

# Towards improving crosstalk suppression in multiparameter FWI by decorrelating parameter classes

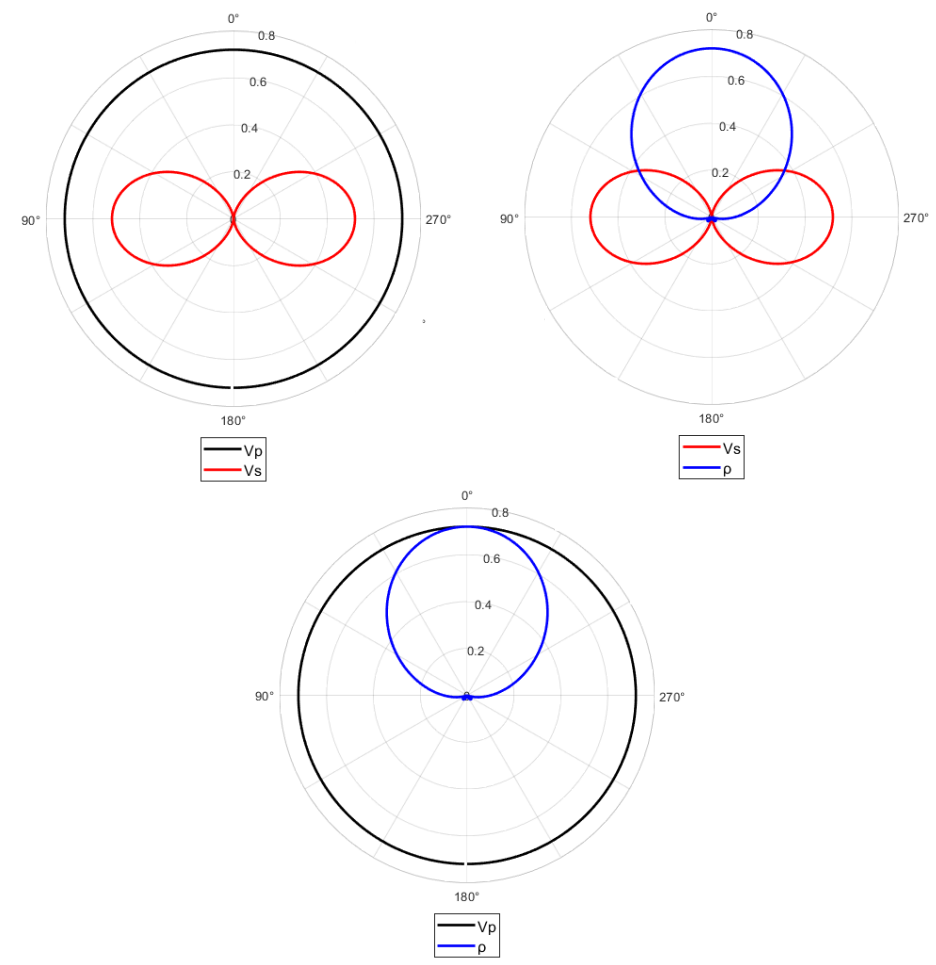
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# Introduction: multiparameter FWI and crosstalk

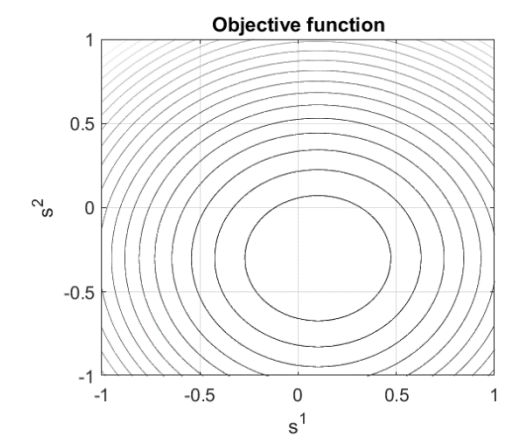
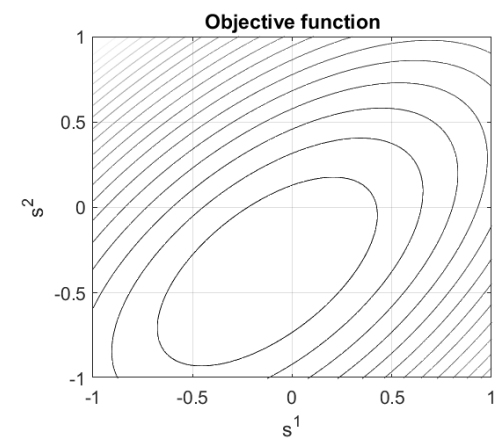
## Design adequate workflows



