

Significance in Scale Space

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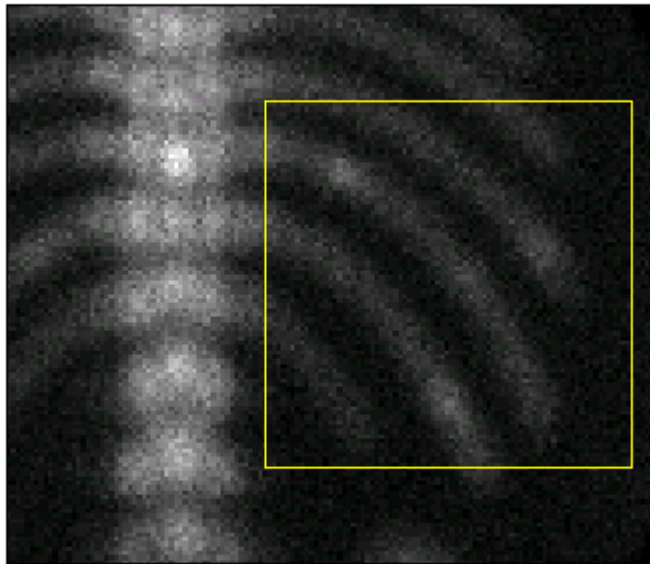
J. S. Marron

