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### **Overview**

- ImageCLEF
  - History (2003-2011)
  - Evaluation tasks
  - Resources: Collections, Topics, Ground Truth
- ImageCLEF impact
- ImageCLEF 2012 evaluation activities
- Future directions
- Conclusions



## ImageCLEF: cross-language image retrieval

- Introduced in 2003 as part of the Cross-Language Evaluation Forum
  - February-September annual cycle
- · Aim: advancement of visual media analysis, indexing, classification, retrieval
  - develop infrastructure for the evaluation of visual information retrieval systems operating in monolingual and cross–language contexts
  - provide reliable and reusable resources for such benchmarking purposes
  - promote the exchange of ideas

### Multi-disciplinary

 (visual) information retrieval, cross—lingual information retrieval, computer vision and pattern recognition, medical informatics, etc.

#### Tasks

- (ad-hoc) image retrieval
- image annotation (object recognition, image classification, concept detection)
- interactive image retrieval



### **Organisation**

Overall coordination: MedGIFT group, HES-SO, Switzerland

Task organisation: several researchers per task

Support: international and national funding bodies, voluntary effort













FONDS NATIONAL SUISSE
SCHWEIZERISCHER NATIONALFONDS
FONDO NAZIONALE SVIZZERO
SWISS NATIONAL SCIENCE FOUNDATION



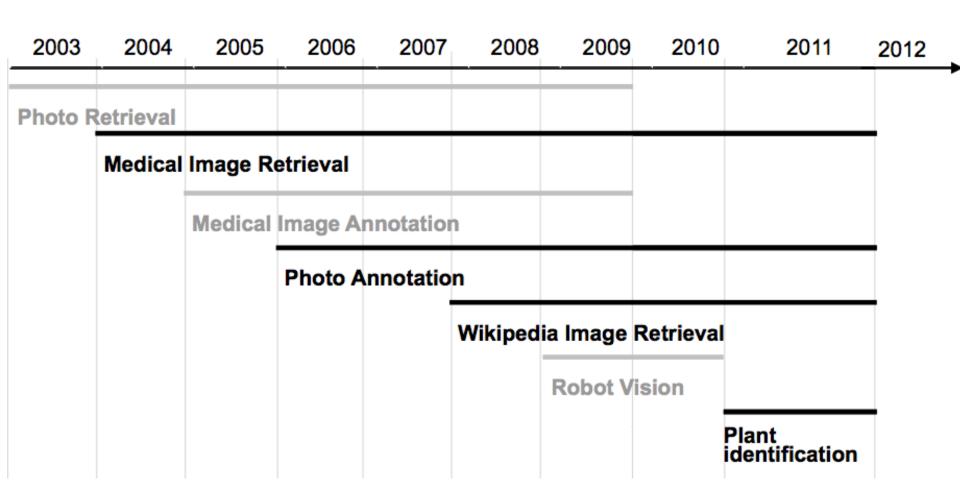


### ImageCLEF tasks

- General images (generic photos, historic archives, news, Web, Flickr, Wikipedia)
  - photo retrieval, photo annotation, Wikipedia image retrieval
- Medical images
  - medical image retrieval, medical image annotation
- Scientific multimedia data
  - plant identification
- Robotics
  - robot vision



## ImageCLEF tasks timeline (2003-2011)





### ImageCLEF tasks: general images

- Photo retrieval (2003-2009)
  - Given a multimedia information need, find relevant images (as many as possible)
  - Evaluation criteria: topical relevance, diversity
  - Datasets: historical, generic (travel), news
- Photo annotation (2006-)
  - object recognition, concept detection (objects, scene, abstract, quality, sentiment)
  - Datasets : PASCAL VOC, generic (travel), FlickR (+ tags)
- Wikipedia image retrieval (2008-2011)
  - simulate image retrieval on the Web
    - larger scale image collections
    - highly heterogeneous textual descriptions and visual content
  - multimodal image retrieval approaches







