

# *Du dual de BV à la détection d'empreintes digitales*

**Jean-Michel Morel**, ENS Paris-Saclay

sur un modèle mathématique de

**Yves Meyer** (1) ENS Paris Saclay

généralisant un fameux modèle de :

**Leonid Rudin** (2) Cognitech, Inc.

avec des expériences utilisant l'article en ligne de :

**Vincent Le Guen** (3) Telecom Paristech

basées sur une analyse des modèles due à :

**Jean-François Aujol** (4) Université de Bordeaux

sur un modèle proposé par :

**Mila Nikolova** (5) ENS Paris Saclay

et par un algorithme d'optimisation inventé par :

**Antonin Chambolle** (6) Ecole Polytechnique, Thomas Pock Technische Universität Graz

**(1) Yves Meyer *Oscillating patterns in image processing and nonlinear evolution equations* (2001)**

(2) L. I. Rudin, S. Osher, and E. Fatemi *Nonlinear total variation based noise removal algorithms* (1992)

(3) V. Le Guen *Cartoon + Texture Image Decomposition by the TV-L1 Model*, (2014)

(4) J.-F. Aujol, G. Gilboa, T. Chan & S. Osher, *Structure-Texture Image Decomposition* (2005)

(5) M. Nikolova *Minimizers of cost-functions involving non-smooth data-fidelity terms....*

(6) A. Chambolle and T. Pock, *A first-order primal-dual algorithm for convex problems ...*(2011)

# Généalogie des fonctions à variation bornée (BV):

[https://en.wikipedia.org/wiki/Bounded\\_variation](https://en.wikipedia.org/wiki/Bounded_variation)

According to Boris Golubov, *BV* functions of a single variable were first introduced by [Camille Jordan](#), in the paper ([Jordan 1881](#)) dealing with the convergence of [Fourier series](#). The first successful step in the generalization of this concept to functions of several variables was due to [Leonida Tonelli](#),<sup>[1]</sup> who introduced a class of [continuous](#) *BV* functions in 1926 ([Cesari 1986](#), pp. 47–48), to extend his [direct method](#) for finding solutions to problems in the [calculus of variations](#) in more than one variable. Ten years after, in ([Cesari 1936](#)), [Lamberto Cesari](#) changed the [continuity](#) requirement in Tonelli's definition to a less restrictive [integrability](#) requirement, obtaining for the first time the class of functions of bounded variation of several variables in its full generality: as Jordan did before him, he applied the concept to resolve of a problem concerning the convergence of [Fourier series](#), but for functions of *two variables*. After him, several authors applied *BV* functions to study [Fourier series](#) in several variables, [geometric measure theory](#), [calculus of variations](#), and [mathematical physics](#).

[Renato Caccioppoli](#) and [Ennio de Giorgi](#) used them to define [measure of nonsmooth boundaries of sets](#) (see the entry "[Caccioppoli set](#)" for further information). [Olga Arsenievna Oleinik](#) introduced her view of [generalized solutions](#) for [nonlinear partial differential equations](#) as functions from the space *BV* in the paper ([Oleinik 1957](#)), and was able to construct a generalized solution of bounded variation of a first order partial differential equation in the paper ([Oleinik 1959](#)): few years later, [Edward D. Conway](#) and [Joel A. Smoller](#) applied *BV*-functions to the study of a single [nonlinear hyperbolic partial differential equation](#) of [first order](#) in the paper ([Conway & Smoller 1966](#)), proving that the solution of the [Cauchy problem](#) for such equations is a function of bounded variation, provided the [initial value](#) belongs to the same class. [Aizik Isaakovich Vol'pert](#) developed extensively a calculus for *BV* functions: in the paper ([Vol'pert 1967](#)) he proved the [chain rule for BV functions](#) and in the book ([Hudjaev & Vol'pert 1985](#)) he, jointly with his pupil [Sergei Ivanovich Hudjaev](#), explored extensively the properties of *BV* functions and their application. His chain rule formula was later extended by [Luigi Ambrosio](#) and [Gianni Dal Maso](#) in the paper ([Ambrosio & Dal Maso 1990](#)).

Les trois formules fondamentales pour decomposer une image  $\mathbf{f}$  = cartoon  $\mathbf{u}$  + texture  $\mathbf{v}$

$$TV-L^2 \text{ (ROF)} \quad \inf_{(u,v) \in BV \times L^2 / f=u+v} \left( \int |Du| + \lambda \|v\|_{L^2}^2 \right) \quad (1)$$

$$TV-G \text{ (Meyer)} \quad \inf_{(u,v) \in BV \times G / f=u+v} \left( \int |Du| + \lambda \|v\|_G \right) \quad (2)$$

$$TV-L^1 \text{ (Nikolova, Aujol)} \quad \inf_{(u,v) \in BV \times L^1 / f=u+v} \left( \int |Du| + \lambda \|v\|_{L^1} \right) \quad (5)$$



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Image f

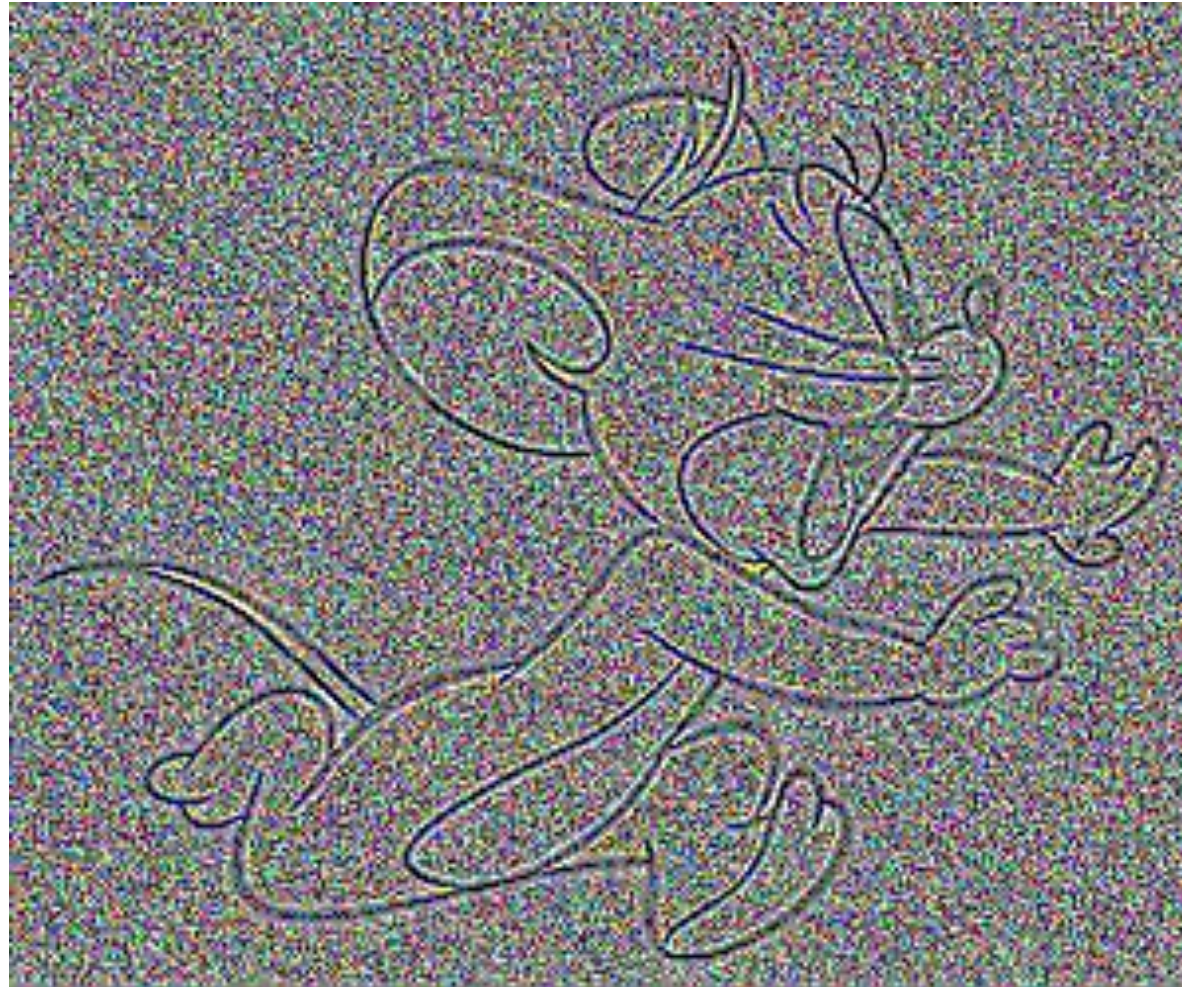
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Cartoon u (à variation bornée) +

