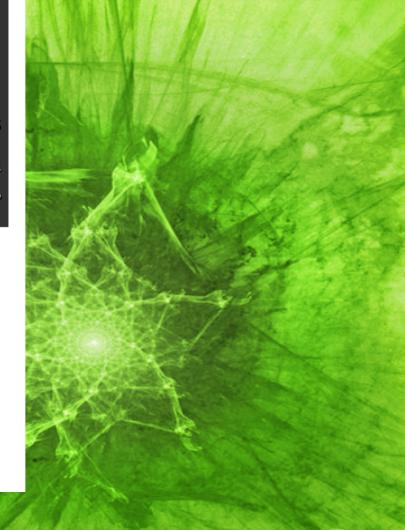
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# Singularity analysis of Potential Maps

FisEs 2012 - Palma



#### Approach: Heart Dynamics as a Complex System

#### Singularity analysis:

Preserves physical principles of the signal

Takes advantage of known symmetries

Model-agnostic signal processing

## Singularity exponent of a signal

Singularity exponent  $h(\mathbf{x})$  degree of singularity / regularity of signal s around point  $\mathbf{x}$ 

$$\mu_{S} [\Psi_{r}(\mathbf{x})] \sim r^{\dim(\mathbf{x}) + h(\mathbf{x})} \qquad d\mu_{S} \sim ||\nabla s|| d\mathbf{x}$$

 $\mu$  is a measure defined from gradient modulus and  $\Psi_r = \Psi (\mathbf{x} / r)$  is a wavelet kernel

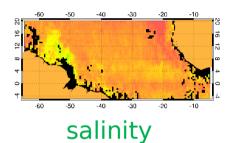


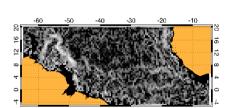
# Ocean Circulation

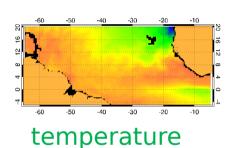
#### Pont et al. JGR 2012

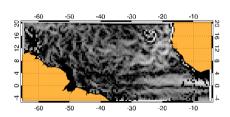
Singularity and local predictability:

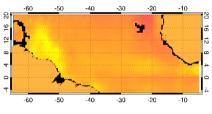
$$\mu_{s}[\Psi(\mathbf{x})] = A(\mathbf{x}) ||\Psi||^{h(\mathbf{x})} + o(||\Psi||^{h(\mathbf{x})}) d\mu_{s} = |\nabla s| d\mathbf{x}$$



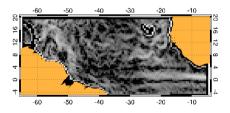








salinity fused



Derived fields, fusion:

$$d\mu_s = S(\mathbf{x}) d\mu_r$$

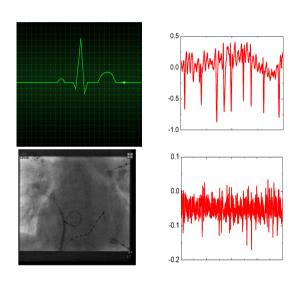
## Singularity exponents – validation

Validated for:

**ECGs** 

Endocardial catheter (potential time series)

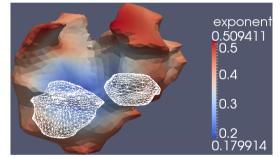
Electrocardiographic potential maps

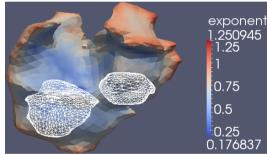


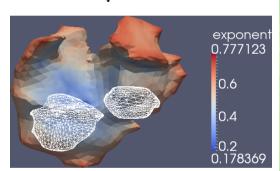
$$\mu_{\mathcal{S}}\left[\,\Psi_{r}(\mathbf{x})\,\right] \,\sim\, r\,\mathrm{dim}(\mathbf{x}) + h(\mathbf{x})$$

