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# VCAv2.0: A green video complexity analysis

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# Outline

### 1 Background

- 2 Video Complexity Features
- 3 Accuracy Analysis
- 4 Performance Optimizations
- **5** Conclusions



- The optimal encoding parameters depend on the video content complexity.
- There is a need to extract content features that can represent the video content complexity to predict the optimal encoding parameters for that video content.



## Texture Energy

#### Compute texture energy per block

A DCT-based energy function is used to determine the block-wise feature of each frame defined as:

$$H_{Y,p,k} = \sum_{i=0}^{w-1} \sum_{j=0}^{w-1} e^{|(\frac{ij}{wh})^2 - 1|} |DCT(i,j)|$$
(1)

where  $w_{XW}$  is the size of the block, and DCT(i,j) is the  $(i,j)^{th}$  DCT component when i+j > 0, and 0 otherwise.

The energy values of blocks in a frame are averaged to determine the energy per frame.<sup>1</sup>

$$\Xi_{Y} = \sum_{k=0}^{C-1} \frac{H_{Y,p,k}}{C \cdot w^{2}}$$
(2)

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<sup>&</sup>lt;sup>1</sup>Michael King, Zinovi Tauber, and Ze-Nian Li. "A New Energy Function for Segmentation and Compression". In: 2007 IEEE International Conference on Multimedia and Expo. 2007, pp. 1647–1650. DOI: 10.1109/ICME.2007.4284983.

### Texture energy gradient

 $h_p$ : SAD of the block level energy values of frame p to that of the previous frame p-1.

$$h = \sum_{k=0}^{C-1} \frac{|H_{Y,p,k} - H_{Y,p-1,k}|}{C \cdot w^2}$$
(3)

where C denotes the number of blocks in frame p.

#### Luminescence

The luminescence of non-overlapping blocks k of each frame p is defined as:

$$L_{Y,k} = \sqrt{DCT(0,0)} \tag{4}$$

where DCT(0,0) is the DC component in the DCT calculation. The block-wise luminescence is averaged per frame denoted as  $L_Y$  as shown below.

$$L_{Y} = \sum_{k=0}^{K-1} \frac{L_{Y,p,k}}{C \cdot w^{2}}$$
(5)

where C denotes the number of blocks in frame p.

#### Chroma features

VCA also determines chroma texture energy  $E_U$  and  $E_V$  (for U and V planes), and the chrominance  $L_U$  and  $L_V$  (for U and V planes).

### Video Complexity Features



Figure: Example heatmap of Luminescence (L), spatial texture (E) and temporal activity (h) features of the  $2^{nd}$  frame of *CoverSong\_1080P\_0a86* video of Youtube UGC dataset extracted using VCA.

### Accuracy Analysis Correlation of spatial complexity features with the ground truth

Bitrate in All Intra configuration<sup>2</sup> is considered as the ground truth of the spatial complexity.



Figure: PCC between SI and  $E_Y$ , respectively, with bitrate in All Intra configuration with *medium* preset of x265 encoder for the VCD dataset.<sup>3</sup>

<sup>&</sup>lt;sup>2</sup> Jill Boyce et al. JVET-J1010: JVET common test conditions and software reference configurations. July 2018.

<sup>&</sup>lt;sup>3</sup>Hadi Amirpour et al. "VCD: Video Complexity Dataset". In: Proceedings of the 13th ACM Multimedia Systems Conference. MMSys '22. Athlone, Ireland: Association for Computing Machinery, 2022, 234–239. ISBN: 9781450392839. DOI: 10.1145/3524273.3532892. URL: https://doi.org/10.1145/3524273.3532892.

### Accuracy Analysis

Correlation of complexity features with bitrate in the Low Delay P picture (LDP) configuration



Figure: PCC between SI,  $E_Y$ , TI and *h* with *bitrate* in the Low Delay P picture configuration with *ultrafast* preset of x265 encoder for the VCD dataset.

 $E_Y$  and *h* strongly correlate with the encoding bitrate.

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#### Multi-threading optimizations

- Creates multiple threads within a VCA execution instance, which executes independently but concurrently, sharing process resources.
- Independent threads carry out DCT-energy computation per block.

#### x86 SIMD optimizations

• SIMD optimization<sup>4</sup> of DCT functions implemented as intrinsic and assembly codes for x86 architecture.

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<sup>&</sup>lt;sup>4</sup>Praveen Kumar Tiwari et al. "Accelerating x265 with intel<sup>®</sup> advanced vector extensions 512". In: White Paper on the Intel Developers Page (2018).

Low-pass DCT optimization

- Unlike SI, the  $E_Y$  feature exhibits better correlation across resolutions.
- In VCA v2.0, the complexity features are evaluated on the video spatially downsampled by a factor of two.



Figure: PCC between the spatial complexity features (a) SI and (b)  $E_Y$  across multiple resolutions for the VCD dataset.

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Processing time results



Figure: Processing time of video content complexity analysis methods.

- m1: without any performance optimizations
- m2: with SIMD
- m3: with SIMD and low-pass DCT
- m4: with SIMD , low-pass DCT and multi-threading (2 threads)
- m5: with SIMD , low-pass DCT and multi-threading (4 threads)
- m6: with SIMD , low-pass DCT and multi-threading (8 threads)

Energy consumption results



Figure: Energy consumption of video content complexity analysis methods.

- m1: without any performance optimizations
- m2: with SIMD
- m3: with SIMD and low-pass DCT
- m4: with SIMD , low-pass DCT and multi-threading (2 threads)
- m5: with SIMD , low-pass DCT and multi-threading (4 threads)
- m6: with SIMD , low-pass DCT and multi-threading (8 threads)

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- VCA is an open-source video complexity analyzer library published under the GNU GPLv3 license.
- Low-complexity DCT-based energy features are extracted using VCA v2.0, which encoders use to derive decisions like bitrate-ladder, frame-type, block-partitioning, and much more.
- Multi-threading, x86 SIMD, and low-pass DCT optimizations improve the energy efficiency of the VCA implementation.
- Compared to the state-of-the-art SITI implementation of video complexity analysis, VCA v2.0 yields a better estimation of video complexity, with an energy consumption reduction of 97.06%.

- Identify parallelizable code and perform SIMD optimization
- ARM optimization
- $\bullet$  CUDA/ OpenCL optimization
- Open-source the prototypes of the VCA applications

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Thank you for your attention!

Q & A

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