# Proximal Algorithm for L<sub>1</sub> combined with Maxent prior: A NEW APPROACH FOR DOSY SIGNAL PROCESSING

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#### DOSY NMR

Diffusion Ordered SpectroscopY is a Nuclear Magnetic Resonance experiment using PFG (Pulsed Field Gradient), used to identify species in a complex chemical mixture by measuring its diffusion distribution.

• DOSY NMR Signal

$$I(q) = \int_{D_{min}}^{D_{max}} X(D) exp(-D\Delta q^2) dD$$

whith X(D) is the diffusion distribution of the molecular species, I is the signal intensity,  $q = \gamma \delta g$  presents the measure of the phase dispersion created by the PFG.  $\gamma$  is the gyromagnetic ratio of the studied spin, and  $\delta$  and g are the duration and intensity of the PFG respectively.

#### Goal

Find the chemical species from its diffusion profile by inverting the Laplace equation  $\rightsquigarrow$  Ill posed problem.

### Theory

• Lagrangian formulation

$$\underset{X \in \mathbb{R}^N}{\text{minimise}} \quad \|\boldsymbol{H}X - Y\|^2 + \mu \Psi(X) \tag{1}$$

• Proposition: Hybrid regularisation

$$\Psi(X) = \lambda \operatorname{ent}(X, a) + (1 - \lambda)\ell_1(X) \tag{2}$$

$$\operatorname{ent}(X, a) = \begin{cases} \sum_{n=1}^{N} \frac{x_n}{a} \log\left(\frac{x_n}{a}\right) & \text{if } x_n > 0\\ 0 & \text{if } x_n = 0\\ +\infty & \text{elsewhere.} \end{cases}$$

$$\ell_1(X) = \sum_{n=1}^{N} |x_n|$$

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### Proximal solution

$$\operatorname{prox}_{\Psi}(X) = (p(x_n))_{1 \le n \le N} \tag{}$$

with

$$p(x_n) = \begin{cases} \frac{\lambda}{a} W \left[ \frac{a}{\lambda} \exp(\frac{ax_n - a(1-\lambda)}{\lambda} + \log(a) - 1) \right] & \text{if } \lambda \in ]0, 1] \\ \operatorname{sign}(x_n) \max(|x_n| - (1-\lambda), 0) & \text{if } \lambda = 0 \end{cases}$$
(4)

W states for the Lambert function, defined as the inverse function of  $f: z \to ze^z$ for all  $z \in \mathbb{C}$  i.e :

$$z = we^w \iff w = W(z).$$

### PALMA algorithm

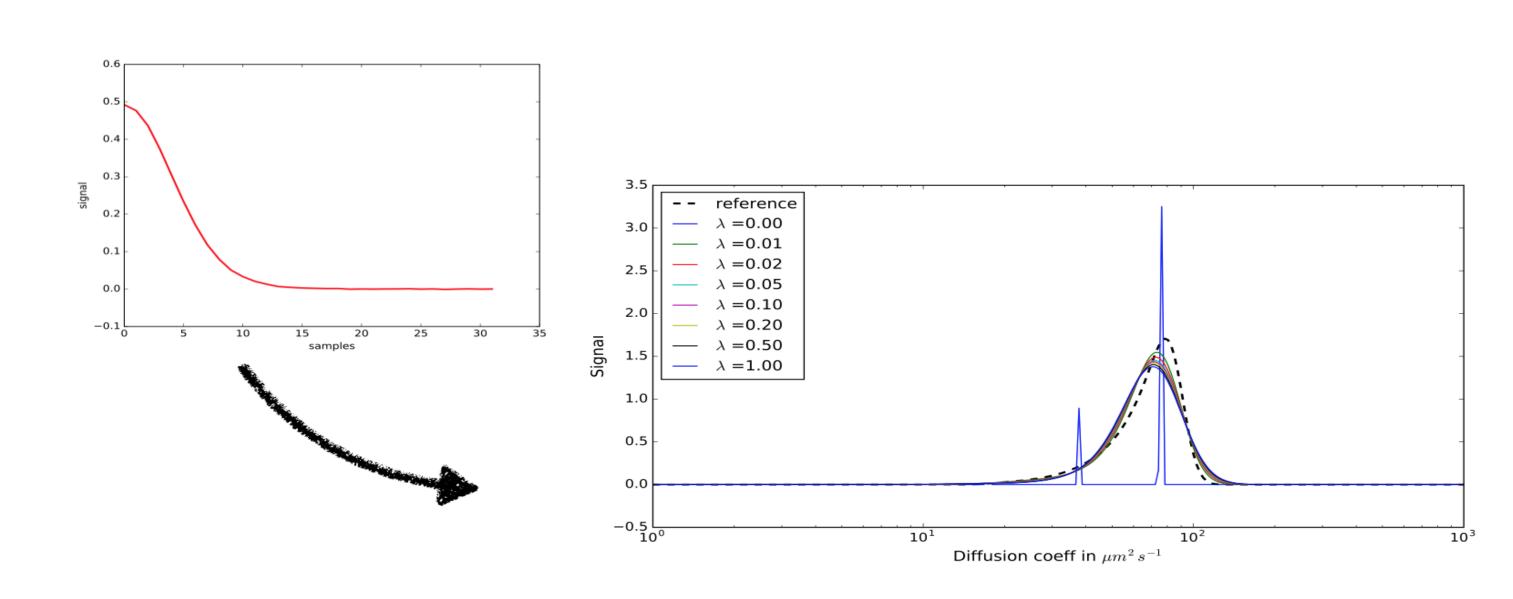
Proximal Algorithm for L1 combined with MAxent prior, available on the web site http://palma.labo.igbmc.fr, allows the analyse of your DOSY experiment in simple, efficient and easy way!