University of North Carolina

Probal Chaudhuri

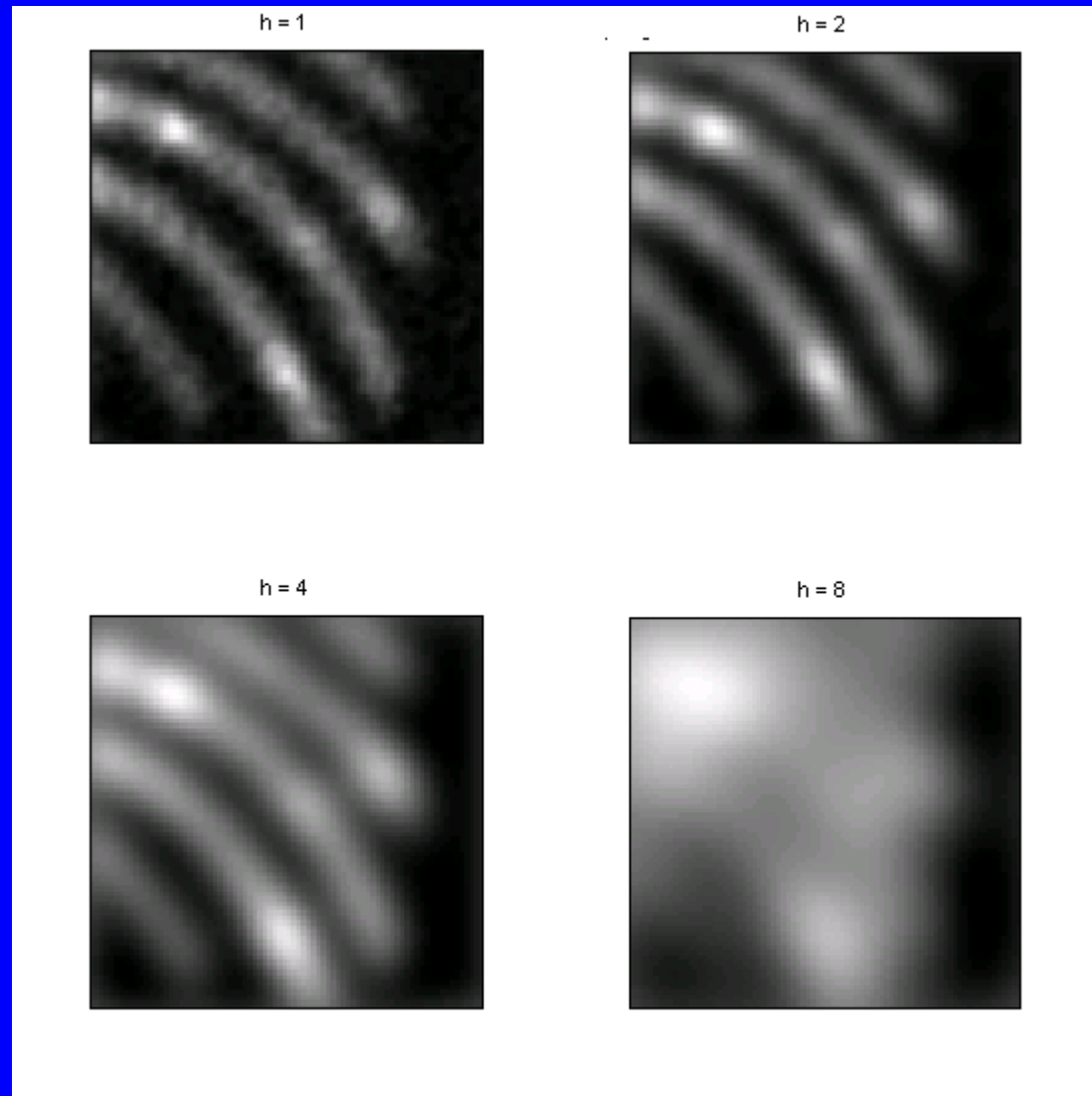
Indian Statistical Institute

Gamma Camera Phantom Image



Subimage for later analysis

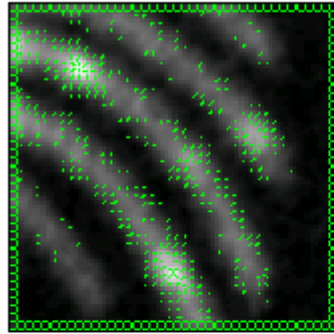
Gaussian Window Smooths



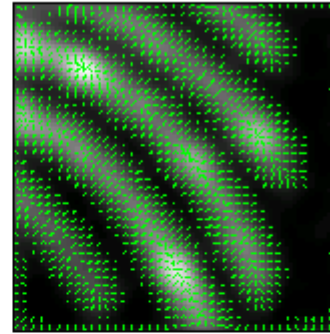
$$\hat{S}_h = K_h * Y$$

Gradient Based S^3

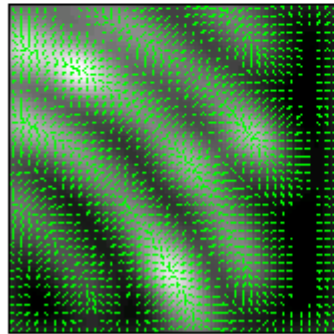
h = 1



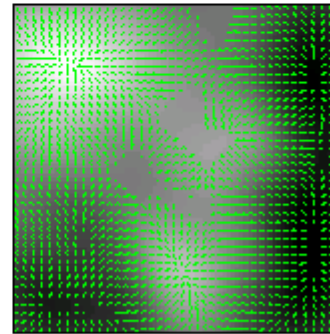
h = 2



h = 4

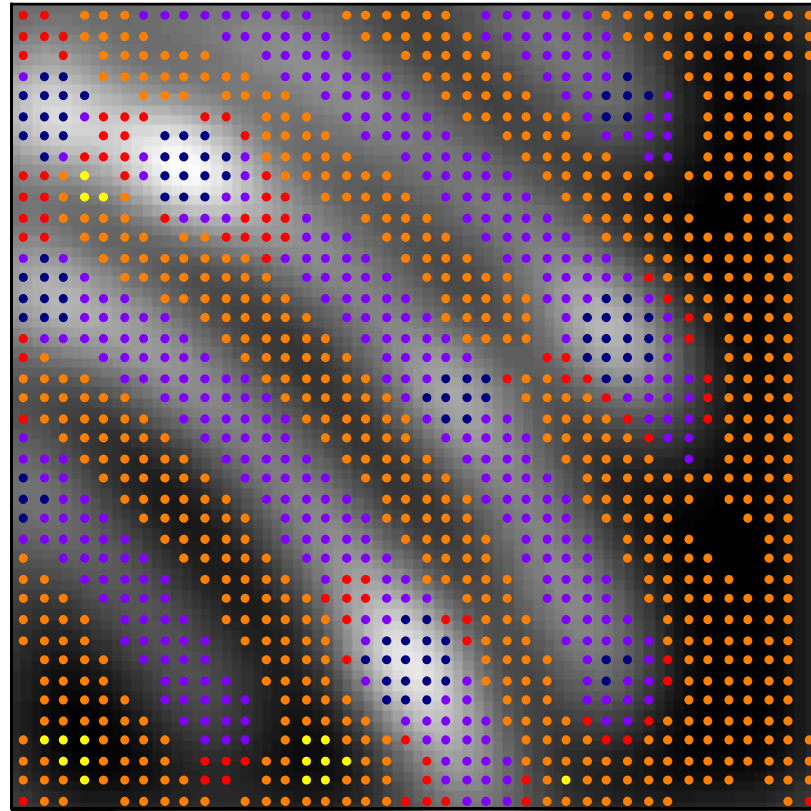


h = 8

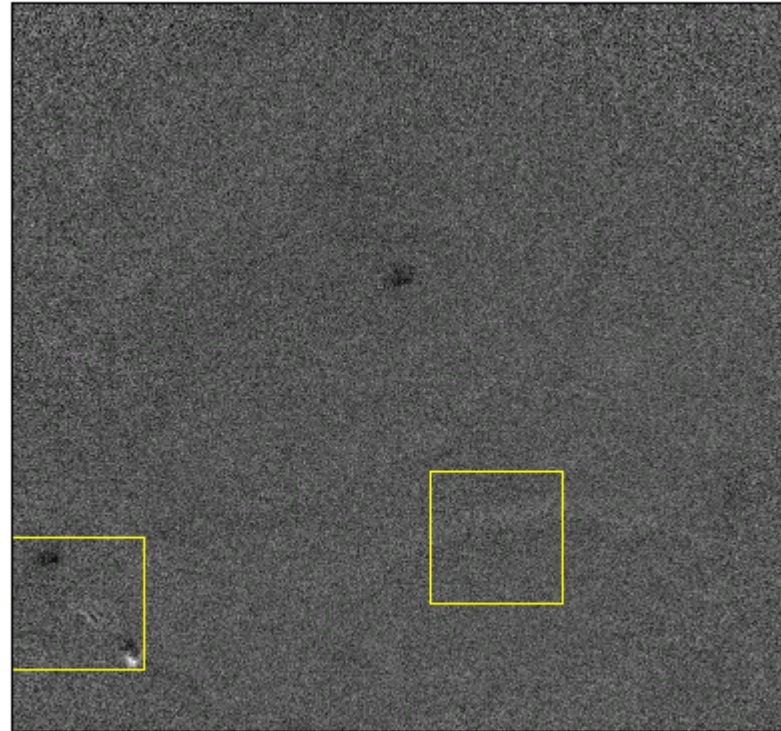


Curvature Based S^3

$h = 4$



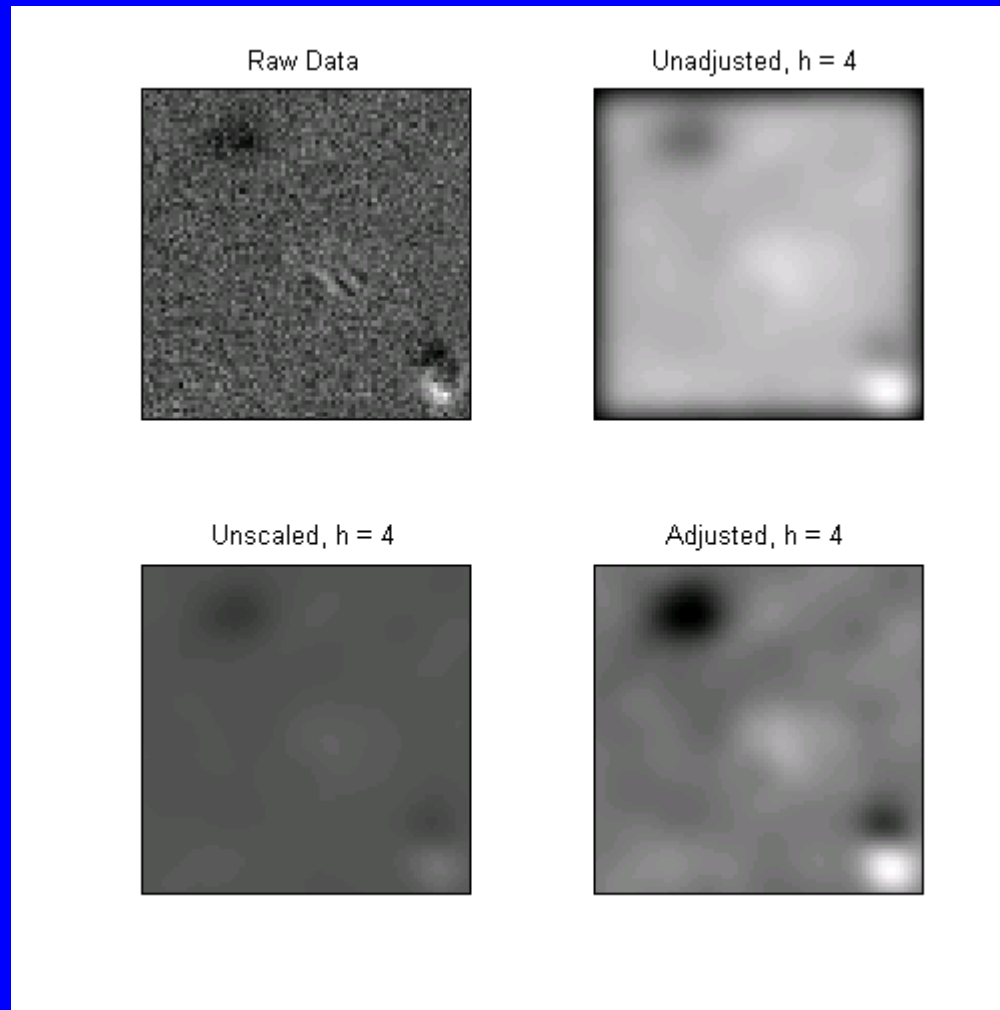
Electrical Activity Image



Subimages for later analysis

Boundary Effect Handling

Electrical Activity Data



$$\hat{\underline{S}}_h = A(\underline{Y}) + \underline{K}_h * [\underline{Y} - A(\underline{Y})]$$

Simultaneous Inference, I

- Via Effective Sample Size:

$$\underline{ESS} = (\underline{K}_h * \underline{1}) / K_h(0,0)$$

(number of points in kernel window)

- Number of Independent Averages:

$$l = \frac{n \cdot m}{\text{Avg}(\underline{ESS})}$$

Simultaneous Inference, II

- Significance Level Adjustment:

$$\begin{aligned}\alpha &= P\{k\text{-th C.I. not covering}, k = 1, \dots, l\} \\ &= 1 - P\{\text{C.I. covers}\}^l = 1 - (1 - \alpha')^l\end{aligned}$$

Variance Estimation

- Known Variance (MRI)
- Local Variance Estimate
- Pooled Variance Estimate

Significant Gradient

When gradient “significantly > 0 ”,

Draw **arrow** in gradient direction

When **arrows** too short, use 2 x 2 pixel blocks,

and scale by number significant

Distribution Theory: based on C.L.T. to

Chi-Squared distribution

Significant Curvature

When eigenvalues $\lambda_+ \geq \lambda_-$ of Hessian matrix are “significantly > 0 ”, draw dots as :