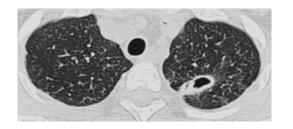




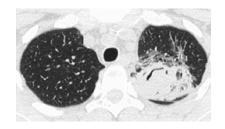


### ImageCLEF tasks: medical images

- Medical image retrieval (2004-)
  - (visual) clinical decision support for medical diagnosis
    - Image-based retrieval: clear information need for finding images
    - Case-based retrieval: find a case similar to the one under observation
  - Images + medical cases from clinical practice and biomedical literature
  - Topics + ground truth in collaboration with clinicians





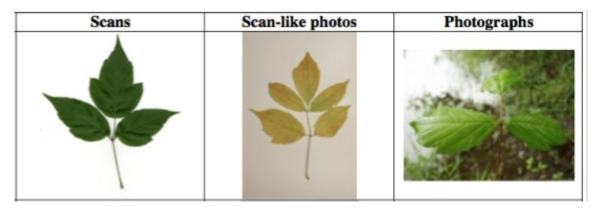


- Medical image annotation (2005-2009)
  - Content-based image classification in medical applications
  - Dataset: medical radiographs collected from daily clinical routine
  - Classes: hierarchical Image Retrieval in Medical Applications code



### ImageCLEF tasks: scientific multimedia data

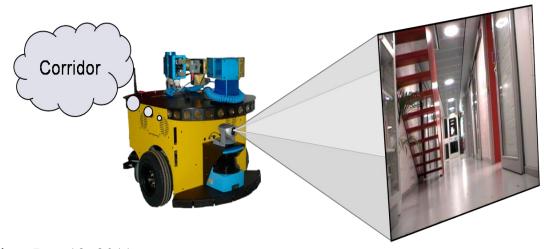
- Plant identification (2011-)
  - Automatic plant species identification based on images of leaves
  - Motivation: bridge taxonomic gap essential for
    - ecology management
    - · biodiversity preservation
    - agriculture development
  - Organised in collaboration with botany scientists
    - citizen sciences initiative
    - Telabotanica: a French social network of amateur and expert botanists





### **ImageCLEF tasks: robotics**

- Robot vision (2009-2010)
  - Semantic localisation of a mobile robot using visual place recognition
  - Determine the robot's topological location for each image in a sequence
    - classify correctly known rooms/functional areas
    - detect new rooms, not seen during training
  - Images acquired using a perspective camera or a stereo camera
  - Achieve robustness under varying imaging conditions





### **Collections** (number of images x1000)

|   | 2003 | 2004 | 2005 | 2006 | 2007 | 2008  | 2009  | 2010  | 2011  |
|---|------|------|------|------|------|-------|-------|-------|-------|
| General (non-medical) images                    |      |      |      |      |      |       |       |       |       |
| Photo retrieval                                 | 28.1 | 28.1 | 28.1 | 20   | 20   | 20    | 498.9 |       |       |
| Photo annotation (object and concept detection) |      |      |      | 15.1 | 22.6 | 2.8   | 18    | 18    | 18    |
| Wikipedia image retrieval                       |      |      |      |      |      | 151.5 | 151.5 | 237.4 | 237.4 |
| Robot vision                                    |      |      |      |      |      |       | 22.5  | 9.6   |       |
| Plant identification                            |      |      |      |      |      |       |       |       | 5.4   |
| Medical images                                  |      |      |      |      |      |       |       |       |       |
| Medical image retrieval                         |      | 8.7  | 50   | 50   | 66.7 | 66    | 66    | 66    | 231   |
| Medical image annotation                        |      |      | 10   | 11   | 12   | 13    | 14.1  |       |       |



## **Topics / Classes**

|   | 2003 | 2004  | 2005     | 2006 | 2007 | 2008 | 2009             | 2010 | 2011 |
|---|------|-------|----------|------|------|------|------------------|------|------|
| General (non-medical) images                    |      |       |          |      |      |      |                  |      |      |
| Photo retrieval                                 | 50   | 25    | 28       | 60   | 60   | 39   | 50               |      |      |
| Photo annotation (object and concept detection) |      |       |          |      | 17   | 53   | 93               | 99   |      |
| Wikipedia image retrieval 75 45 70              |      |       |          |      |      |      |                  | 50   |      |
| Robot vision 5 14                               |      |       |          |      |      |      |                  |      |      |
| Plant identification                            |      |       |          |      |      |      |                  |      | 70   |
|   |      | Medic | cal imag | ges  |      |      |                  |      |      |
| Medical image retrieval                         |      | 26    | 25       | 30   | 30   | 30   | 30               | 30   | 30   |
| Medical image annotation                        |      |       | 57       | 116  | 116  | 196  | 57<br>116<br>196 |      |      |



