## MLRF Lecture 05

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## Agenda for lecture 5

- 1. Introduction
- 2. Image classification overview
- 3. Some classifiers part 1
- 4. Classifier evaluation

# Introduction

Lecture 05 part 01

# Previously, in MLRF...

## Summary of last lecture

#### Local feature detectors

- Harris-Stephens: local curvature of the intensity surface of the image
- FAST: binary tests
- LoG, DoG, HoG: scale-space
- MSER: stable region over thresholds
- Edge / Corner / Blob detectors

#### Local feature descriptors

- A signature for an image area
- HoG: gradients
- BRIEF: binary tests
- SIFT and ORB pipelines
- Invariance to rotation, scale, ...

#### Content-based image retrieval

- Two strategies: keep all local descriptors for all images vs 1 descriptor per image
- Bag of Visual Words pipeline
  - Quantization in particular

#### Evaluation of image retrieval systems

- Precision
- Recall
- F-Measure
- mAP

### Debriefing of practice session 4

#### Content

#### Bag of Visual Words search engine

- Sample some descriptors for codebook learning
- Learn normalisation parameters for descriptors (mean and eigenvectors)
- 3. Use k-Means to learn a codebook
- 4. Compute the BoVW vector for each image
- 5. Setup a nearest neighbors search structure
- 6. Evaluate our approach using mean average precision
- 7. Display some results
- 8. Compute the best results for the test queries
- 9. Export the results for the test queries (and submit them for grading).

#### **Discussion**

- Who completed part 1? 2? ...
- Did everyone submitted their results?
  - results.json
  - notebook.ipynb
- Any remarks, comments, questions?
- Things to keep, change, remove?

### Practice session 4: Take home messages

#### **BoVW**

- Usually requires some preprocessing of the descriptors: centering, rotation, dimensionality reduction
- Is based on a **quantization step** (assign descriptors to clusters)
- Is just a histogram, like the color histogram of session 2

### Best practices

- Test arrays shapes and types as soon as possible
- Make a small change, test, fix, test, validate, repeat

## Next practice session

### Next practice session

Implement a simple image classifier.



### Will be graded.

Submission due by Monday, <u>June 10<sup>th</sup></u> (23:59) on <u>moodle.cri.epita.fr</u>.

Next practice session: based on BoVW

Idea: we (humans) are fooled by

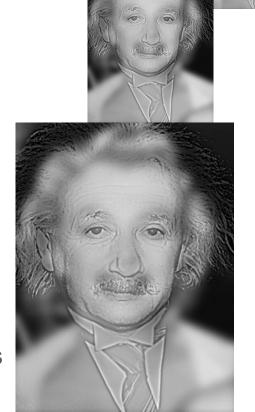
- 1. The global appearance of each image
- 2. Mixed image categories

But with a BoVW approach we will:

- 1. Focus on local textures: fur vs batter
- 2. Analyse each image separately

#### How?

- Compute descriptors at several scale
- Compute a BoVW for each image
- Train a classifier to identify discriminative features



You already did most of them during last session.

- 1. Load resources
- 2. Train a BoVW model
- 3. Split the dataset into training and validation sets
- 4. Compute the BoVW descriptor for each image
- 5. Prepare training structures
- 6. Train a classifier and evaluate its performance
- 7. Display some results
- 8. Test on meme images
- 9. Compute the results on the test set and export them

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Training and evaluating a classifier is so easy with scikit-learn!