# IPOL: a new journal for fully reproducible research; analysis of four years development

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#### Reproductible research in sciences:

Theoretical scientists share demonstrations;

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- Experimental scientist share procedures;



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- Experimental scientist share procedures;
- Computational scientists... ?



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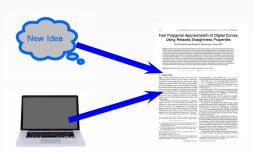
- Theoretical scientists share demonstrations;
- Experimental scientist share procedures;
- Computational scientists... ?

#### Computer Science:

- Description of methods/algorithms;
- description often limited (constraints on page limits);
- parameters not given or not well described;
- steps of pre/post processing missing.

#### Research in Computer Science:

- 1 New idea;
- 2 demonstration, implementation;
- 3 article publication.



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#### Reusable Research:

- 1 Article which seems interesting;
- 2 re-implement the algorithm;
- 3 conformity of the results with the original.



#### Frequent difficulties in computer science (image processing):

- Source code often not available (or not reviewed);
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#### Consequences:

- Comparisons and experiments difficult;
- potential time loss for the reader;
- limits the diffusion of research.



#### Providing source code/data

- A real added value for the publication;
- ⊕ increases the impact/comparisons;
- software is not really acknowledged;
- ⊖ important effort (documentation, tests, user maintenance).

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#### Software Diffusion

- Specialized journals in software: Source Code for Biology and Medicine, Journal of Open Research Software, Computing in Science and Engineering, ...
- Diffusion platform:
   RunMyCode / Run&Share, Figshare, DataDryad, Harvard Dataverse, Ubiquity Metajournals, Zenodo (avec doi) ...
- ⇒ no validation, no scientific review (reliability and durability problem).

## 1. The IPOL Journal: origin and motivation

#### Origin:

- Journal started in October 2009:
- under the initiative of Nicolas Limare, Jean-Michel Morel and the Image Processing team at the CMLA lab (ENS-Cachan);
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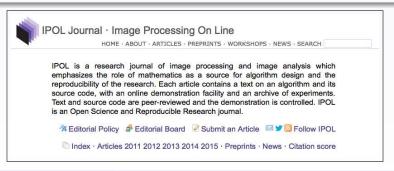
#### Motivation [Limare & Morel 2009]:

- Reproductible research:
- new way to publish research results;
- allows everybody to test the algorithms:
  - ⇒ with their own images
- independent of the platform (the demos execute on the server side and the results are shown to the user using a web interface).

## 1. IPOL Journal: principle and current form (1)

#### Characteristics:

- Research journal in image processing;
- each article contains a description of one algorithm and its source code;
- association of each article with its online demonstration, with archived experiments;
- the peer-review process includes the article, demo, and source code;
- Open Science journal and Reproductible Research.



## 1. IPOL Journal: principle and current form (2)

#### Philisophy of the journal:

- Follows the guideline on reproductible research topics;
- reproductible research standard [Stodden 09a] [Stodden 09b];
- answer to credibility crisis in scientific computation (as pointed out by Donoho [Donoho et al. 09]).

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#### What IPOL is not:

- IPOL publishes algorithms along with their implementation, but not compiled software:
- IPOL is not a software library (each code has minimal dependencies);
- IPOL is not a software or code diffusion platform.

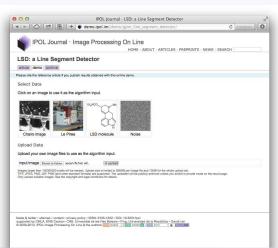
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Current form: "classic" (with online PDF).



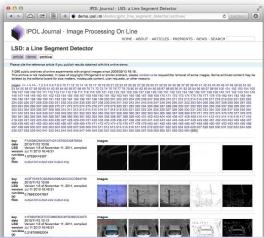
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- Current form: "classic" (with online PDF).
- Associated demos.
- Archive containing experiments with data uploaded by users.



#### 1. IPOL Journal: editorial structure

### Same aspects as a classical journal:

- Editorial project, editorial committee;
- articles, authors, editors;
- reviewing process and validation;
- ISSN, DOI;
- special issues;
- currently indexed by: Scirus, Google Scholar, DBLP, DOAJ, SHERPA/RoMEO, Héloïse, WorldCat, CrossRef, Ulrich, Index Copernicus, PBN, JGate, VisionBib, CVonline, JournalSeek, and NewJour.

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#### Software point of view:

- Each article should propose an implementation;
- reviewing step, verification, validation, and publication;
- reviewer: check the correspondence between the algorithm description in the article and code (+ code readability and code documentation).

## 2. Scientific & technical achievements to establish a state of the art (1)

#### Image Denoising

- Papers on image denoising cover most of the state of the art in image denoising.
   analyze and finalize the often incomplete algorithms.
- Online implementation allows the first objective comparison.
- complete state of the art of denoising
- ⇒ See the noise Clinic [Lebrun et al. 15]

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#### Stereovision

The stereovision category at IPOL contains five fundamental algorithms:

- Quasi-Euclidean Epipolar Rectification [Monasse 11].
- Kolmogorov & Zabih's graph cuts stereo matching algorithm [Kolmogorov et al. 14].
- Stereo disparity through cost aggregation with guided filter [Tan & Monasse 14].
- Integral images for block matching [Facciolo et al. 14].
- Bilaterally weighted patches for disparity map computation [Fernandez & Monasse 15].
- ⇒ Others in preparation.

