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## Abstract

In order to handle the increasing amount of collected image and video data, we propose to summarize this data based on human interest. First, we analyze what humans find interesting. Then, we propose summarization algorithms for various applications.

## What is human interest?

### Literature

Berlyne [1] (1960): Interest is influenced by:

- Novelty
- Conflict
- Uncertainty
- Complexity

Biederman and Vessel [2] (2006): Model based on perceptual pleasure. Interesting when:

- Novel
- Comprehensible
- Natural rather than man-made

## Our experiments

Using our data and [3] we found:

- High consistency across individuals ( $\rho=0.63$ )
- 3 main causes of interest:
  - Unusualness
  - Aesthetics
  - General preferences (Scene types)

Also important are:

- Famousness
- Making happy

Actual memorability and interestingness are negatively correlated.



Figure 2. Example images

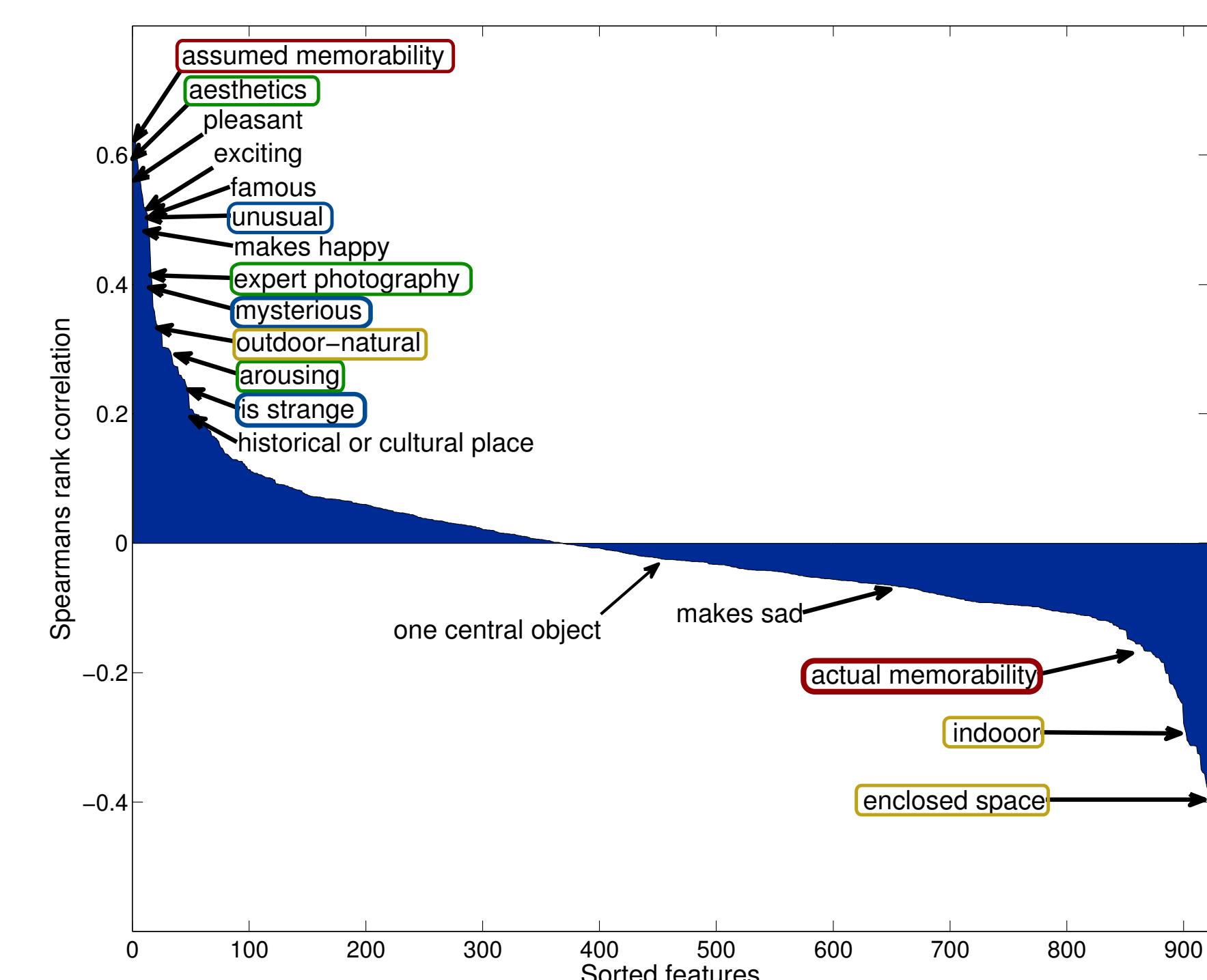


Figure 3. Correlations of interestingness

## Application: Image scoring/classification

### Method

#### Features

##### 1) Unusualness

- Global outliers
- Composition of parts

##### 2) Aesthetics

- Colorfulness
- Arousal
- Complexity
- Contrast
- Edge distribution

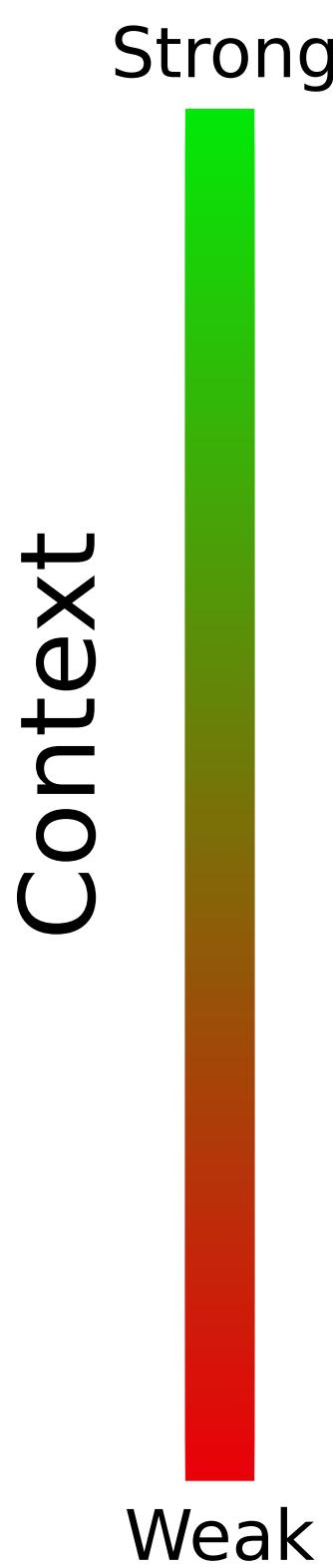
##### 3) General preferences

- SVM on GIST
- SVM on Spatial pyramid
- SVM on color histograms

#### Final interestingness

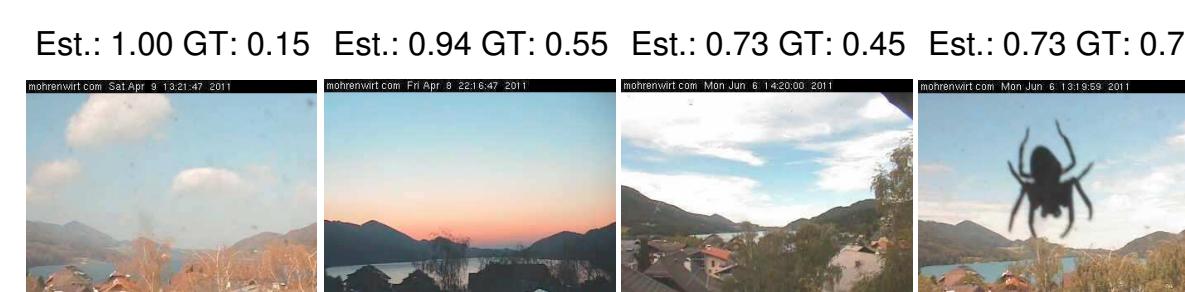
- Whitening
- Linear model
- Feed-forward feature selection