## Hessian

$$H = \begin{bmatrix} 1 & -0.6 \\ -0.6 & 1 \end{bmatrix}$$

$$H = \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix}$$



Crosstalk suppression through its manipulation



$$H = I = \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix}$$

**Objective:** crosstalk corrected  $V_p$ ,  $V_s$  and  $\rho$  using FWI in intermediate model space with no parameter leakage

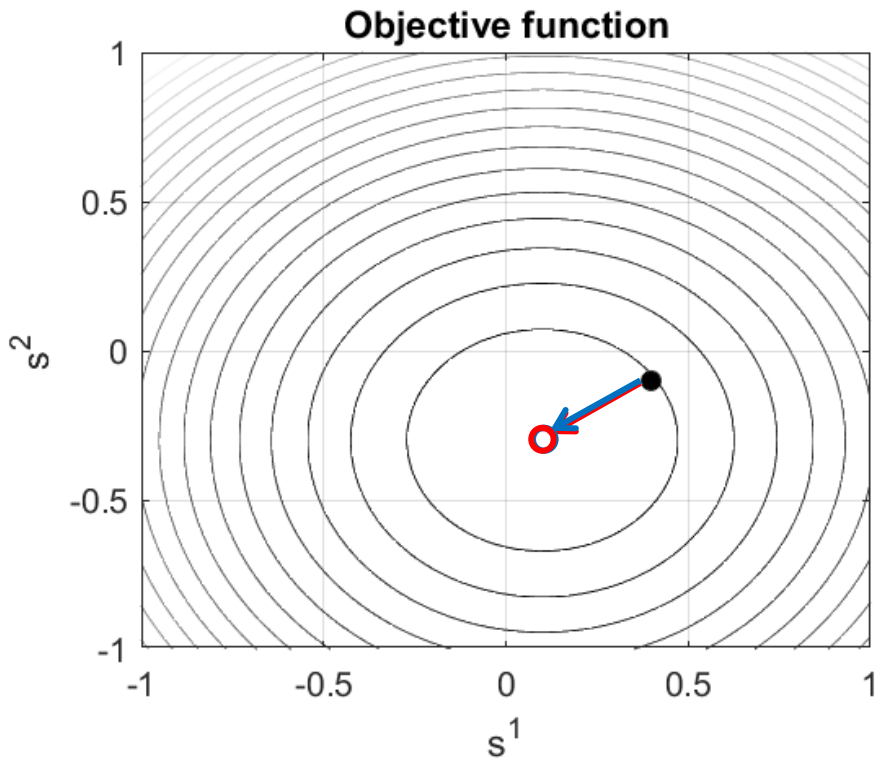
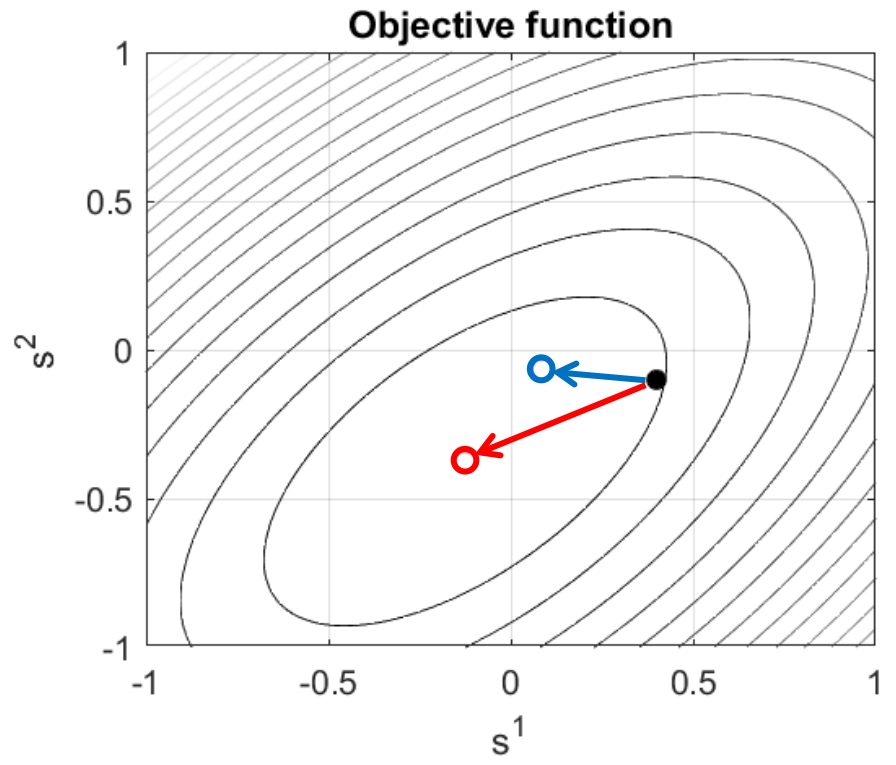


