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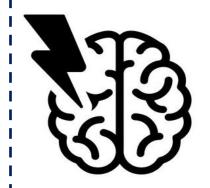
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SOS-MUSIC, a subspace approach for EEG source imaging promoting **S**parsity On active Sources



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INTRODUCTION

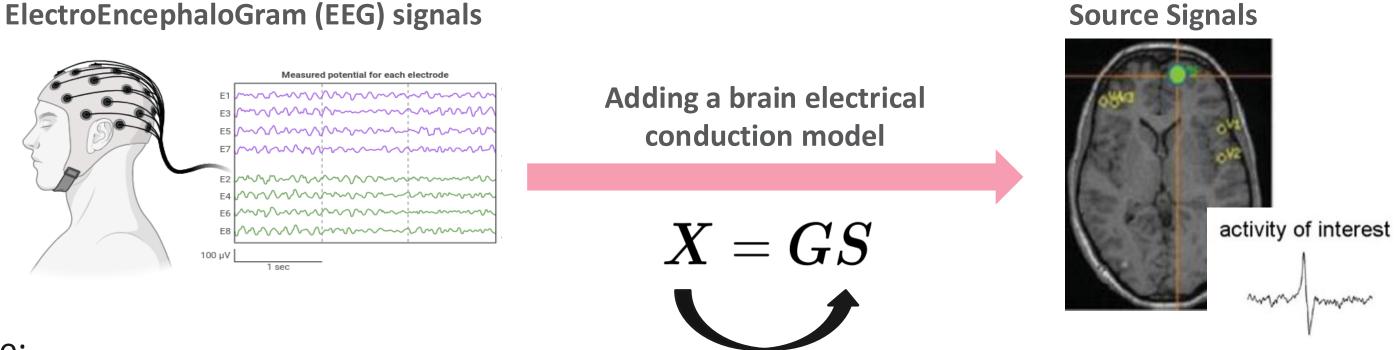
Context

• Localizing brain epileptic sources for patients with treatment-resistant epilepsy (30% of cases).

Solving the EEG inverse problem

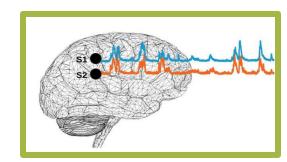
ElectroEncephaloGram (EEG) signals





with

METHODS



OBJECTIVE

Improve the localization of highly correlated brain sources

ASSUMPTION: SPARSITY OF THE EPILEPTIC SOURCES

There are few sources involved in the epileptic network

- A sparse vector v whose non-zero components select and weight the column vectors of G corresponding to the epileptic dipoles.

Where:

- X : the EEG data matrix of size ($N \times T$) • S : the signal matrix of size (Dx T) • G: the lead field matrix of size (N x D)
- *N* : The number of EEG electrodes
- *D* : The number of source dipoles
 - *T* : The number of time samples

MUSIC (MUltiple Signal Classification)[1]: a subspace approach

• Decomposition of the observed signal into signal and noise orthogonal subspaces.

• 2-MUSIC metric:
$$\Upsilon(\boldsymbol{g}(\theta)) = \frac{\boldsymbol{g}(\theta)^T \boldsymbol{E}_{\nu} \boldsymbol{E}_{\nu}^T \boldsymbol{g}(\theta)}{\boldsymbol{g}(\theta)^T \boldsymbol{g}(\theta)} \qquad \text{Where:} \\ \bullet \boldsymbol{g}(\theta) \text{ is the column of } \boldsymbol{G} \text{ of the } \boldsymbol{\theta} \\ \text{source;} \\ \bullet \boldsymbol{E}_{\nu} \text{ it the poise subspace}. \end{cases}$$

• $\boldsymbol{\nu}_{\nu}$: the holse subspace;

• The heta minimizers of \mathbf{Y} give the epileptic sources.

RESULTS

Scenario 1.a

3500 г

Our regularization problem

$$\min_{oldsymbol{v}\in\mathbb{R}^P}\Upsilon(oldsymbol{G}oldsymbol{v})+\lambda||oldsymbol{v}||_1$$

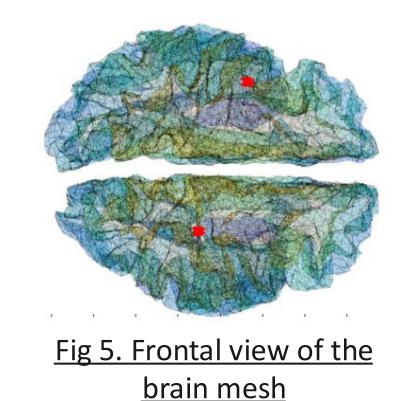
- Minimization of \mathbf{Y} for searching the epileptic sources.
- **L1 norm** enforcing **sparsity** of the epileptic sources.
- Optimization solver : Iterative Soft Thresholding Algorithm [2].