Archive de IPOL : <http://demo.ipol.im/demo/103/archive>



Texture  $v$  (très oscillante)

Archive de IPOL : <http://demo.ipol.im/demo/103/archive>

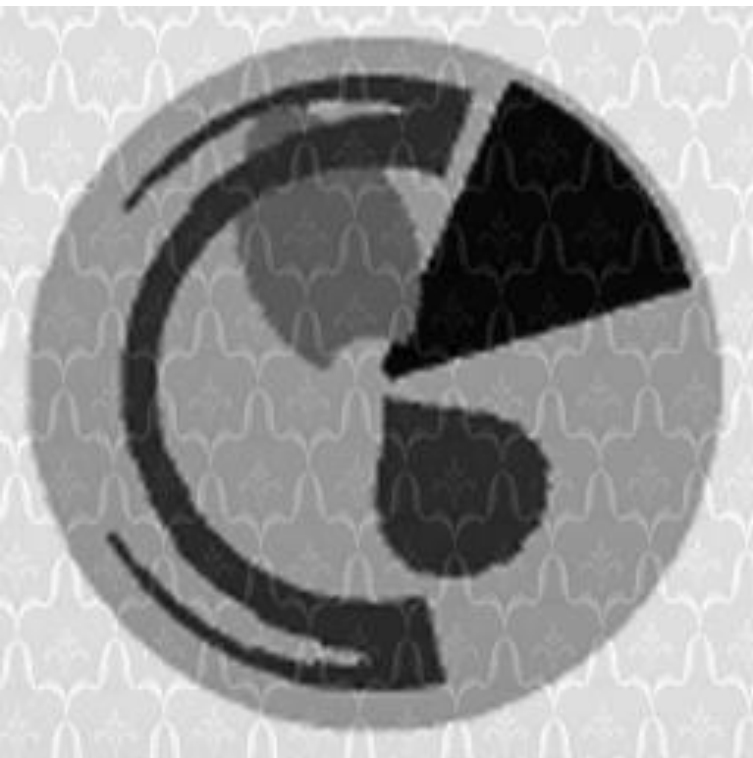


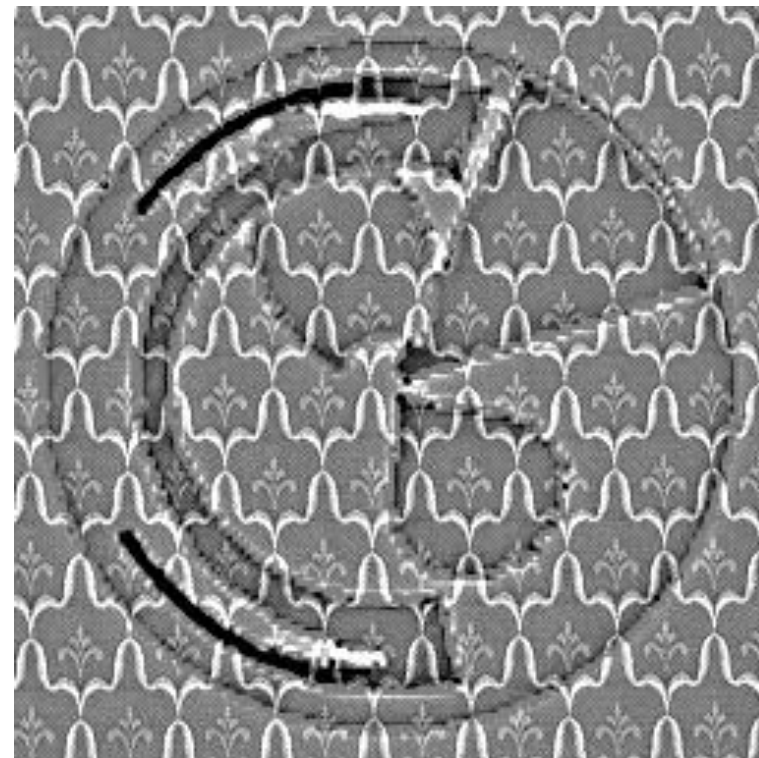
Image f

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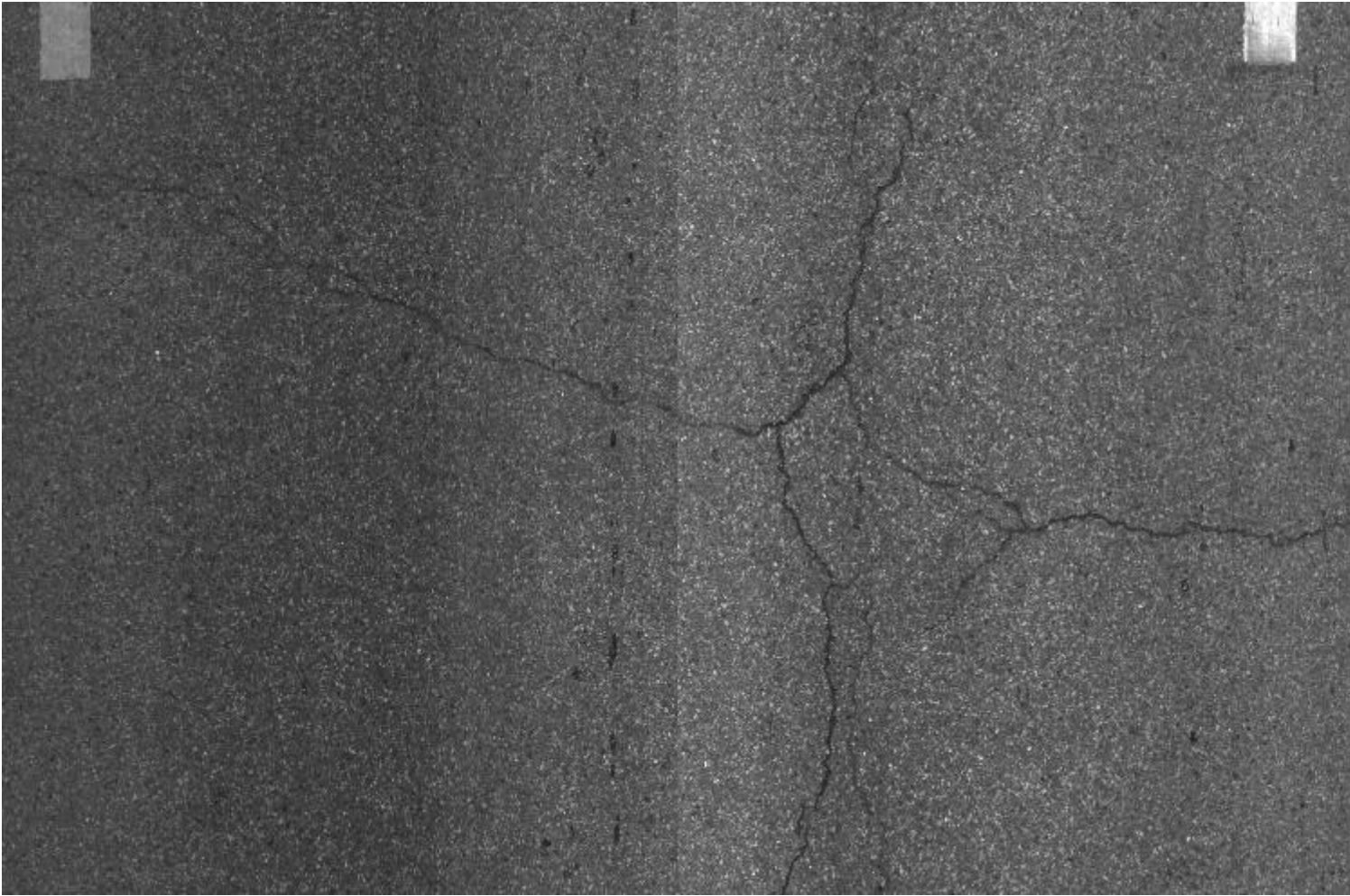
Cartoon u

