have been largely driven by the desire to increase and eventually associated with certain video frame resolutions; MPEG1 – VCD (352x240), MPEG – DVD (720x480), H.264 – HDTV (1920x1080), H.265 – UHD (3840x2160)
- Digital still cameras have played the "resolution game" for over 15 years, in an attempt to convince customers to upgrade their earlier cameras
- Content providers can differentiate service based on resolution, but
  - Users can't always tell the difference between a high-quality DVD and a poorquality Blu-Ray disk
  - Many companies sell up-sampling "technology"



- \* Netflix licenses and receives pristine video content from various studios around the world, in a variety of formats (lately – mostly IMF/MXF)
- Encoding technologies is the group responsible for
  - Inspecting and assuring quality of video assets delivered to Netflix by content providers
  - Encoding each asset according to a multitude of "recipes"; each recipe consists of a choice of video/audio and timed text codec alongside all parameters that determine an encoder's video/audio quality and associated bitrate
  - We need to establish whether a certain content delivered to us is true 4K or it has been upsampled from a lower resolution





### Problem statement

- \* Given a video sequence in a certain ("apparent") resolution and color format, how to determine the minimum spatial resolution that this content existed in its past life ("native video resolution")?
- Many reasons why native resolution is not equal to apparent resolution:
  - Original video camera sensor had lower resolution than apparent resolution
  - Special effects overlaid at different resolution
  - Post-production software can't handle apparent resolution
  - User error





# An example – "Birds in Cage"

![](_page_4_Picture_3.jpeg)

![](_page_5_Picture_1.jpeg)

![](_page_5_Picture_3.jpeg)

![](_page_6_Picture_1.jpeg)

![](_page_6_Picture_3.jpeg)

![](_page_6_Picture_4.jpeg)

![](_page_7_Picture_1.jpeg)

![](_page_7_Picture_3.jpeg)

![](_page_7_Picture_4.jpeg)

![](_page_8_Picture_1.jpeg)

![](_page_8_Picture_3.jpeg)

![](_page_9_Picture_1.jpeg)

![](_page_9_Picture_3.jpeg)

- No-reference image/video quality problem
- Frequency-domain analysis
- Obtain spectral signatures of known image downsample / upsample pairs to detect evidence of upsampling in given video spectra
- Isolate active video lines from input video sequence (horizontal/vertical black bar detection)
- Split video sequence in scenes, since upsampling is typically applied on selected scenes (mostly due to special effects / post-production)

![](_page_10_Picture_6.jpeg)

![](_page_10_Picture_7.jpeg)

![](_page_10_Picture_9.jpeg)

![](_page_11_Picture_0.jpeg)

Horizontal/Vertical black bar detection

Video Sequence, uncompressed YUV

FFT, DC-removal, AC-energy normalization,  $\log(),$ accumulation

> Scene change detection

System diagram

![](_page_11_Picture_6.jpeg)

Horizontal/Vertical knee point detection

Average normalized spectra in log domain (1 per scene)

Low/High frequency Energy density ratio in log domain

Threshold obtained through supervised training

Hor/Ver native resolution estimation with quality/likelihood metrics

# Core detection algorithm

![](_page_12_Figure_1.jpeg)

![](_page_12_Picture_2.jpeg)

Computational complexity dominated by Fourier Transform (FFTW library)

> Parallel processing makes it suitable for cloud computing

![](_page_12_Picture_6.jpeg)

## Back to our example – "Birds in Cage"

![](_page_13_Picture_1.jpeg)

![](_page_13_Picture_3.jpeg)

# "Birds in Cage" – Test 1 Spectrum

![](_page_14_Picture_1.jpeg)

![](_page_14_Picture_3.jpeg)

# "Birds in Cage" – Test 2 Spectrum

![](_page_15_Picture_1.jpeg)

![](_page_15_Picture_3.jpeg)

# "Birds in Cage" – Test 3 Spectrum

![](_page_16_Picture_1.jpeg)

![](_page_16_Picture_3.jpeg)

# "Birds in Cage" – Test 4 Spectrum

![](_page_17_Picture_1.jpeg)

![](_page_17_Picture_3.jpeg)

![](_page_18_Picture_1.jpeg)

# "Birds in Cage" – Test 5 Spectrum

![](_page_18_Picture_4.jpeg)

# Putting our method to the test

\* Tested our native resolution detection method on 2 commercial 4K assets: Asset #1, YUV422, 10-bit/sample, 3840x2160, 29.97fps \* Asset #2, YUV422, 10-bit/sample, 4096x2160, 29.97fps Results:

- Asset #1 is for the most part true UHD
- of 1080p and 720p content, upsampled to 4K

![](_page_19_Picture_4.jpeg)

\* Asset #2 has true 4K resolution in about 75% of its duration; rest 25% is a mix

### Asset #1– Frames [17751,17825]

![](_page_20_Picture_1.jpeg)

![](_page_20_Picture_3.jpeg)

# Horizontal spectrum energy

![](_page_21_Figure_1.jpeg)

![](_page_21_Picture_4.jpeg)

## Horizontal spectrum knee-point fit

![](_page_22_Figure_1.jpeg)

![](_page_22_Picture_2.jpeg)

1-D Horizontal Spectral
 CDF

Single segment approximation

> Two segment approximation

### Vertical spectrum knee-point fit

![](_page_23_Figure_1.jpeg)

![](_page_23_Picture_2.jpeg)

1-D Vertical Spectral
 CDF

 Single segment approximation

Two segment approximation

![](_page_23_Picture_6.jpeg)

# Candidate low-frequency bounding box

![](_page_24_Picture_1.jpeg)

LRD/HRD = 2Bounding box = 1814 x 1018

![](_page_24_Picture_3.jpeg)

# Asset #2– Frames [53041,53100]

![](_page_25_Picture_1.jpeg)

![](_page_25_Picture_3.jpeg)

## Asset #2– Frames [53154,53188]

![](_page_26_Picture_1.jpeg)

![](_page_26_Picture_2.jpeg)

## Asset #2– Frames [53189,53221]

![](_page_27_Picture_1.jpeg)

![](_page_27_Picture_3.jpeg)

# Horizontal spectrum energy

![](_page_28_Figure_1.jpeg)

![](_page_28_Picture_2.jpeg)

![](_page_28_Figure_3.jpeg)

2000

## Horizontal spectrum knee-point fit

![](_page_29_Figure_1.jpeg)

![](_page_29_Picture_2.jpeg)

 1-D Horizontal Spectral CDF

 Single segment approximation

> Two segment approximation

### Vertical spectrum knee-point fit

![](_page_30_Figure_1.jpeg)

![](_page_30_Picture_2.jpeg)

1-D Vertical Spectral
 CDF

 Single segment approximation

Two segment approximation

![](_page_30_Picture_6.jpeg)

# Candidate low-frequency bounding box

![](_page_31_Picture_1.jpeg)

![](_page_31_Picture_3.jpeg)

![](_page_32_Picture_0.jpeg)

- \* Method works!
- Many scenes with special effects have been produced in 1080/720p and upsampled
- Image sensor contributes to spectral image (Bayer pattern)
- Scan from film has more high-energy component
- Artistic intent can be mistaken as older TV or camcorder footage)
- Artistic intent can be mistaken as down/up-sampled content (capture of

![](_page_32_Picture_7.jpeg)