### Simulated tests

#### Polydisperse species

PALMA reconstruction for various values of  $\lambda$  of the simulated asymmetric distribution built from 15 log-normal components, ranging from 18 to  $85\mu m^2/s$ , with intensities ranging from 0.1 to 10. The intensities are chosen as  $10/(1.4^{i-1})$ , i = 1, ..., 15.

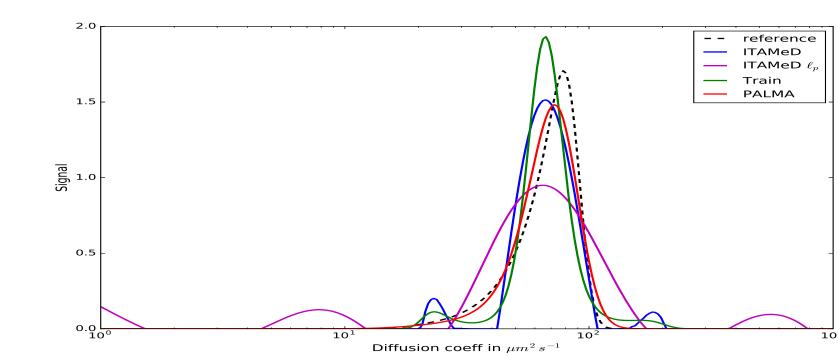
M = 64, N = 256, with noise level 0.1%.



#### $\rightsquigarrow$ Best choice of $\lambda = 0.01$

#### • Comparaison with other algorithms

Comparison between our approach and other alogrithms proposed to solve the ill-posed problem in DOSY NMR by recovering the signal defined in the above.

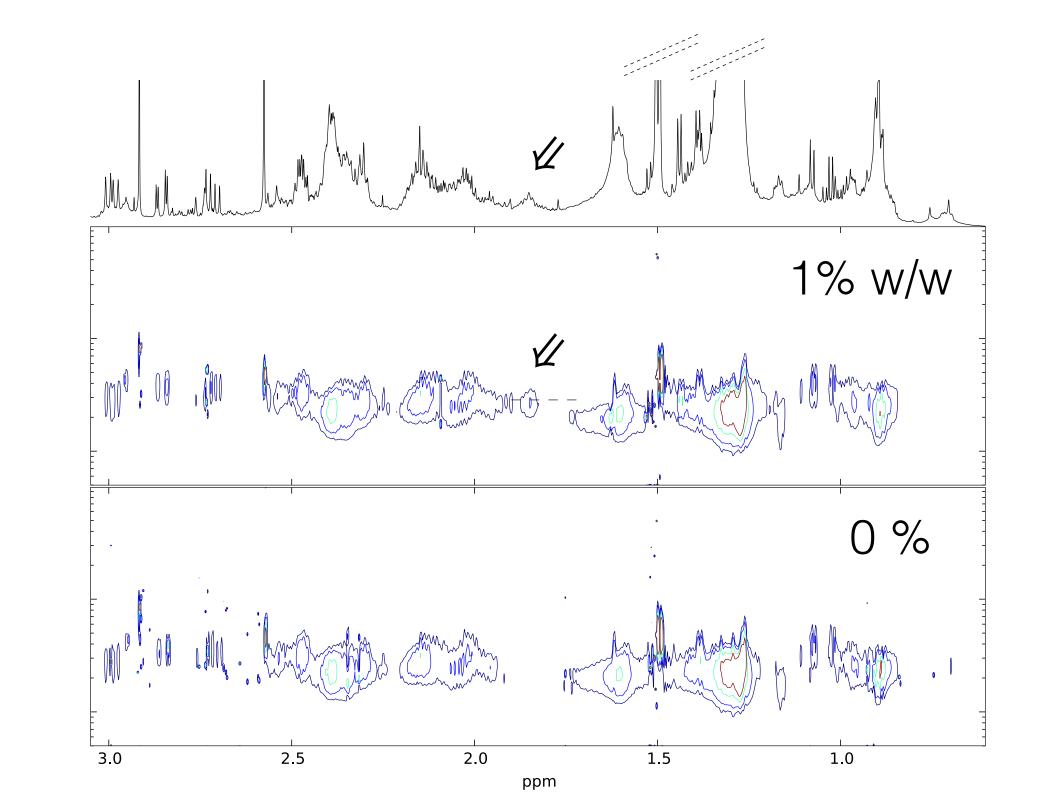


_	Algorithm	Qlty reconstruction $ \left(-10 \log_{10} \left(\frac{\ x_{rec} - x_{orig}\ }{\ x_{orig}\ }\right)\right) $ <i>Higher is better</i>
	ITAMeD	08.89
	ITAMeD with $\ell_p$	06.18
O <sup>3</sup>	TRAIn	06.60
	PALMA with $\lambda = 0.01$	14.60

→ Best reconstruction with PALMA algorithm

## Application polydisperse polymers

DOSY detection in a plant extract



Comparison of two DOSY experiments on a brown algae extracts, one with 1% w/w  $0.16 \, mg \, mL^{-1}$  Chloroquine added to the sample. The aliphatic region is shown, with the CH<sub>2</sub> signal of the Chloroquine higlighted with an arrow. The dashed horizontal label is at  $285\mu m^2/s$ .

#### Conclusion

• PALMA algorithm is a good tool to recovert the DOSY NMR signal. It can be run in a fully automatic manner, where users may submit their datasets for automatic processing on the web site http.palma.labo.igbmc.fr

### Perspectives

- Test with complex data in spectrometry field.
- Hybrid regularization in blind signal restoration problems