### Results

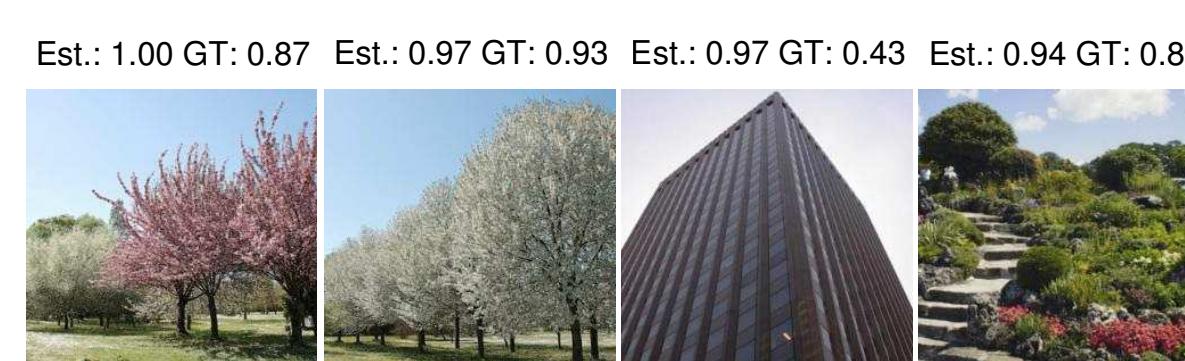
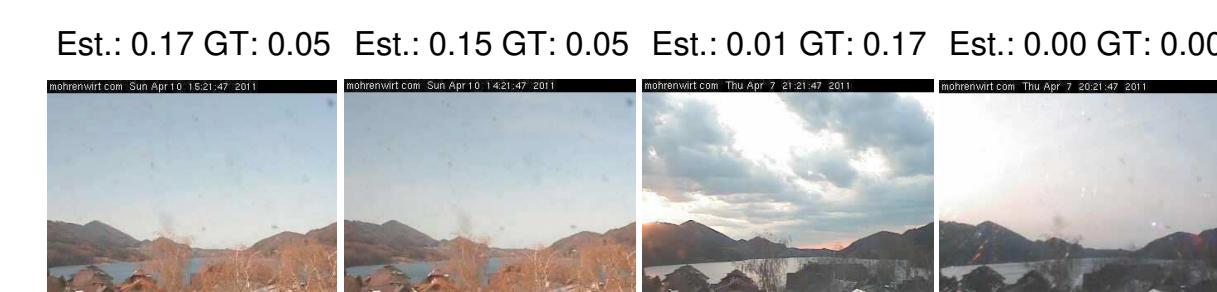


Webcams  
 8 Scene categories  
 Arbitrary images

#### Predicted high interestingness



#### Predicted low interestingness



**Publication:** M. Gygli, H. Grabner, H. Riemenschneider, F. Nater, L. Van Gool - The Interestingness of Images - ICCV 2013