# Background: objective function iso-surfaces

Quadratic  $\Phi$  :  $\Phi = \mathbf{s}^T \mathbf{H} \mathbf{s} + \mathbf{s}^T \mathbf{p} + C$

$$\mathbf{H} = \begin{bmatrix} 1 & -0.6 \\ -0.6 & 1 \end{bmatrix}$$

$$\mathbf{H} = \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix}$$

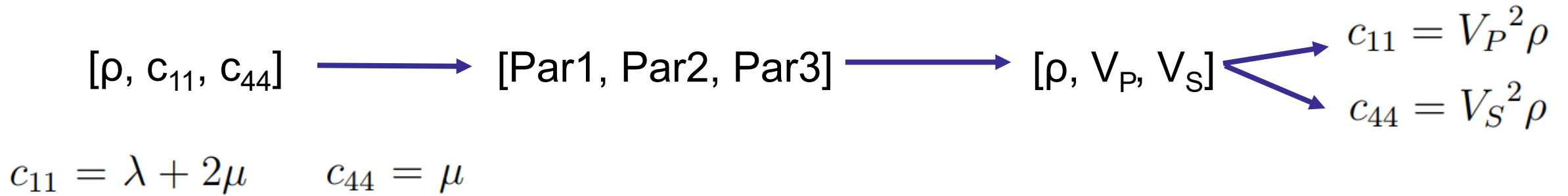


- Newton
- SD
- Initial point
- Minimum point

2-variable model of descent-based optimization



# Background: transformation between model spaces

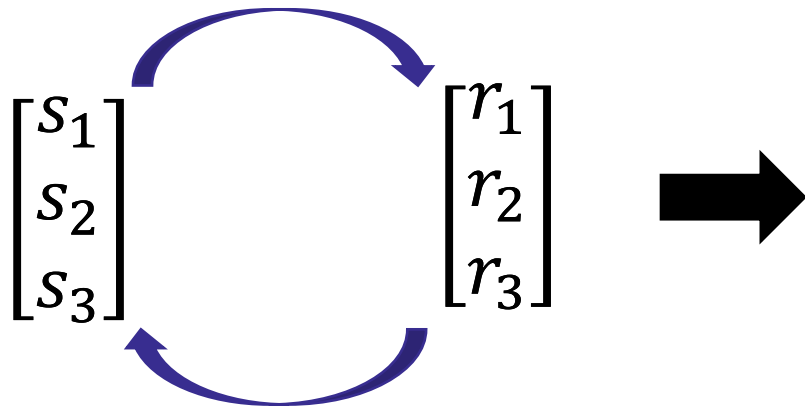


Innanen (2020 a, b, c, d)

Re-parameterize= transform between cartesian and oblique systems

$\Phi$ : scalar (invariant)

$\Delta$ s: contravariant components (change)



Transformation rules:

$$\mathbf{s} = \mathbf{T}\mathbf{r}$$
$$\mathbf{r} = \mathbf{T}^{-1}\mathbf{s}$$

**T**: transformation  
matrix  
↓  
can meet constraints

Finding minimizer of  $\Phi$  in  $\mathbf{r}$  implies the minimum point is also found in  $\mathbf{s}$



# Background: Hessian and crosstalk quantification

$$\mathbf{H}_{(i,j),(k,l)} = \left( \frac{\partial \mathbf{d}_p}{\partial \mathbf{s}_{i,j}} \right) \left( \frac{\partial \mathbf{d}_p}{\partial \mathbf{s}_{k,l}} \right)^*$$