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Texture v

Archive de IPOL : <http://demo.ipol.im/demo/103/archive>



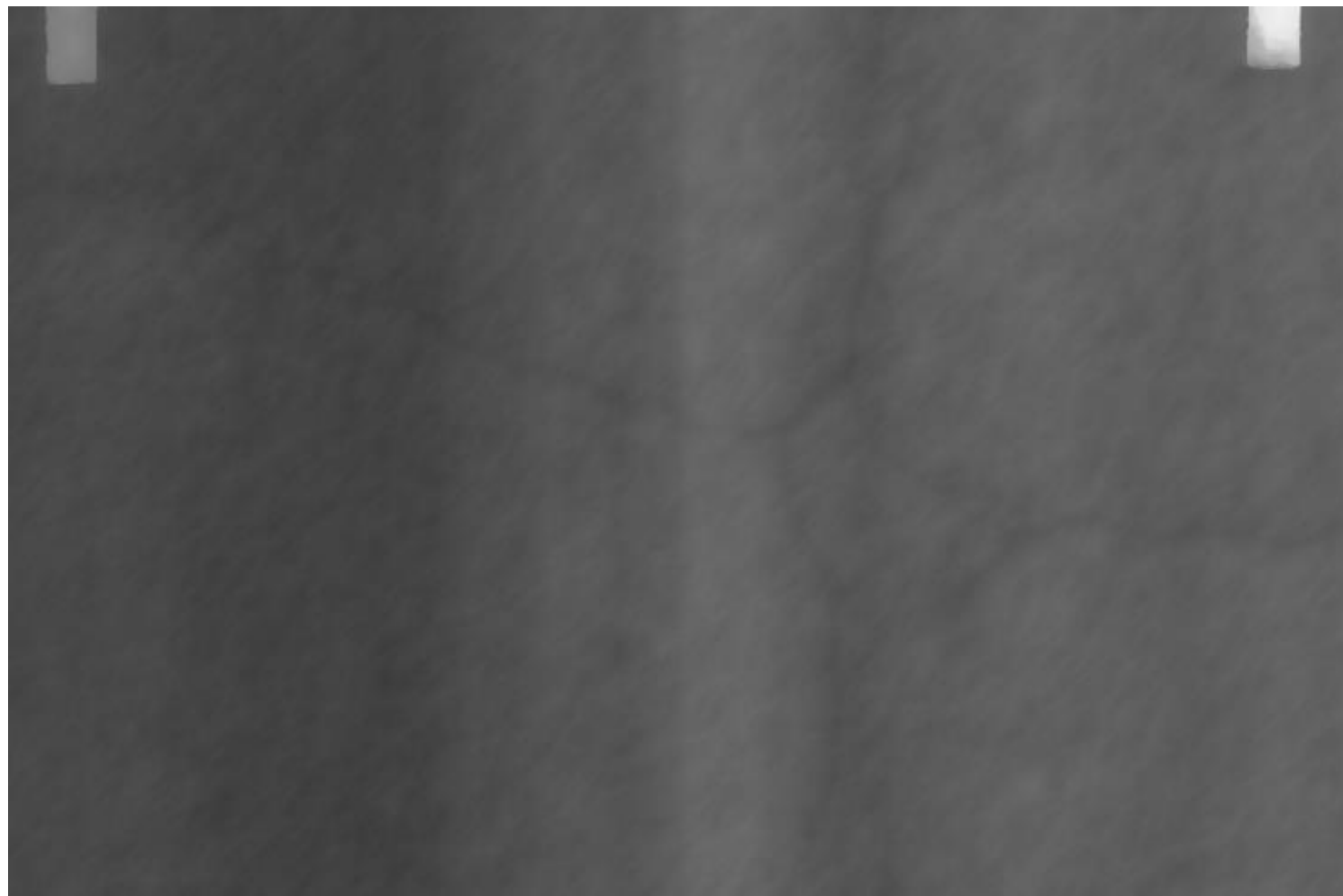
Image

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Archive de IPOL : <http://demo.ipol.im/demo/103/archive>