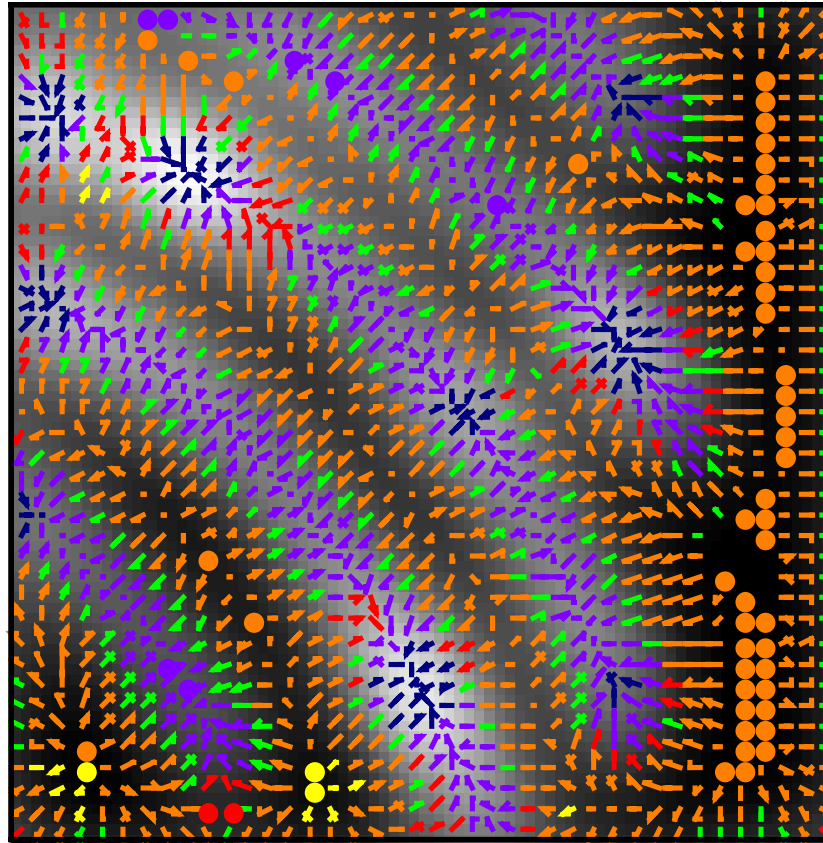
| | |
|--------------|-----------------------------------|
| hole | $\lambda_+, \lambda_- > q$ |
| long valley | $\lambda_+ > q, \lambda_- < q$ |
| saddle point | $\lambda_+ > q, \lambda_- < -q$ |
| long ridge | $ \lambda_+ < q, \lambda_- < -q$ |
| peak | $\lambda_+, \lambda_- < -q$ |

(where q is appropriate quantile)