$\mathbf{d}_p$ : predicted data  
 $j, l$ : parameter class  
 $i, k$ : position ( $1: n_z \times n_x$ )

*Full Hessian* →

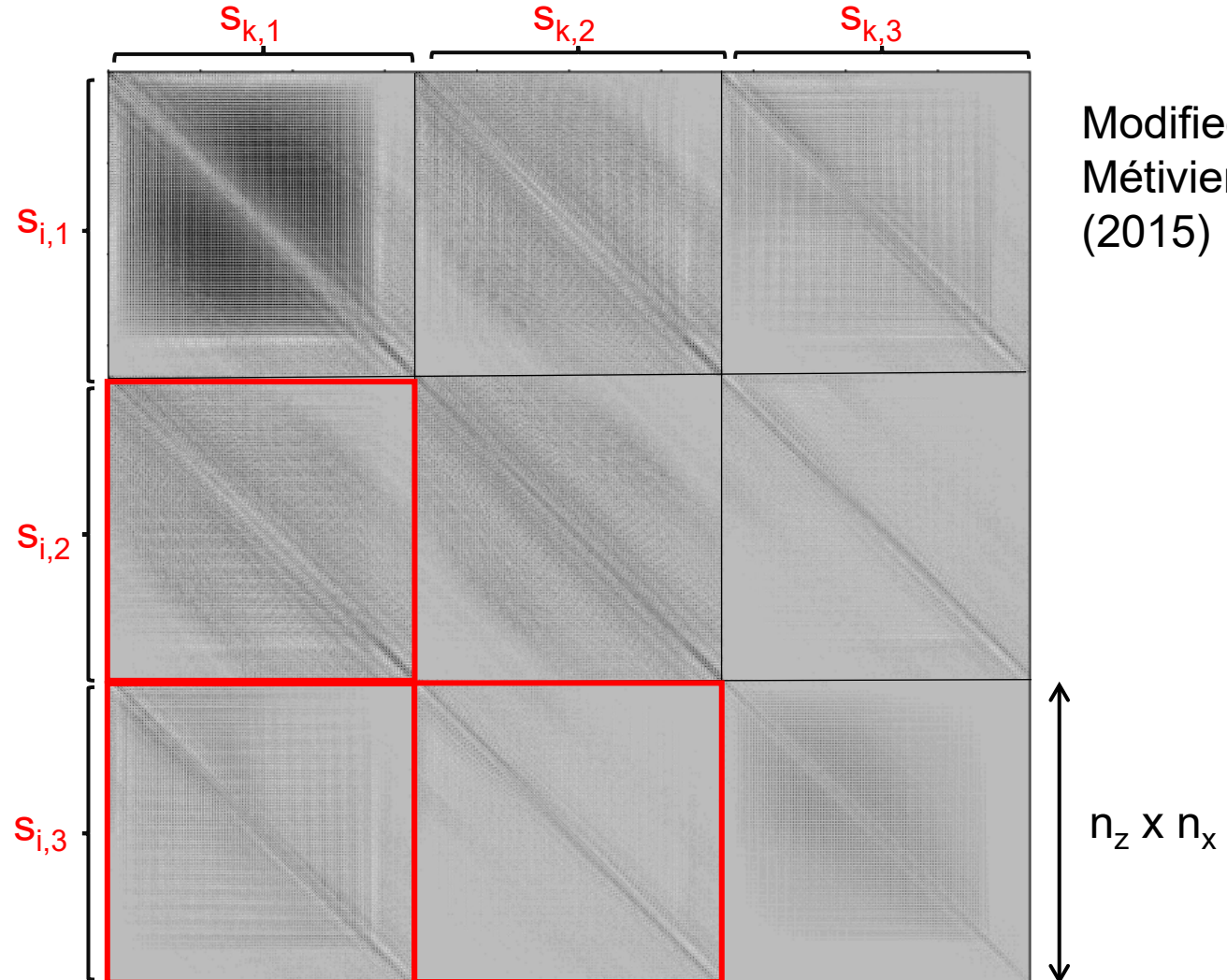