### **Ground truth**

- Coverage
  - Whole collection for classification tasks
  - Pooling for retrieval tasks
- Assessors
  - Volunteers
    - Task organisers, participants, others
  - Experts
    - Clinicians, botanists
  - Crowd
    - Amazon Mechanical Turk workers, social networks
- Ground truth creation still a bottleneck in building benchmarks



### ImageCLEF book

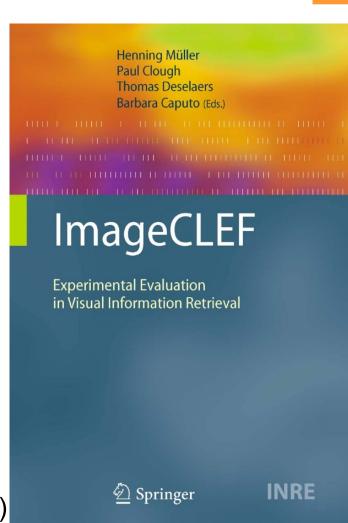
# ImageCLEF: Experimental Evaluation in Visual Information Retrieval

The Information Retrieval Series, Vol. 32

Müller, H.; Clough, P.; Deselaers, Th.; Caputo, B. (Eds.) 1st Edition., 2010, 495 pages

### **Contents**

- Basic concepts (6 chapters)
  - history, datasets, topic development, relevance assessments, evaluation, fusion approaches
- Task reports (7 chapters)
- Participants' reports (11 chapters)
- External perspectives on ImageCLEF (3 chapters)





Registrations

# Participation

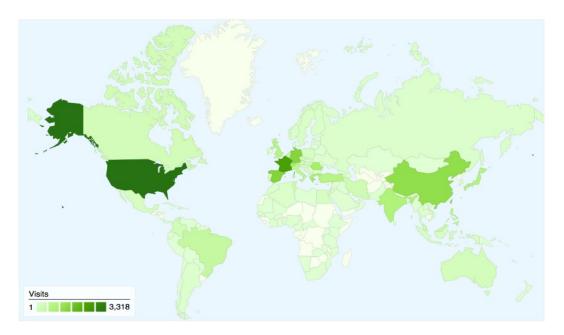
|   | 2003   | 2004      | 2005     | 2006     | 2007 | 2008 | 2009 | 2010 | 2011 |
|---|--------|-----------|----------|----------|------|------|------|------|------|
|   | Genera | al (non-l | medica   | l) image | es   |      |      |      |      |
| Photo retrieval                                 | 4      | 12        | 11       | 12       | 20   | 24   | 19   |      |      |
| Interactive image retrieval                     | 1      | 2         | 2        | 3        |      | 6    | 6    |      |      |
| Photo annotation (object and concept detection) |        |           |          | 4        | 7    | 11   | 19   | 17   | 18   |
| Wikipedia image retrieval                       |        |           |          |          |      | 12   | 8    | 13   | 11   |
| Robot vision                                    |        |           |          |          |      |      | 7    | 7    |      |
| Plant identification                            |        |           |          |          |      |      |      |      | 8    |
|   |        | Medica    | al image | es       |      |      |      |      |      |
| Medical image retrieval                         |        | 12        | 13       | 12       | 13   | 15   | 17   | 16   | 17   |
| Medical image annotation                        |        |           | 12       | 12       | 10   | 6    | 7    |      |      |
|   |        | To        | otal     |          |      |      |      |      |      |
| Participations                                  | 4      | 17        | 24       | 30       | 35   | 45   | 65   | 47   | 43   |