Distribution Theory: based on C.L.T. and
simulation

Combining Gradient & Curvature

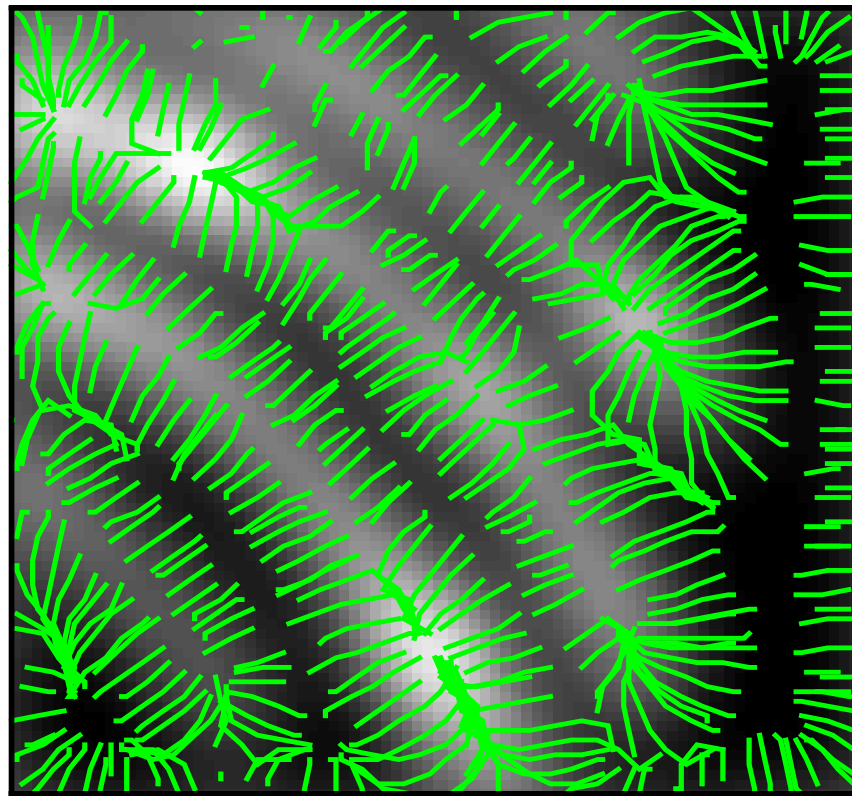
$h = 4$



Streamlines

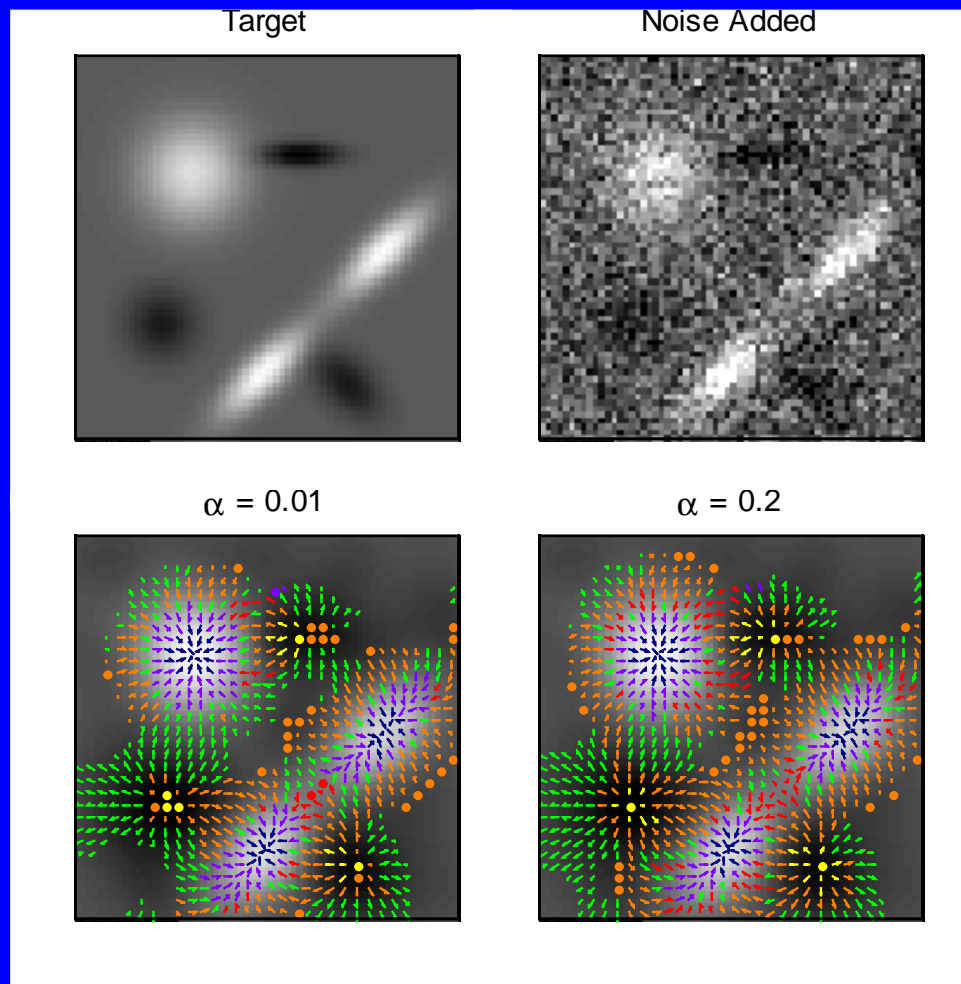
- show gradient directions, where significant