## Singularity exponent epicardial maps

space time space-time







versatility in the domain considered

$$\mu_{s}[\Psi_{r}(x)] \sim r \dim(x) + h(x)$$

#### Signal well reconstructed from most singular manifold

$$\hat{S}(\mathbf{f}) = (\mathbf{i} \mathbf{f} / \mathbf{f}^2) \cdot \mathbf{F} (\nabla s \delta_{\text{most sing.}})$$

6000

4000

-2000

-4000

-8000

-10000

1000

2000

3000

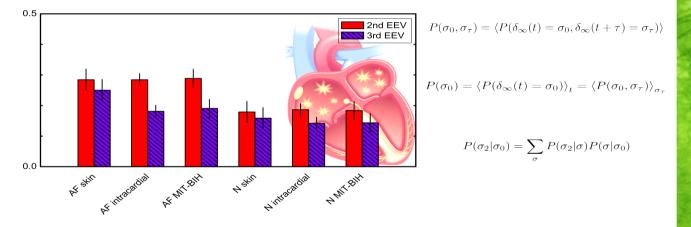
4000

5000

signal s, frequency  $\mathbf{f}$ , most singular manifold  $\delta_{ ext{most sing.}}$ 

#### Signal well reconstructed from most singular manifold

Fast dynamics: MSM orientation, 3-states no memory (Markov)

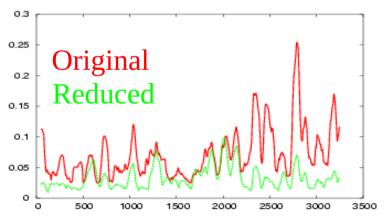


eigenvalues of transition matrix discriminate AF in both ECG and endocardial (Pont et al. CinC 2011)

#### Signal well reconstructed from most singular manifold

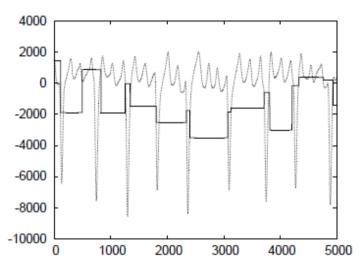
Fast dynamics: MSM orientation, 3-states no memory (Markov)

Slow dynamics: modulation over the reduced MSM-orientation reconstruction

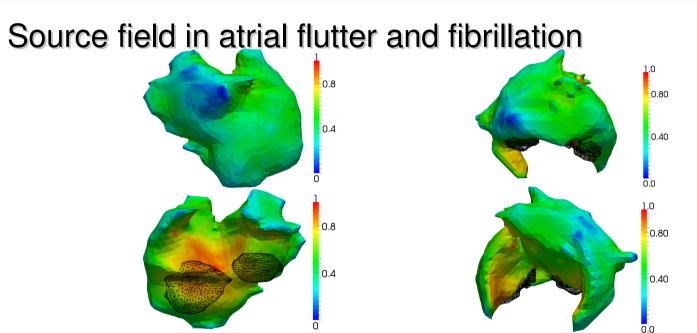


#### Source field, slow dynamics

$$SF(\mathbf{x}) = d\mu_S / d\mu_r$$

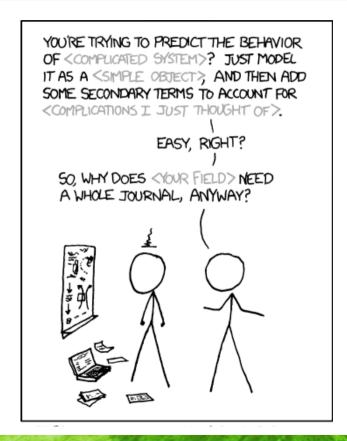


Radon-Nikodym dervative between original signal and reduced signal diff measures



robust numerical estimate – physical non-heuristic, sharp descriptor

#### Introduction Complexity Analysis method Heartbeat Conclusion



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# Thanks for your attention!