$j \neq l$



Existing trade-off



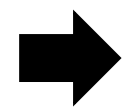
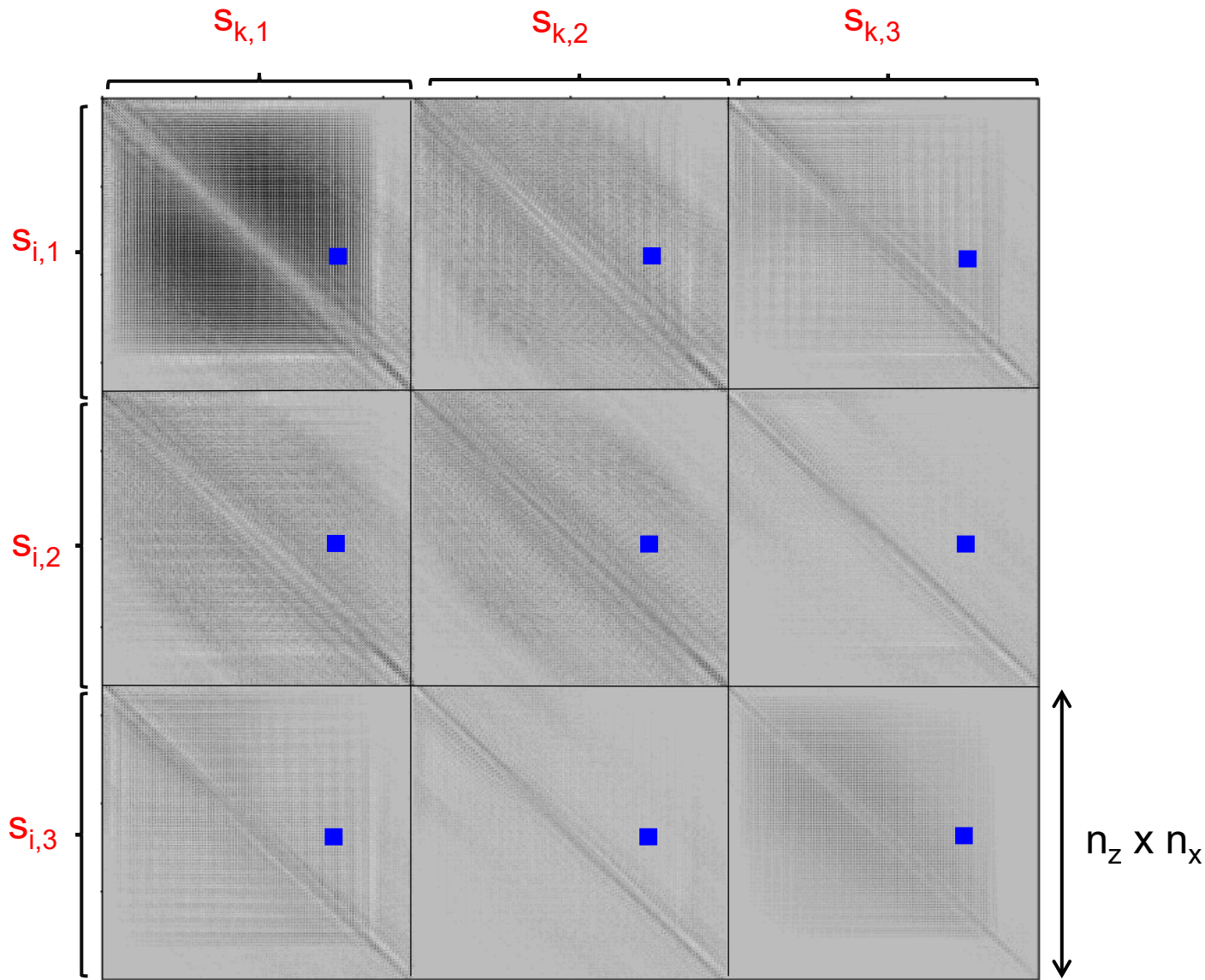
No crosstalk would exist if off-diagonal blocks were zero