## 2. Scientific & technical achievements to establish a state of the art (2)

#### Stereovision

- First workshop demo delivering a 3D digital elevation model of the ground from satellite images.
- available here: http://dev.ipol.im/~carlo/ipol\_demo/workshop\_s2p

## 3. Technical Issues Overcome Through the Development of IPOL

### First problem: reference programming languages

The chosen languages must:

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#### Accepted languages and libraries

- First accepted languages: ANSI C/C++;
- currently accepted libraries: libtiff, libjpeg, libpng, zlib, FFTW, GSL, Eigen, cblas, and clapack;
- currently accepted MATLAB toolboxes: Image Processing, Optimization, Wavelet;
- new accepted frameworks: MATLAB, Python (with NumPy and SciPy);
- other languages might be considered and accepted.

#### Second problem: design an online demo system

A **demo system** was created for this purpose, from scratch. It has to **manage the execution** of each online experiment:

- The parameters and result pages are different in each demo;
- the test images are different in each demo;
- users must be able to upload their own images;
- it has to be fast enough to allow online execution → Multiple CPU system;
- it has to archive user experiments (input data, input parameters, and results).

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#### Problems detected in the current system

The current system is **usable** and **functional**, but we detected **several problems**:

- Creating a new demo implies coding in Python and designing HTML templates;
- non-scalable, too complex internal structure, and with lack of modularization.
- ⇒ Now moving towards a modular system with automatic demo generation.

#### Problems in the current demo system

- Most of the problems related to the architecture of the system;
- system designed as an object-oriented monolithic kernel;
- too complex, with tightly interface-coupled components;
- non-scalable;
- not easy to distribute the system over different machines.

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#### Improvements

#### We're currently working on improving the system

- Modular architecture:
  - Specialized standalone modules;
  - the monolithic kernel becomes a simple controller;
  - the core controller and the modules communicate via webservices.
  - Automatic demo generation:
    - Each demo is specified using a simple textual description (name, type, and default value of the parameters and format of result page);
    - no need to code or design any page to build a new demo.

3. Technical Issues overcome through the development of IPOL

#### Quality of articles and a "natural selection"

Most failed IPOL projects aborted when:

- the described algorithm was incomplete;
- did not give all the results described in the paper;
- run time not reasonable:
- worked only on a certain type of data.

Progress towards the **establishment of a full state of the art** in each of the main sections of the journal

Identify algorithms representing a very substantial portion of the state of the art:

- Most efficient algorithms should be published;
- proposed theories and methods, even though they are not (or no longer) considered the best.

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#### Some sections currently in IPOL

- Color and Contrast (10 articles)
- Denoising (15 articles)
- Demosaicking (6 articles)
- Interpolation (4 articles)
- Optical Flow (6 articles)
- Vision Through Turbulence (3 articles)
- ...

## Goal: cover must of their respective state of the art (performance and descriptions of main mathematical techniques)

#### Others sections

- 3D
- Blur
- Computational Photography
- Geometry
- Infrared
- Learning and Detection
- Inpainting
- Image Comparison
- PDE
- Stereovision
- Texture
- ...
- → However, still incomplete!

## Example of advantages of a reproducible algorithms with Stereovision: **Middlebury** stereo evaluation

- One method [Fernandez & Monasse 15] was implemented from an algorithm on adaptive neighborhoods [Yoon & Kweon 06];
- the obtained results were different!
- it was discovered that a **post-processing** must be applied to the main algorithm;
- there is no mention of a post-processing in the original article [Yoon & Kweon 06]!

#### Criticism to IPOL

- Excessive effort (rigor, run on any data, code description);
- excessive length of the peer review report (including code review: slow and demanding);
- large number of objects to be published (article, source code, demo);
- no official impact factor;
- frustrating to work on algorithms designed by others;
- restricted number of authorized libraries or toolboxes (as libjpeg, libtiff, FFTW, MATLAB Image Processing toolbox,...)

#### Authors and publishers praised IPOL for:

- Immediate impact of their publication;
- impact due to the very existence of the demo;
- gain tangible industrial and academic credibility;
- facilitate obtaining research funding (ERC, ONR, ANR, DGA, CNES, FUI, ...)

## Conclusions (I)

- Reproducible Research redefines the output of the research: not only the article, but also the source code and the data.
- IPOL is a complete and fully functional Reproducible Research journal: articles, demos, data. Everything is free or open source.
- For the authors it takes more effort to write Reproducible Research articles, but:
  - ⇒ benefit is immediate (credibility and number of citations);
  - $\Rightarrow$  for both the IPOL article and the one published in a different journal with a demo available in IPOL).
- It is important to adapt the journal to the community needs and usages:
  - ⇒ accept commonly used languages, libraries, and frameworks.

## Conclusions (II)

#### Pseudo-code is the main production of IPOL over the source code itself:

- The pseudo-code describes the significant parts of the algorithm;
- it does not contain all the details needed to encode it using an actual programming language;
- the pseudo-code is aimed to be readable, and reusable;
   in general, it is between one and two orders of magnitude shorter than the actual source code.
- the pseudo-code is **unambiguous** to the mathematician reader.

## What is Next? (I)

#### Facts:

- More than 5000 articles/year on Computer Vision and Image processing describing algorithms;
- however, about 200 of these articles would we enough to cover the CV and IP state of the art. Less than 400 if exhaustive.

IPOL is producing 40 articles/year  $\rightarrow$  It can exhaust the state of the art (old and new) in about 7 years.

## What is Next? (II)

#### Moving towards a new way to do research

- What is next, then? → Focus on incremental research.
- Antecedents: analysis of the genome.
- Oycle:
  - review estabilished and published algoritms;
  - combine them;
  - improve them to achieve new and better results and applications.

#### In definitive, a new methodology to do research in CV and IP

## Acknowledgement

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## IPOL citations (07/28/2015)





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