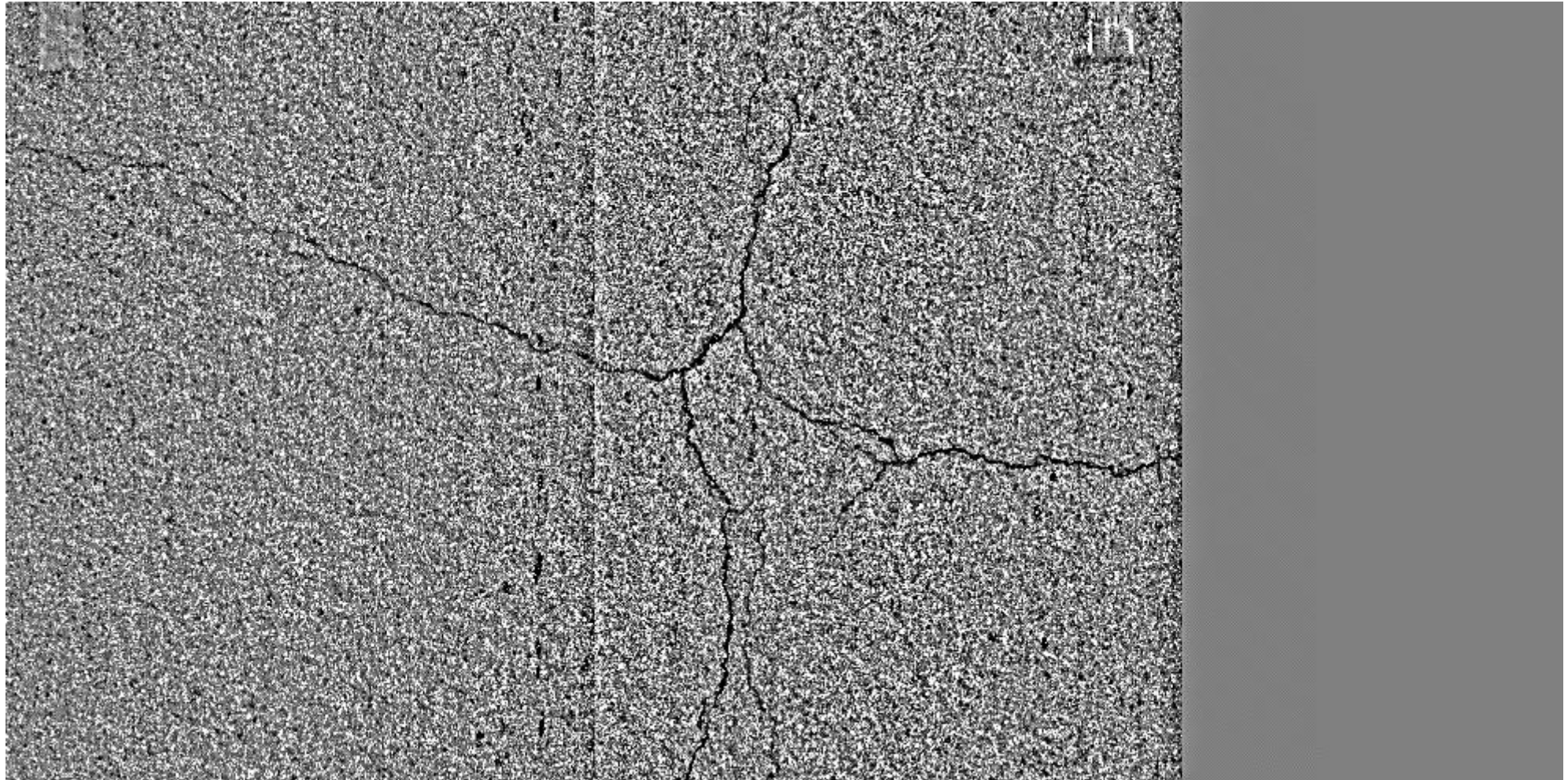


Cartoon

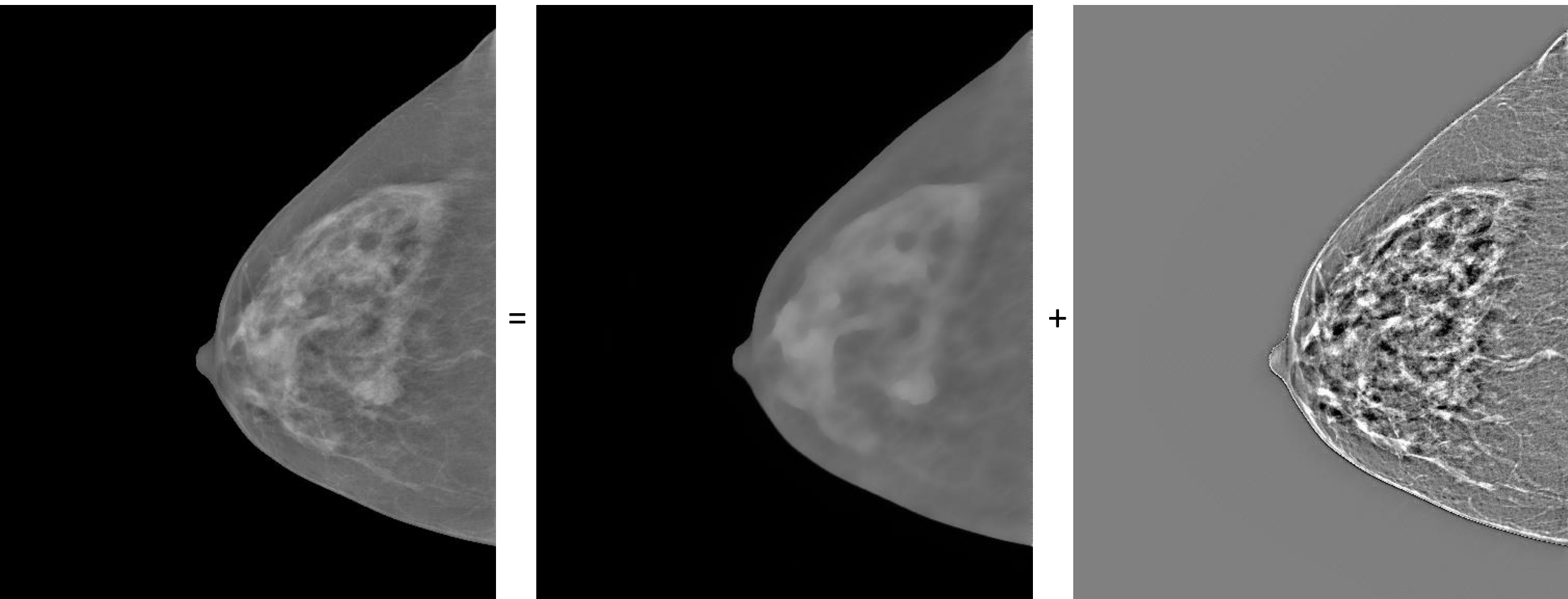
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Archive de IPOL : <http://demo.ipol.im/demo/103/archive>



Texture (fissures bien plus faciles à détecter)



Image

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Cartoon

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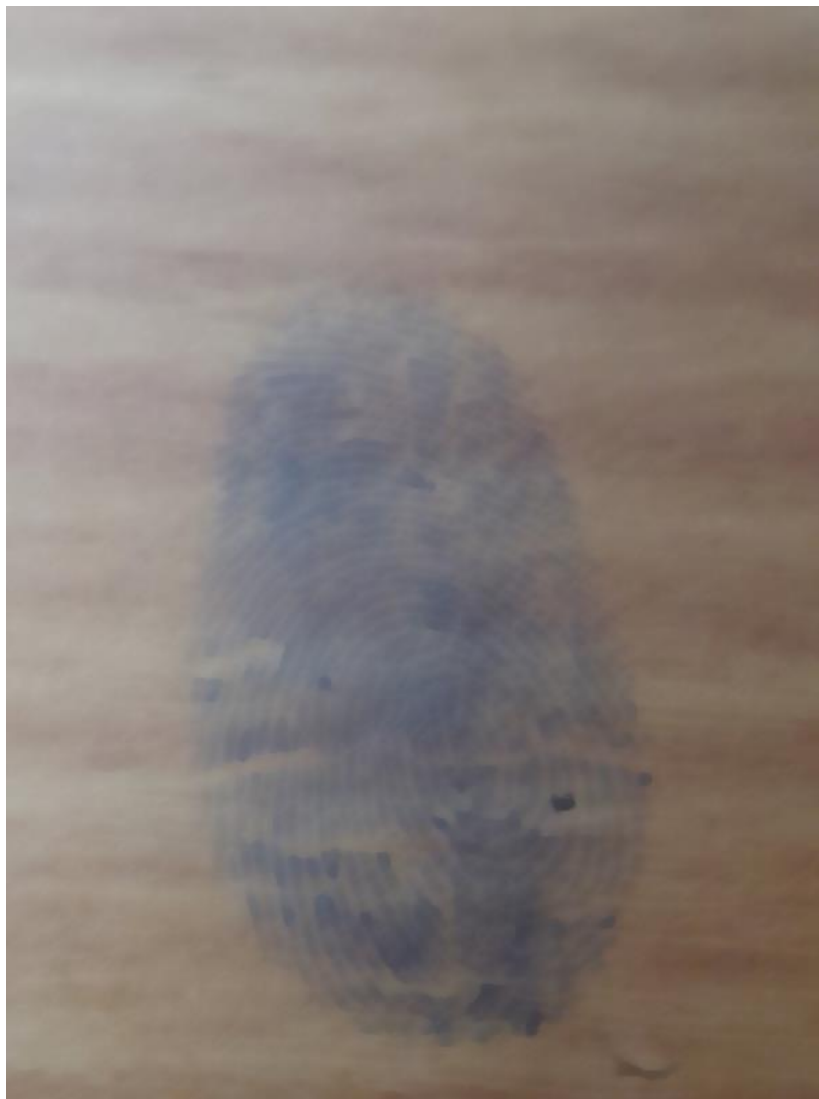
Texture