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## ImageCLEF web site access (2011 campaign)

|                 | Total<br>Sept 2010 –<br>Sept 2011 | Per Month<br>Average<br>Sept 2010 –<br>Sept 2011 | Per Month<br>Average<br>Jan 2011 –<br>Sept 2011 |
|-----------------|-----------------------------------|--|---|
| Unique visitors | ~12,000                           | ~1,100   | ~1,200  |
| Visits          | ~25,000                           | ~2,050   | ~2,250  |
| Page views      | ~73,000                           | ~6,100   | ~6,700  |



24,903 visits came from 138 countries/territories



### Assessing the impact of evaluation campaigns

- Assess the impact of the research they foster
  - Research that otherwise would not have been possible
  - Economic impact: technology transfer, time/effort saved for researchers, ...
  - Scientific impact: scholarly impact, patents, ...
- TREC: B. R. Rowe, D. W. Wood, A. N. Link, and D. A. Simoni. Economic impact assessment of NIST's Text REtrieval Conference (TREC) Program. Technical Report, Project Number 0211875, RTI International, 2010.
- TRECVid: C. V. Thornley, A. C. Johnson, A. F. Smeaton, and H. Lee. The scholarly impact of TRECVid (2003–2009). JASIST, 62(4):613–627, 2011.
- ImageCLEF: T. Tsikrika, A. G. Seco de Herrera, and H. Müller. Assessing the Scholarly Impact of ImageCLEF. In Proceedings of CLEF 2011.



## ImageCLEF scholarly impact: preliminary study

| Preliminary study                      |                      |  |  |  |  |  |  |  |
|--|----------------------|--|--|--|--|--|--|--|
| Carried out by                         | HES-SO               |  |  |  |  |  |  |  |
| Carried out in                         | April 2011           |  |  |  |  |  |  |  |
| Published in                           | CLEF 2011 conference |  |  |  |  |  |  |  |
| ImageCLEF years                        | 2003-2009            |  |  |  |  |  |  |  |
| ImageCLEF publications                 |                      |  |  |  |  |  |  |  |
| ImageCLEF papers in CLEF working notes |                      |  |  |  |  |  |  |  |
| ImageCLEF papers in CLEF proceedings   | $\checkmark$         |  |  |  |  |  |  |  |
| Papers describing ImageCLEF resources  | $\checkmark$         |  |  |  |  |  |  |  |
| Papers using ImageCLEF resources       |                      |  |  |  |  |  |  |  |

#papers

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### ImageCLEF publications and citations

|          |       | CLE    | F procee   | dings   | Image  | CLEF re   | sources | All    |           |         |  |
|----------|-------|--------|------------|---------|--------|-----------|---------|--------|-----------|---------|--|
|          | Year  | papers | citations  | h-index | papers | citations | h-index | papers | citations | h-index |  |
|          | 2004  | 5      | 13         | 2       | 4      | 31        | 3       | 9      | 44        | 4       |  |
|          | 2005  | 20     | 50         | 4       | _      | _         | _       | 20     | 50        | 4       |  |
| Ω        | 2006  | 25     | ${\bf 24}$ | 3       | 3      | 28        | 1       | 28     | 52        | 3       |  |
| pd       | 2007  | 27     | 25         | 2       | 6      | 29        | 2       | 33     | 54        | 3       |  |
| Scopus   | 2008  | 29     | 18         | 3       | 5      | 22        | 2       | 34     | 40        | 3       |  |
| <b>J</b> | 2009  | 45     | 14         | 2       | 2      | 4         | 1       | 47     | 18        | 2       |  |
|          | 2010  | 44     | 38         | 4       | 11     | 7         | 2       | 55     | 45        | 4       |  |
|          | Total | 195    | 182        | 6       | 31     | 121       | 5       | 226    | 303       | 9       |  |
|          | 2004  | 5      | 65         | 3       | 5      | 105       | 4       | 10     | 170       | 6       |  |
| lar      | 2005  | 20     | 210        | 8       | 5      | 47        | 4       | 25     | 257       | 10      |  |
| Scholar  | 2006  | 25     | 247        | 7       | 8      | 144       | 5       | 33     | 391       | 9       |  |
|          | 2007  | 27     | 259        | 7       | 10     | 76        | 4       | 37     | 335       | 9       |  |
| Google   | 2008  | 29     | 249        | 7       | 7      | 73        | 5       | 36     | 322       | 9       |  |
| 300      | 2009  | 45     | 284        | 7       | 7      | 53        | 4       | 52     | 337       | 9       |  |
| 5        | 2010  | 44     | 259        | 7       | 12     | 76        | 6       | 56     | 335       | 10      |  |
|          | Total | 195    | 1573       | 18      | 54     | 574       | 13      | 249    | 2147      | 22      |  |