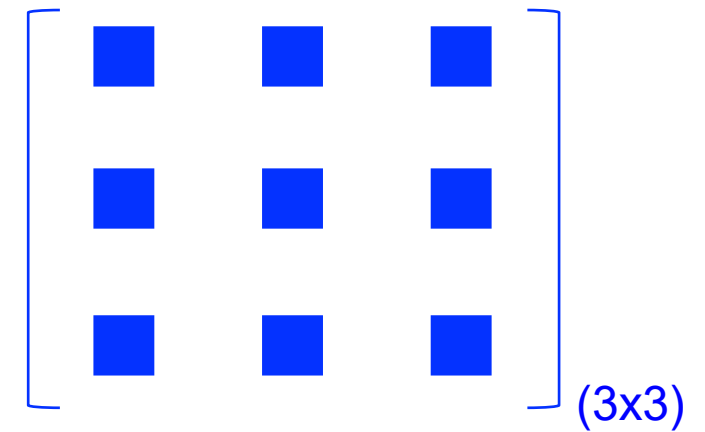




# Background: Hessian and crosstalk quantification



*Point-wise Hessian*

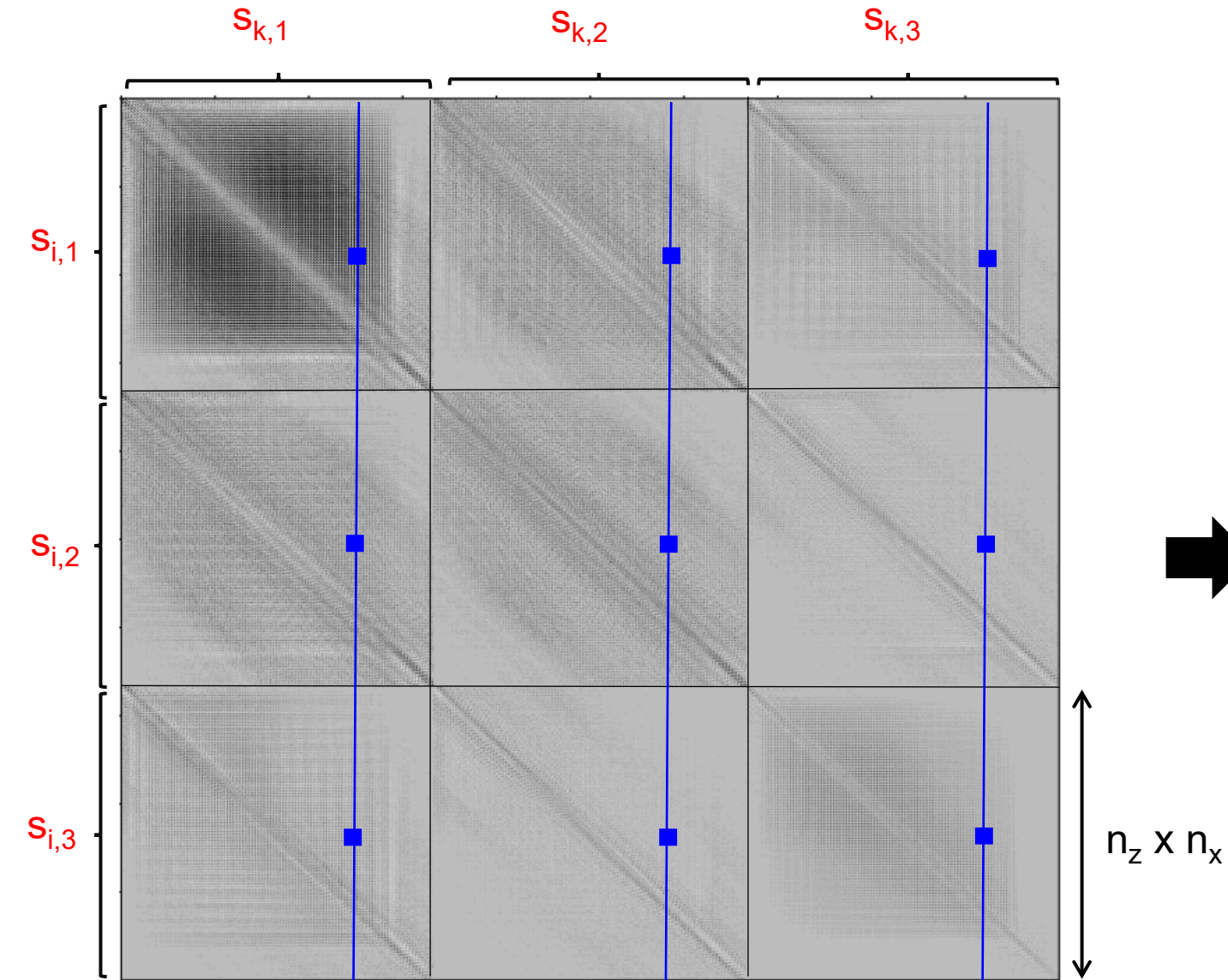


Crosstalk between  $s_1$ ,  $s_2$  and  $s_3$  at a fixed point

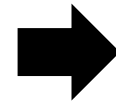
Modified from Métivier et al. (2015)