Mammographie, détection de cancer du sein, rehaussement des détails dans la texture

Archive de IPOL : <http://demo.ipol.im/demo/103/archive>



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Image

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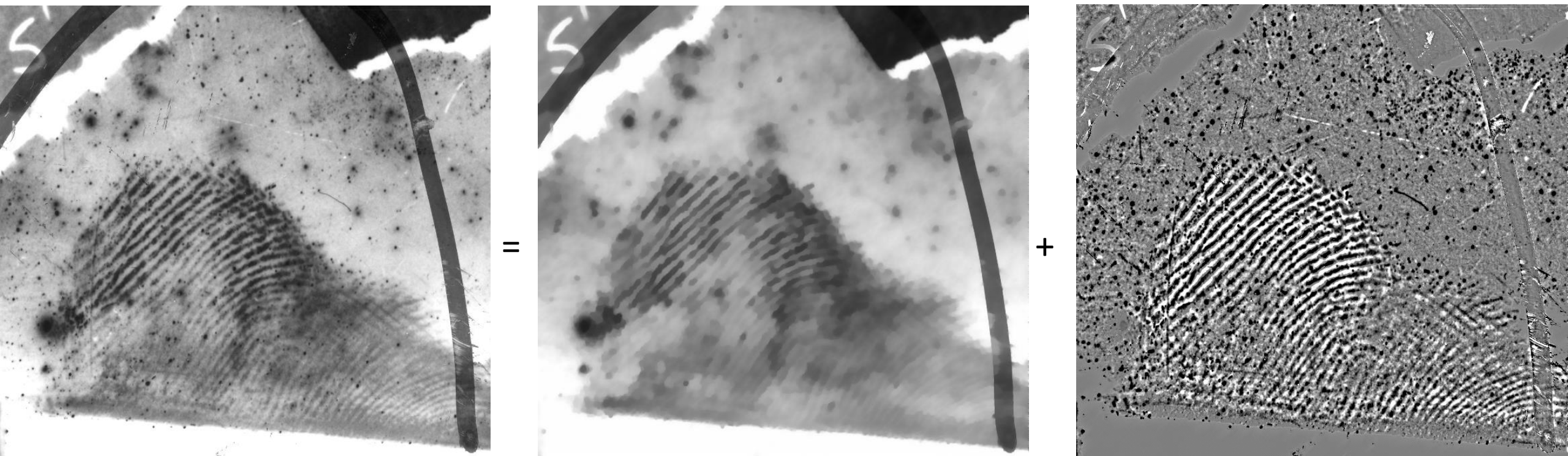
Cartoon

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Texture

Extraction d'empreintes digitales de (pour les soumettre à un système automatique de reconnaissance)

Archive de IPOL : <http://demo.ipol.im/demo/103/archive>



Image

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Cartoon

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Texture

Extraction d'empreintes digitales de (pour les soumettre à un système automatique de reconnaissance)

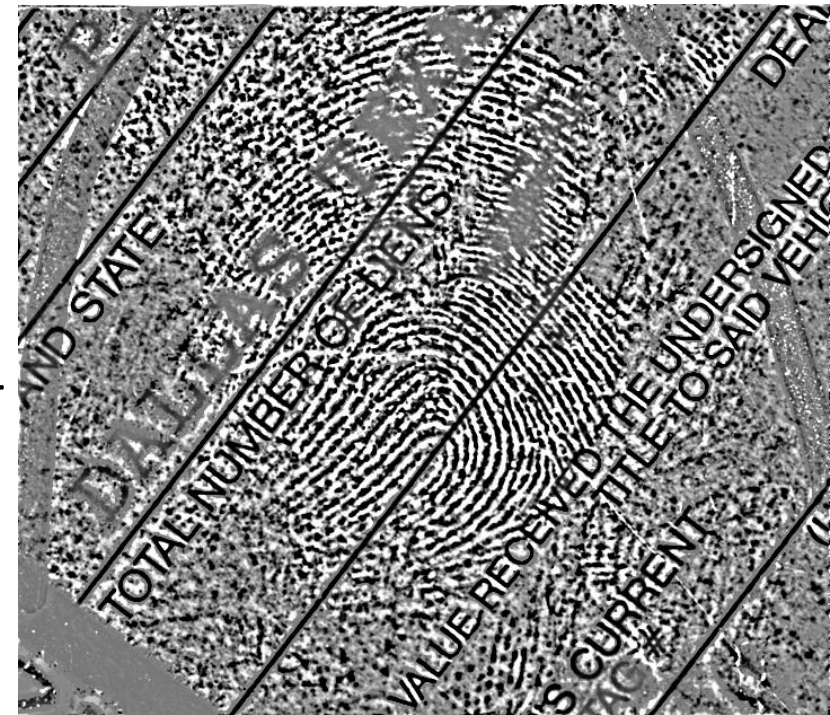
Archive de IPOL : <http://demo.ipol.im/demo/103/archive>



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Image

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Cartoon

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Texture

Extraction d'empreintes digitales de (pour les soumettre à un système automatique de reconnaissance)