### ImageCLEF scholarly impact: main findings

- 8.62 cites per paper on average
- Citations of overview vs. participants' papers
  - overviews: 15% of all publications, but attract around 50% of citations
  - 90% of the papers that have #citations ≥ h-index are overviews
- Citations of general vs. medical images papers
  - publications in medical domain have had slightly higher impact
  - particularly during 2006-2008
- Citations per task
  - Peak in second or third year of operation
  - Followed by a decline unless there is a major overhaul of the task
  - Tasks with greatest impact so far: photo retrieval, medical tasks
- ~70% of citations originating from papers not in CLEF proceedings



## ImageCLF scholarly impact: extended study

|  | Preliminary study    | Extended study                |
|--|----------------------|-------------------------------|
| Carried out by                         | HES-SO               | HES-SO<br>Royal School of LIS |
| Carried out in                         | April 2011           | January 2012                  |
| Published in                           | CLEF 2011 conference | in preparation                |
| ImageCLEF years                        | 2003-2009            | 2003-2011                     |
|  | ImageCLEF p          | ublications                   |
| ImageCLEF papers in CLEF working notes |                      | $\sqrt{}$                     |
| ImageCLEF papers in CLEF proceedings   | $\checkmark$         | $\checkmark$                  |
| Papers describing ImageCLEF resources  | $\checkmark$         | $\checkmark$                  |
| Papers using ImageCLEF resources       |                      | $\checkmark$                  |
| #papers                                | 249                  | ~ 1,000                       |



### **Events in other forums**

- ImageCLEF @ ICPR 2010 contests
  - 3 contests: photo annotation, robot vision, information fusion
    - ImageCLEF 2009 datasets
    - photo annotation, robot vision: more complex than in ImageCLEF
    - 90 registered groups, 30 submitting results
  - 4<sup>th</sup> contest: interactive image retrieval
    - not enough participants
- MCBR-CDS workshops @ MICCAI 2009, 2011
  - Medical Content-based Retrieval for Clinical Decision Support @ Intl.
     Conf. on Medical Image Computing & Computer Assisted Intervention
  - ImageCLEF 2009, 2011 medical image retrieval datasets
  - ~10 groups used the datasets
  - Need for standardised datasets & evaluation methodology



### **ImageCLEF 2012**

- Photo annotation and retrieval
  - Training on manually annotated (reliable) samples
  - Training on automatically generated (noisy) samples
  - Concept-based retrieval
- Medical image classification and retrieval
  - Modality classification
  - Move closer to clinical routine: focus on case-based retrieval
  - Collaboration with National Library of Medicine (USA)
- Robot vision
  - Multimodal place recognition
  - Perspective camera and kinect mounted on mobile robot
- Plant identification
  - More plant species
  - Mobile phone pictures



### **Future directions**

- Research challenges
  - Combination of media
  - Scalability
- Scientific multimedia data
  - Botanical, bio-imaging, earth observation, etc.
- Continuous evaluation
- Component-based evaluation
  - Groups can concentrate on the area of their expertise
- Interactive retrieval
- Automation of ground truth generation



### **Conclusions**

- ImageCLEF evaluation campaign
  - Entering its 10<sup>th</sup> year with evidence of important impact
  - Bringing together researchers from multiple diverse communities
  - Various, continuously evolving tasks always open for new suggestions!
  - Technology and benchmarks need to go hand in hand
- Interested in participating in ImageCLEF 2012?
  - Registration opens in Ferbuary, closes in May
  - Datasets released in March-April
  - Runs submitted in late May-early June
  - Results released in mid July
- Interested in proposing a task for ImageCLEF 2013?
  - Please contact us (henning.mueller@hevs.ch, theodora.tsikrika@acm.org)
  - Task and datasets need to be fully defined by October 2012



## Thank you!



http://www.imageclef.org