## Application: Video Summarization

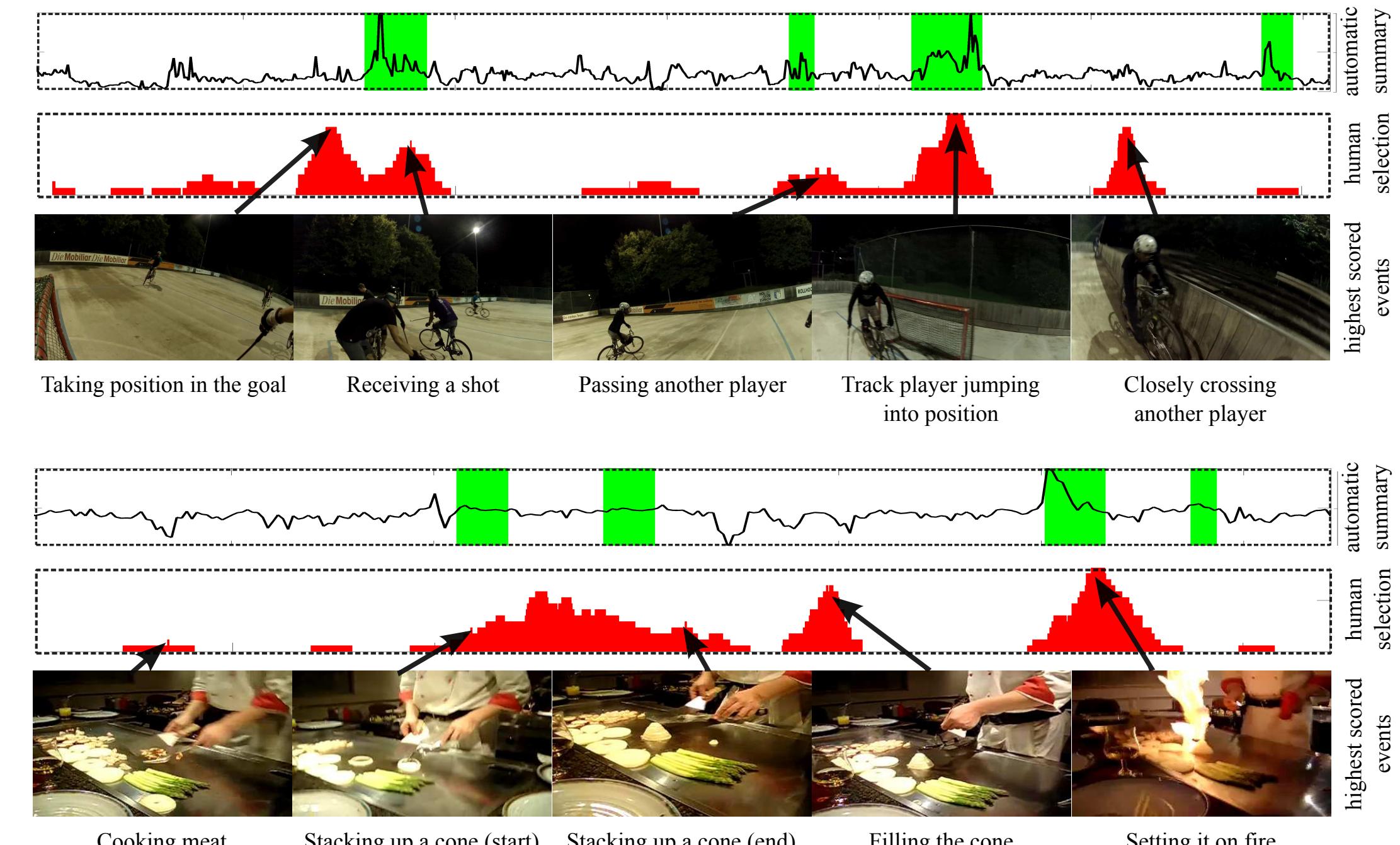
### Method for the summarization of user videos

- 1) Novel segmentation tailored for user videos
  - Inspired by editing theory
- 2) Features for summarization
  - Capturing interesting aspects of the video
  - low-, mid-, high-level features
- 3) Knapsack optimization to generate a summary
- 4) New benchmark
  - 25 user videos
  - Annotated with multiple reference summaries
  - Automatic evaluation inspired by text summarization approaches [5]

### Results

Mean f-measure:

- Humans: 100%
- Chance: 45%
- Baseline [6]: 54%
- Ours: 75%



## Current work

## References

- [1] D. Berlyne. *Conflict, arousal, and curiosity*. McGraw-Hill (1960)
- [2] I. Biederman and E. Vessel. *Perceptual Pleasure and the Brain*. American Scientist (2006)
- [3] P. Isola, J. Xiao, A. Torralba, A. Oliva. *What makes an image memorable?* CVPR (2011)
- [4] E. Vessel, N. Rubin. *Beauty and the beholder: Highly individual taste for abstract, but not real-world images*. J. of Vision (2010)
- [5] Ani Nenkova and Kathleen McKeown. *Automatic Summarization Foundations and Trends in Information Retrieval* (2010)
- [6] N. Ejaz et al. *Efficient visual attention based framework for extracting key frames from videos*. Signal Processing: Image Communication(2013)