Archive de IPOL : <http://demo.ipol.im/demo/103/archive>



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Image

f

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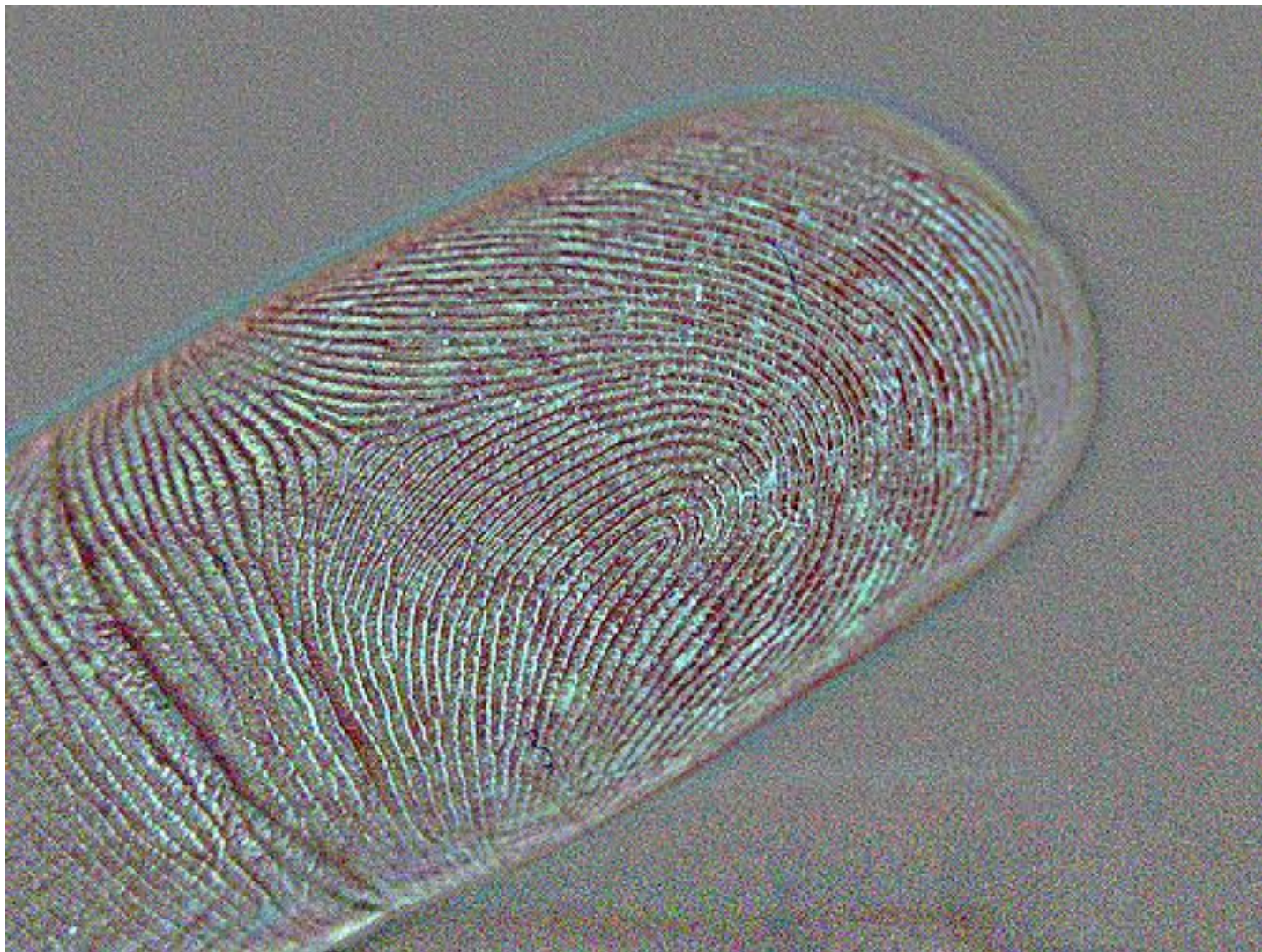
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Cartoon

u

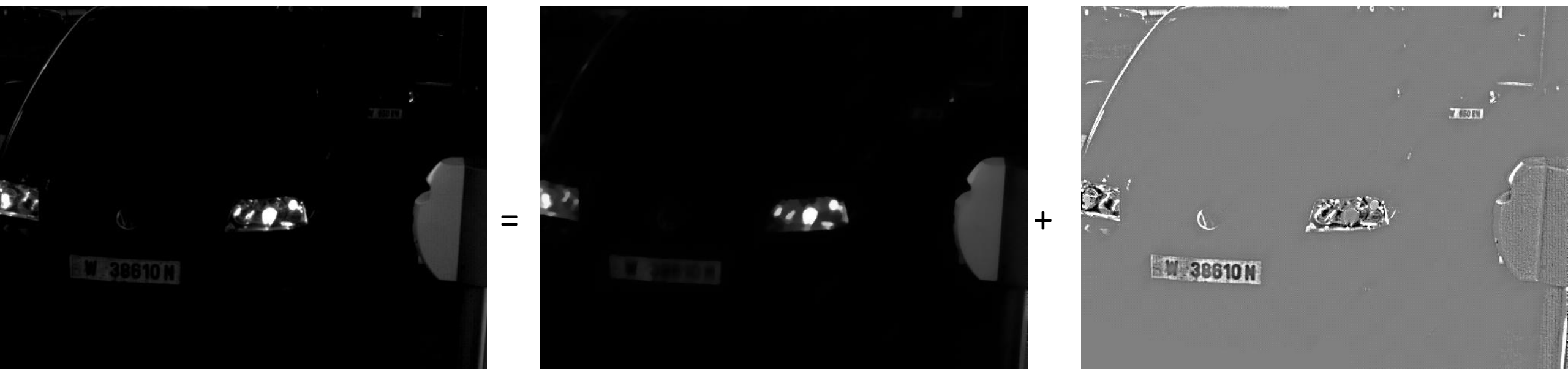
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Texture v

Archive de IPOL : <http://demo.ipol.im/demo/103/archive>



Image

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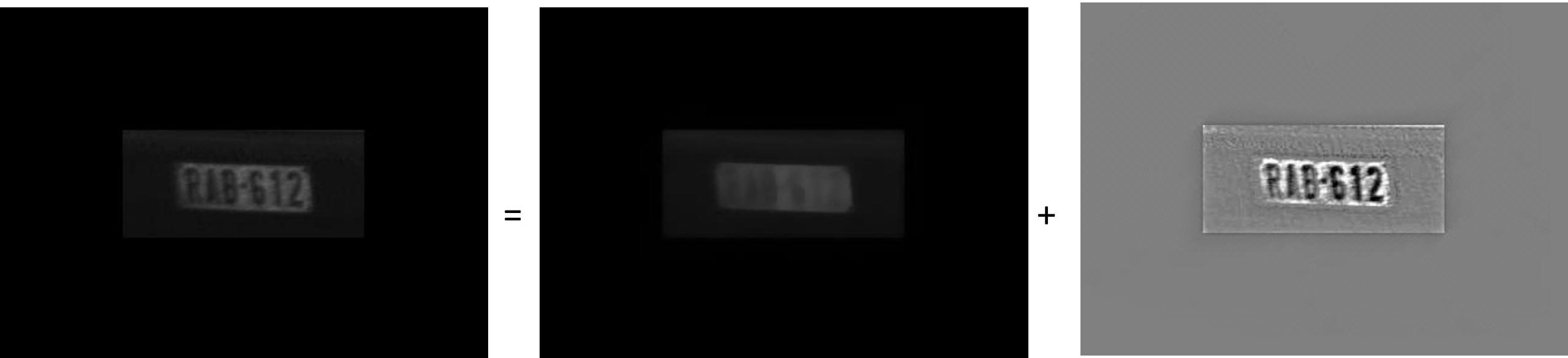
Cartoon

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Texture

Extraction de plaques d'immatriculation (pour reconnaissance automatique de caractères)