$h = 4$



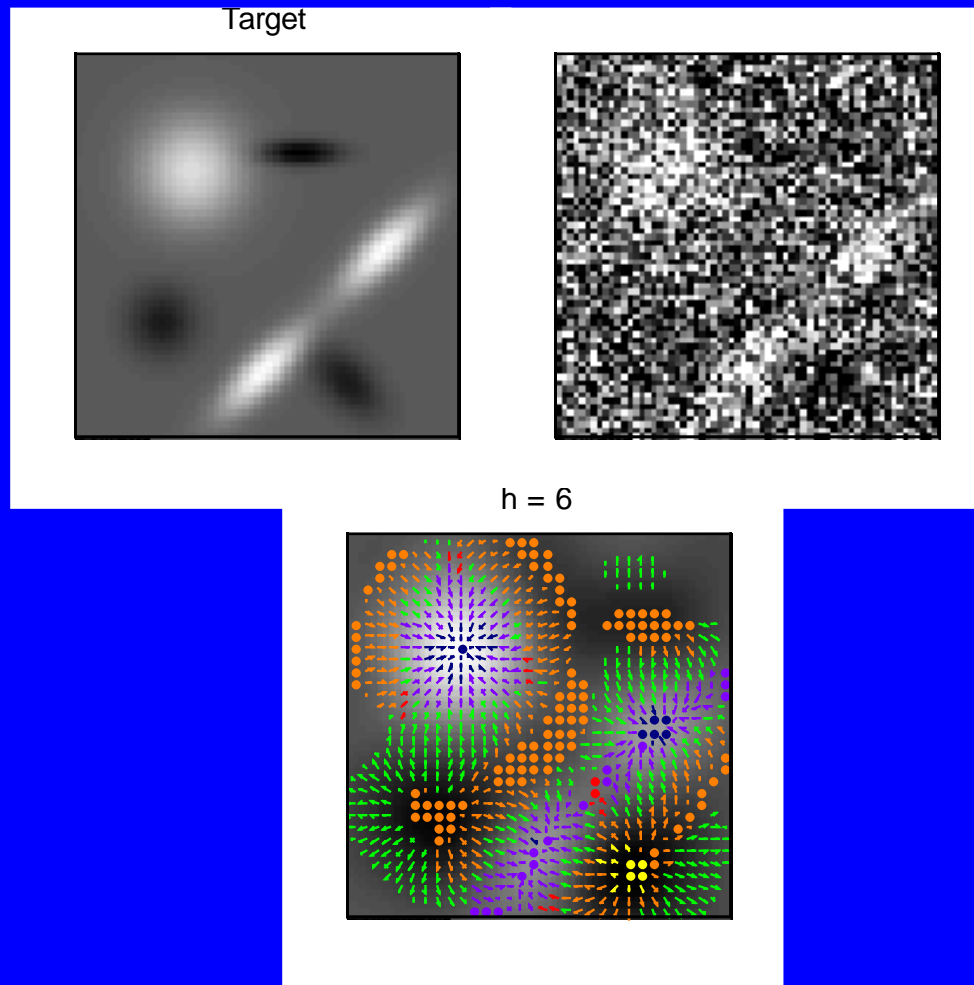
Simulations, I

- Effect of significance level α :



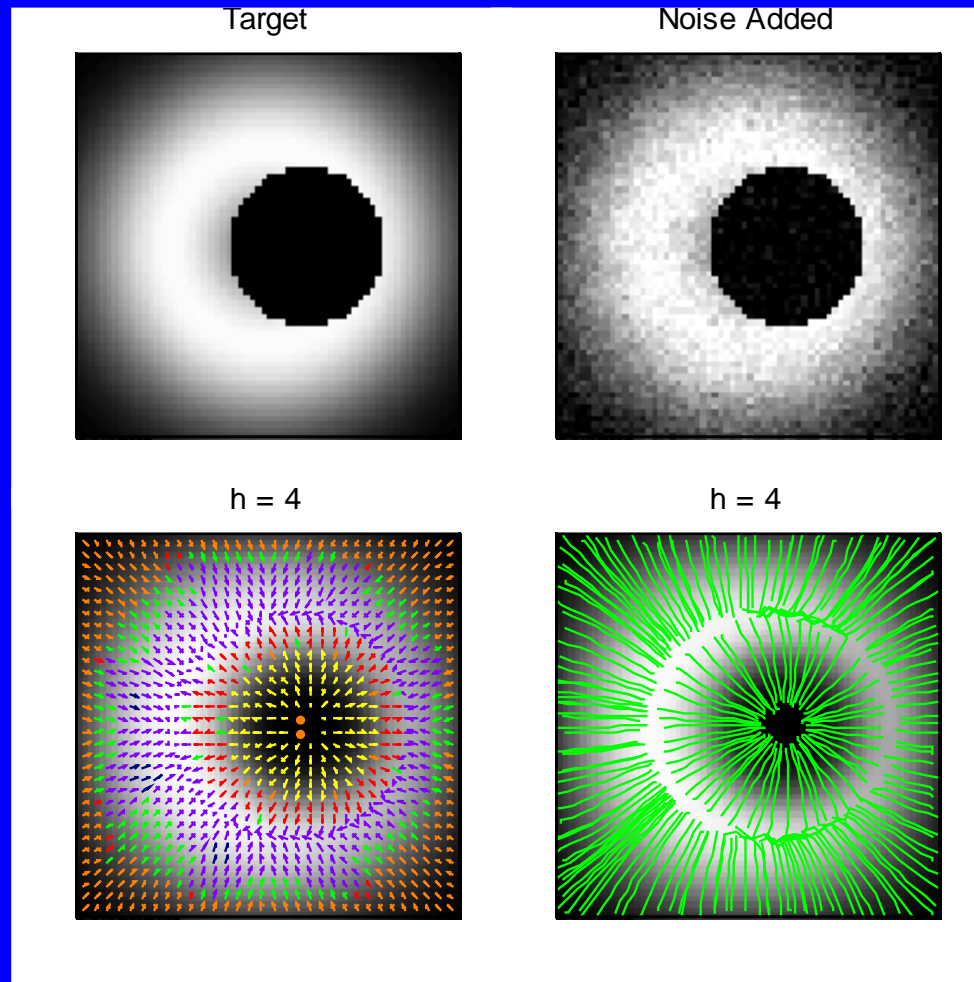
Simulations, II

- High Noise Performance:



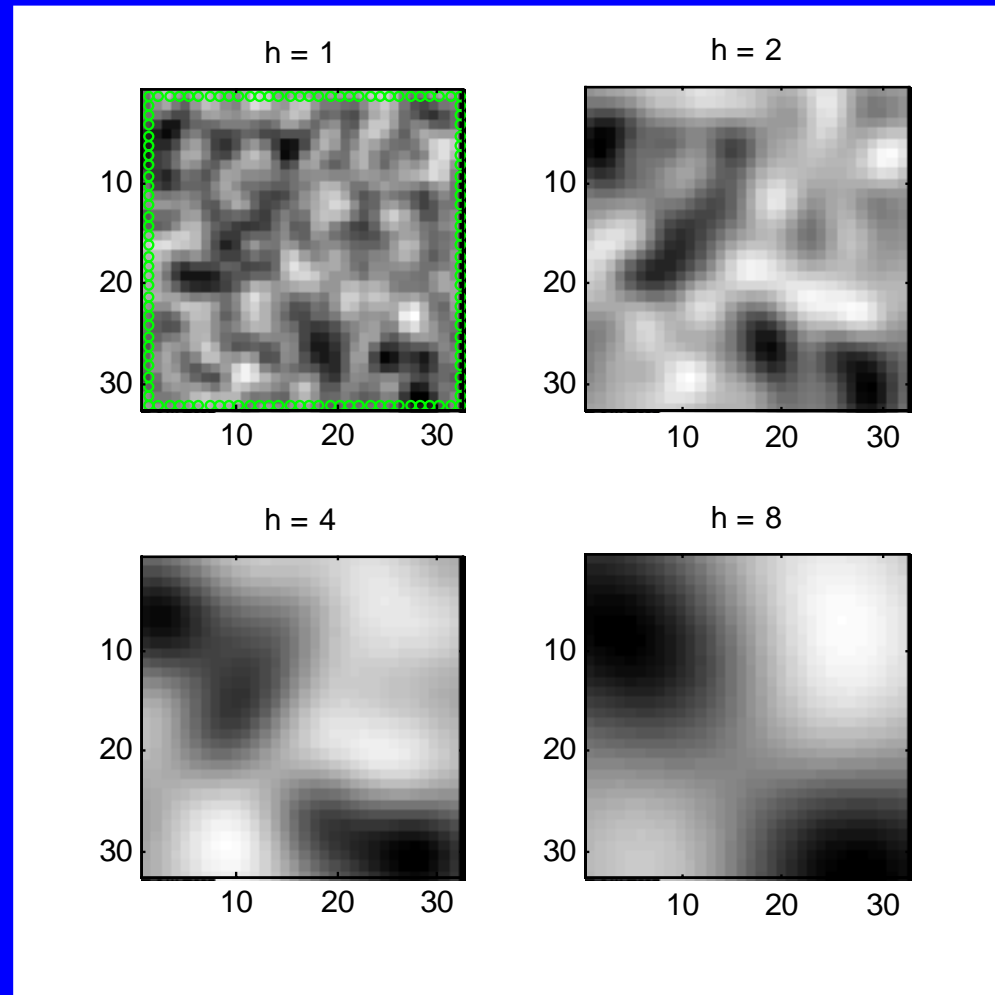
Simulations, III

- Comparison of Methods:

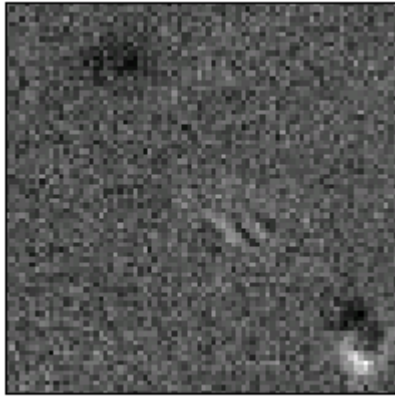


Simulations, IV

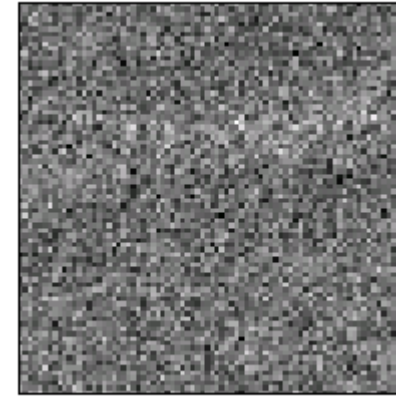
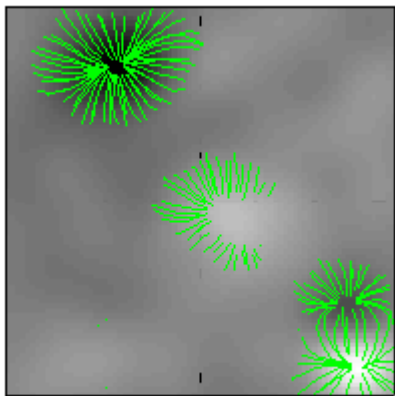
- No Signal:



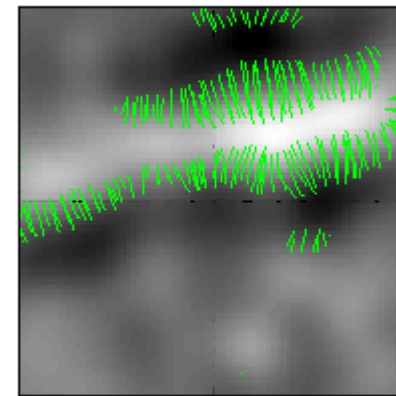
Real Data I, Brain Activity



$h = 5$

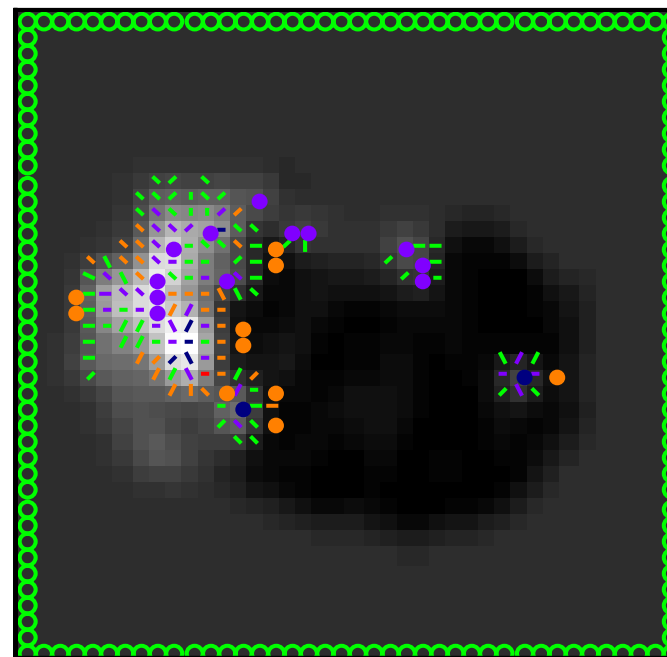
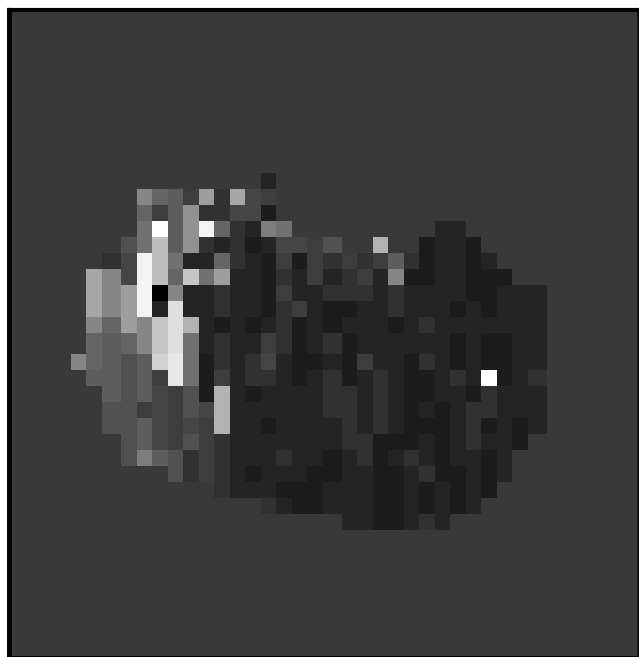


$h = 5$

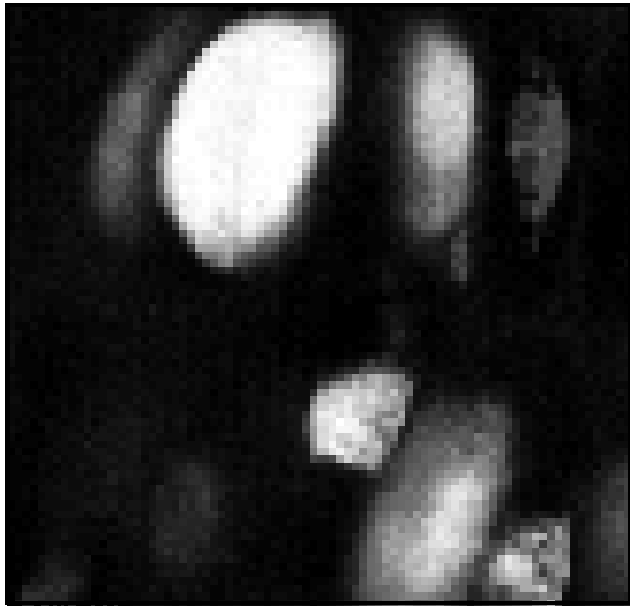


Real Data II, MRI Perfusion

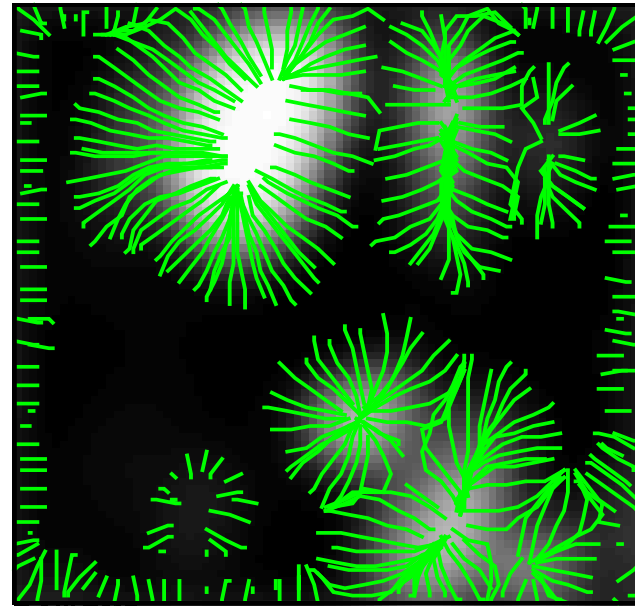
$h = 1$



Real Data III, Confocal



$h = 3$



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