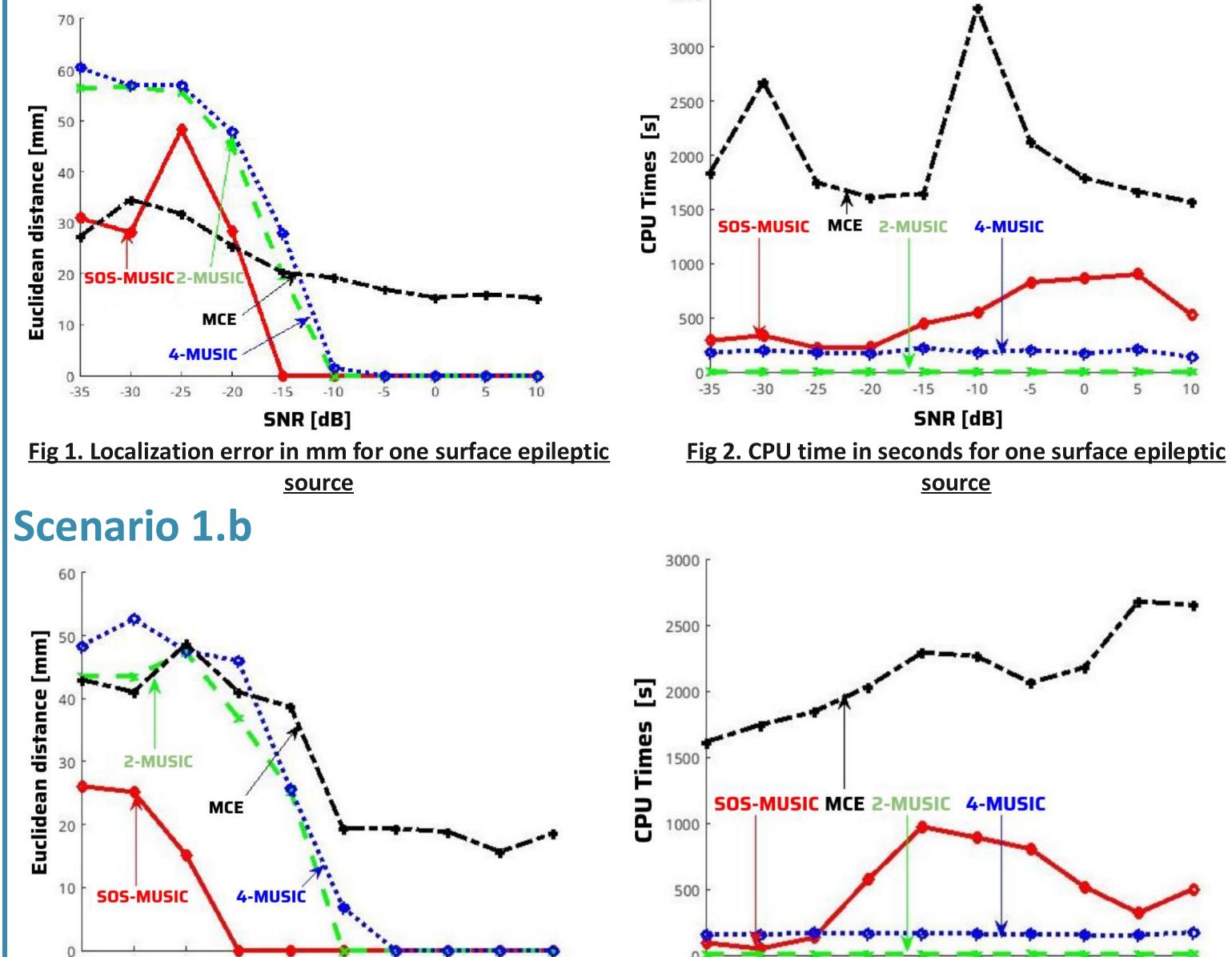
SIMULATION SETUP

Data

- 257 channels EEG data generated from a realistic model [3]. • A three-shell realistic head model.
- A source space of 8000 dipoles corresponding to the triangles of the cortical surface mesh with orientations perpendicular to the cortical surface.

Performance criteria





• Euclidean distance between the estimate source position (θ_i) and the true

position (θ_i) :

Scenarios

$$d_{\theta_i}^{\text{Euc}} = ||\hat{\theta_i} - \theta_i||_2$$

Influence of the Signal-to-Noise-Ratio (SNR) and deepness on source localization of one epileptic source: 1a. a surface source and in the case of 1b. a deep source.

2 Influence of the signal correlation on source localization of two synchronous epileptic sources with an SNR value of -5 dB.

CONCLUSION

- An extension of the 2-MUSIC approach by regularizing the classical **2-MUSIC metric** and proposing an **automatic** minimization scheme.
- **Promising results** for dealing with **synchronous** brain current sources and **low SNR** ratios as demonstrated through realistic computer simulations.

Discussion



SNR [dB]

Fig 3. Localization error in mm for one deep epileptic

source

Scenario 2

Methods	Euclidean distance [mm]	CPU Times [s]
2-MUSIC	80.68	1.8
4-MUSIC	71.2	231.7
MCE	72.7	2540
SOS-MUSIC	0	710.7

TABLE 1. Localization error and CPU time in the presence of two synchronous epileptic sources

References

• [1] R.O. Schmidt, "Multiple emitter location and signal parameter estimation," IEEE transactions On Antennas Propagation, vol. 34, no. 3, pp. 276-280, March 1986

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SNR [dB]

Fig 4. CPU time in seconds for one deep epileptic

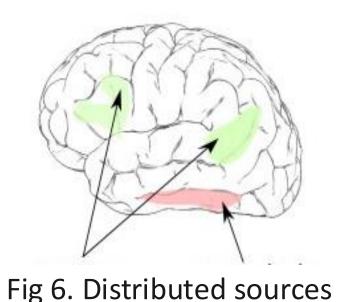
<u>source</u>

- [2] I. Debauchies, M. Defrise, and C.D. Mol, "An iterative soft thresholding algorithm for linear inverse problem with a sparsity constraint ", Comm. Pure Appl. *Math.*, vol. 57, pp. 1413-1457, November 2004
- [3] D. Cosandier-Rimelé, I. Merlet, J. Badier, P. Chauvel and F. Wendling, "The neuronal source of eeg: Modeling of simultaneous scalp and intracerebral recordings in epilepsy". *NeuroImage*. vol.42, no.1, pp.135-146, 2008

A higher SOS-MUSIC CPU times but a more accurate localization.

Future works

• Validating on real clinical EEG data and on **distributed** sources.



An extension of the SOS-MUSIC method to fourth-order data statistics.