Archive de IPOL : <http://demo.ipol.im/demo/103/archive>



Image

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Cartoon

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Texture

**Extraction de plaques d'immatriculation (pour reconnaissance automatique de caractères)**

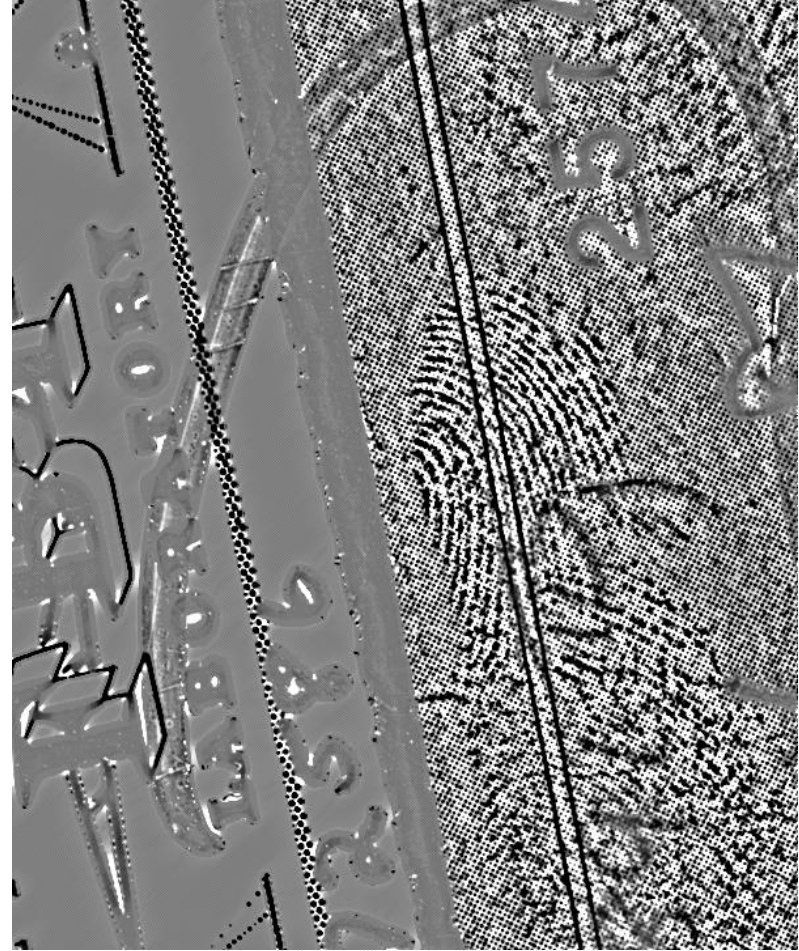
Archive de IPOL : <http://demo.ipol.im/demo/103/archive>



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Image

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Cartoon

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Texture

Extraction d'empreintes digitales de (pour les soumettre à un système automatique de reconnaissance)

Archive de IPOL : <http://demo.ipol.im/demo/103/archive>

# Merci !

Retrouvez toutes ces expériences dans IPOL (Image Processing on Line) et faites en d'autres:

<http://www.ipol.im/pub/art/2014/103/>

(1) Yves Meyer *Oscillating patterns in image processing and nonlinear evolution equations* (2001)

(2) Leonid I. Rudin, Stanley Osher, and Emad Fatemi *Nonlinear total variation based noise removal algorithms* (1992)

(3) Vincent Le Guen *Cartoon + Texture Image Decomposition by the TV-L1 Model*, (2014)

(4) Jean-Francois Aujol, Guy Gilboa, Tony Chan & Stanley Osher, *Structure-Texture Image Decomposition* (2005)

(5) M. Nikolova *A variational approach to remove outliers and impulse noise*, 2004.

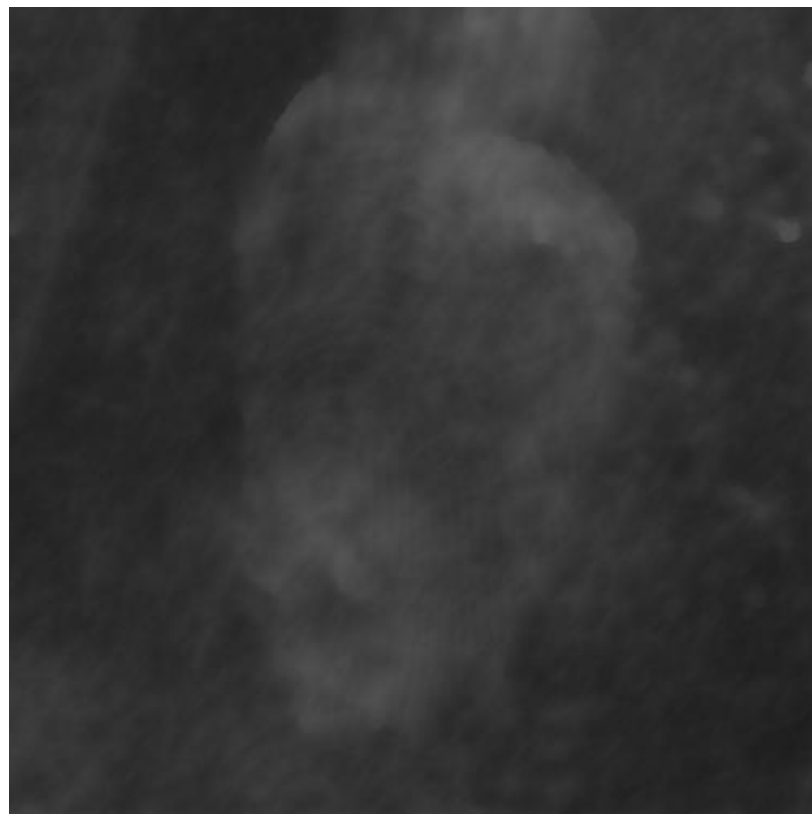
(6) Antonin Chambolle *An algorithm for total variation minimization and applications* (2004)





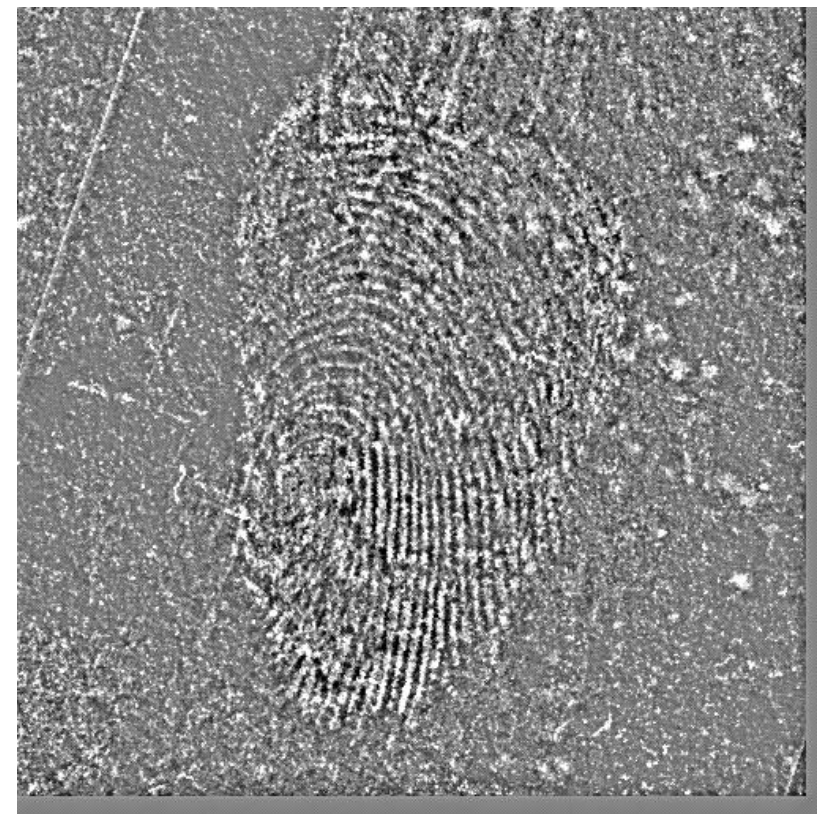
Image

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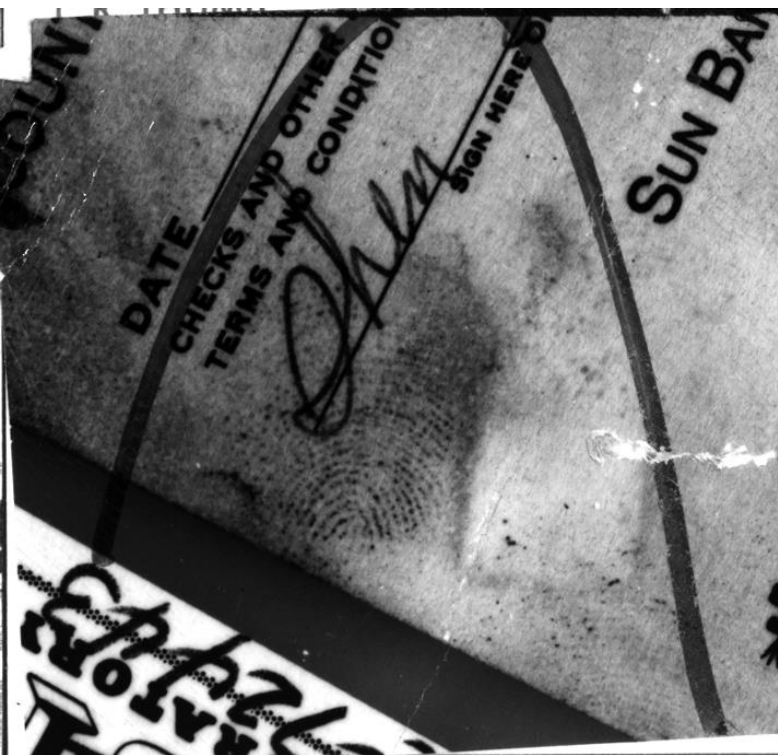


Cartoon

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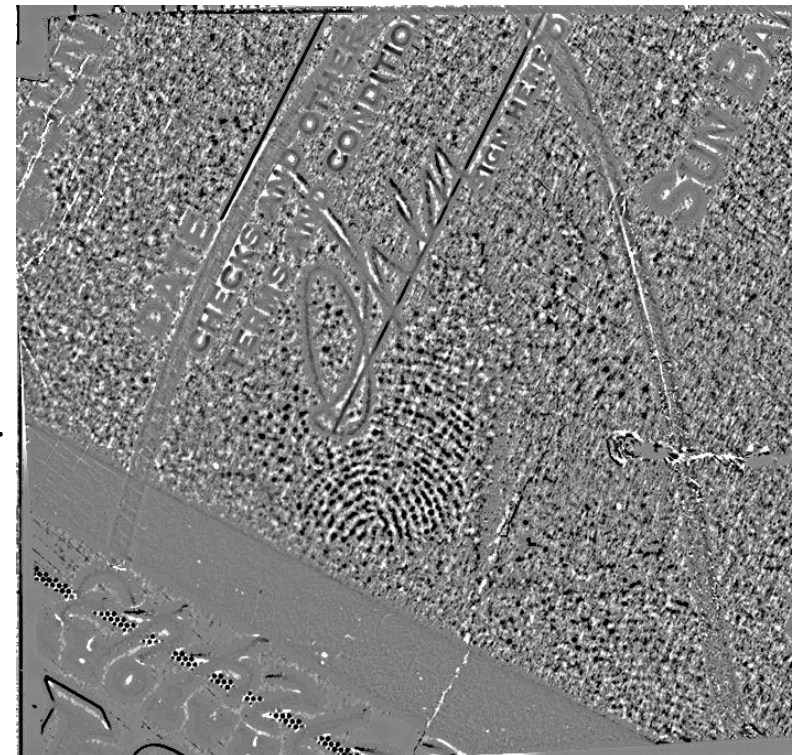
Texture



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Image

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Cartoon

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Texture

Extraction d'empreintes digitales de (pour les soumettre à un système automatique de reconnaissance)





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Image

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Cartoon

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Texture

Extraction d'empreintes digitales de (pour les soumettre à un système automatique de reconnaissance)

Image

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Cartoon

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Texture

Image

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Cartoon

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Texture



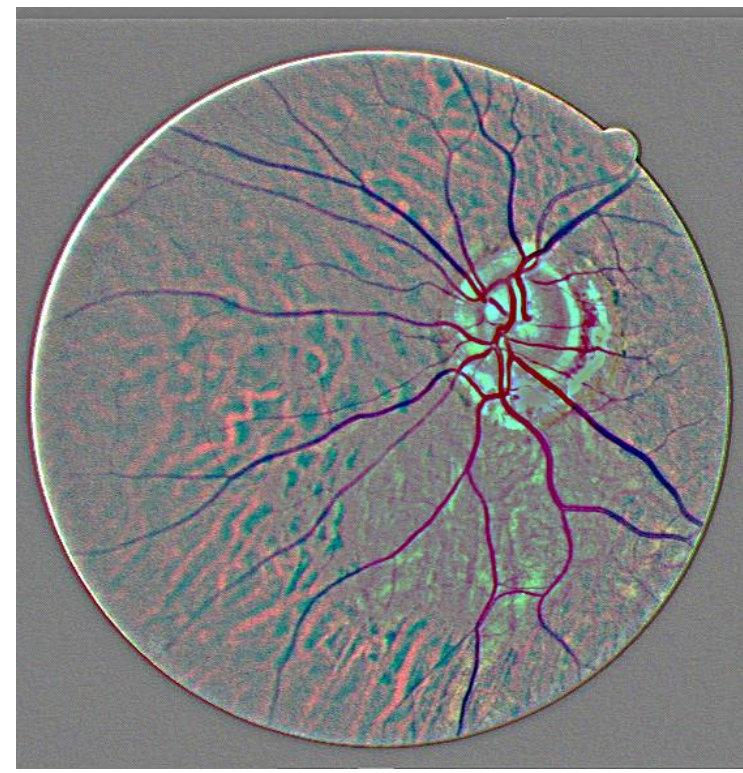
Image

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Cartoon

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Texture

Rétinoscopie (extraction du réseau sanguin)



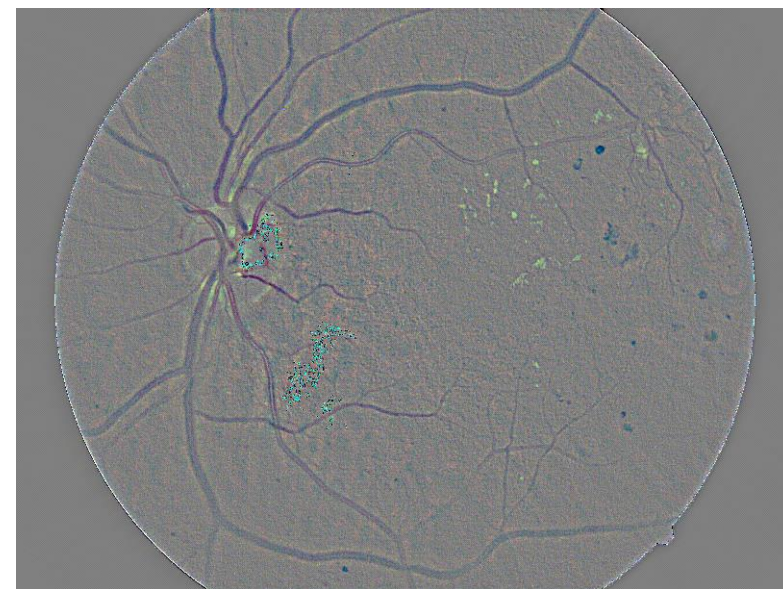
Image

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Cartoon

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Texture