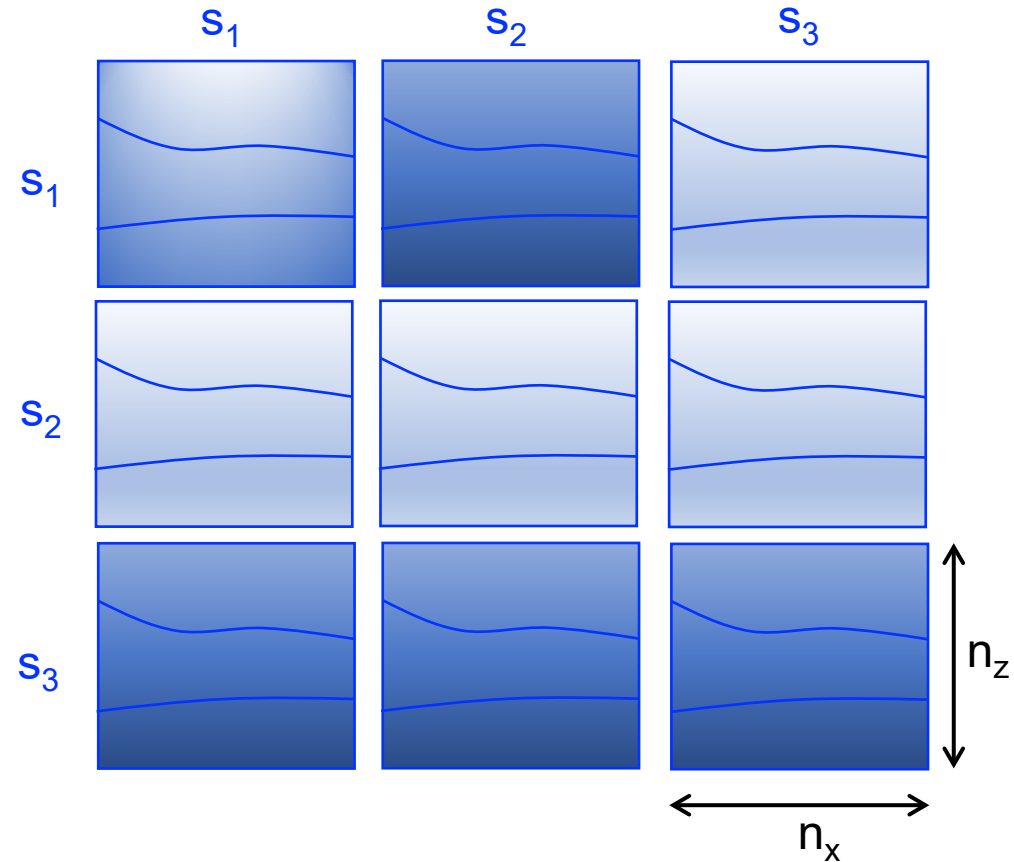
# Background: Hessian and crosstalk quantification



Modified from Métivier et al. (2015)



## *Point probes Hessian*



Crosstalk at one point with all the other unknowns.





Transformation rule for the Hessian:

$$\mathbf{T}\mathbf{H}(s)\mathbf{T}^{\top} = \mathbf{H}(r) = \mathbf{I}$$

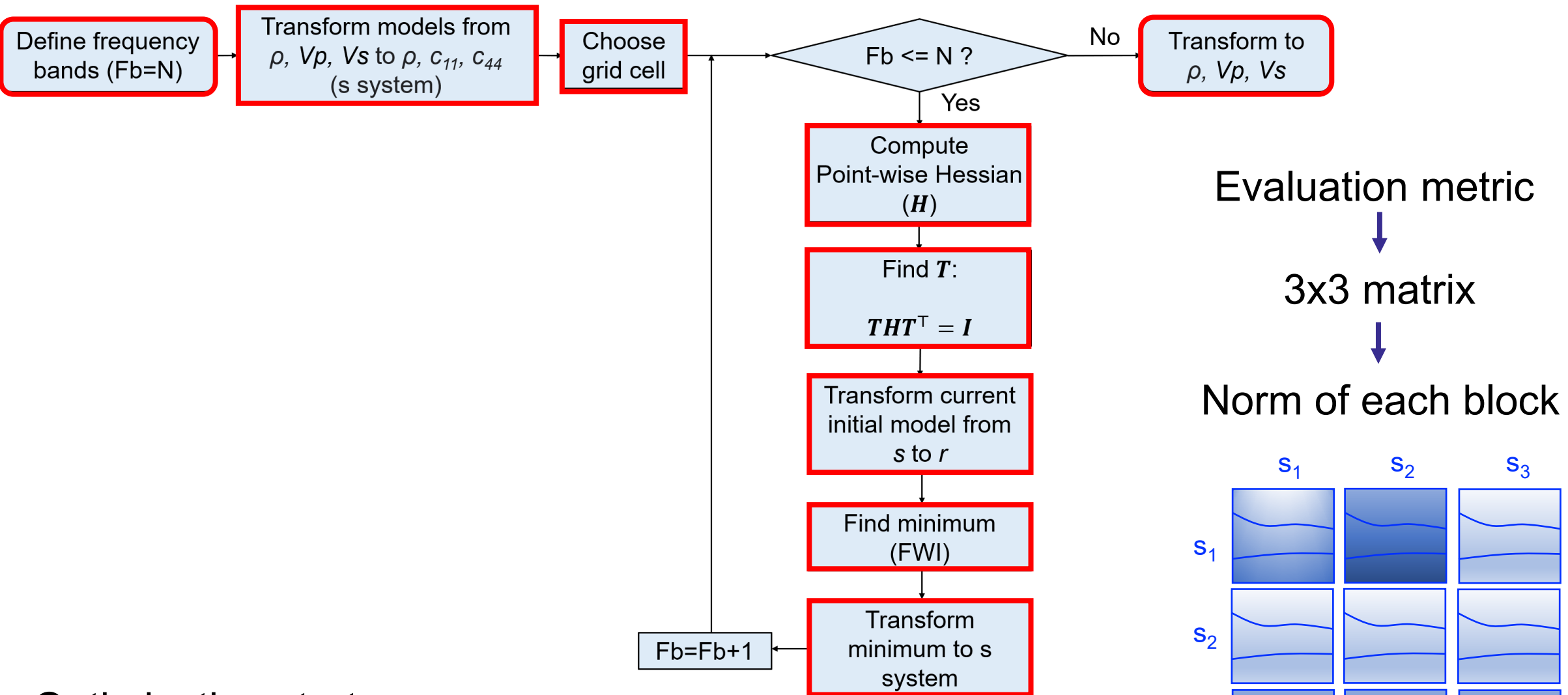
↑  
constraint

$$\mathbf{T} \begin{bmatrix} \blacksquare & \blacksquare & \blacksquare \\ \blacksquare & \blacksquare & \blacksquare \\ \blacksquare & \blacksquare & \blacksquare \end{bmatrix} \mathbf{T}^{\top} = \mathbf{I}$$

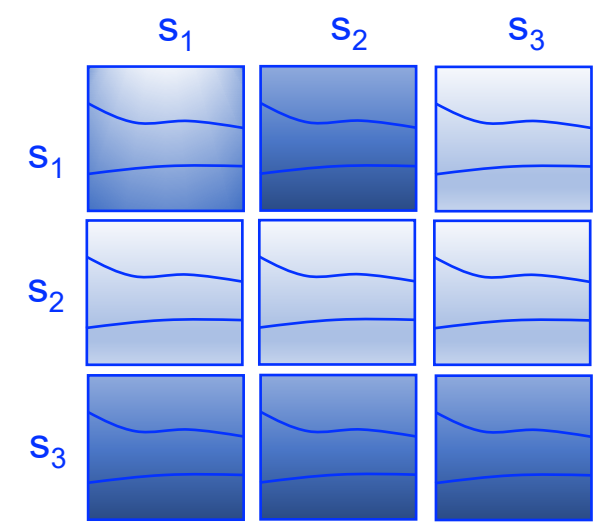
(3x3)



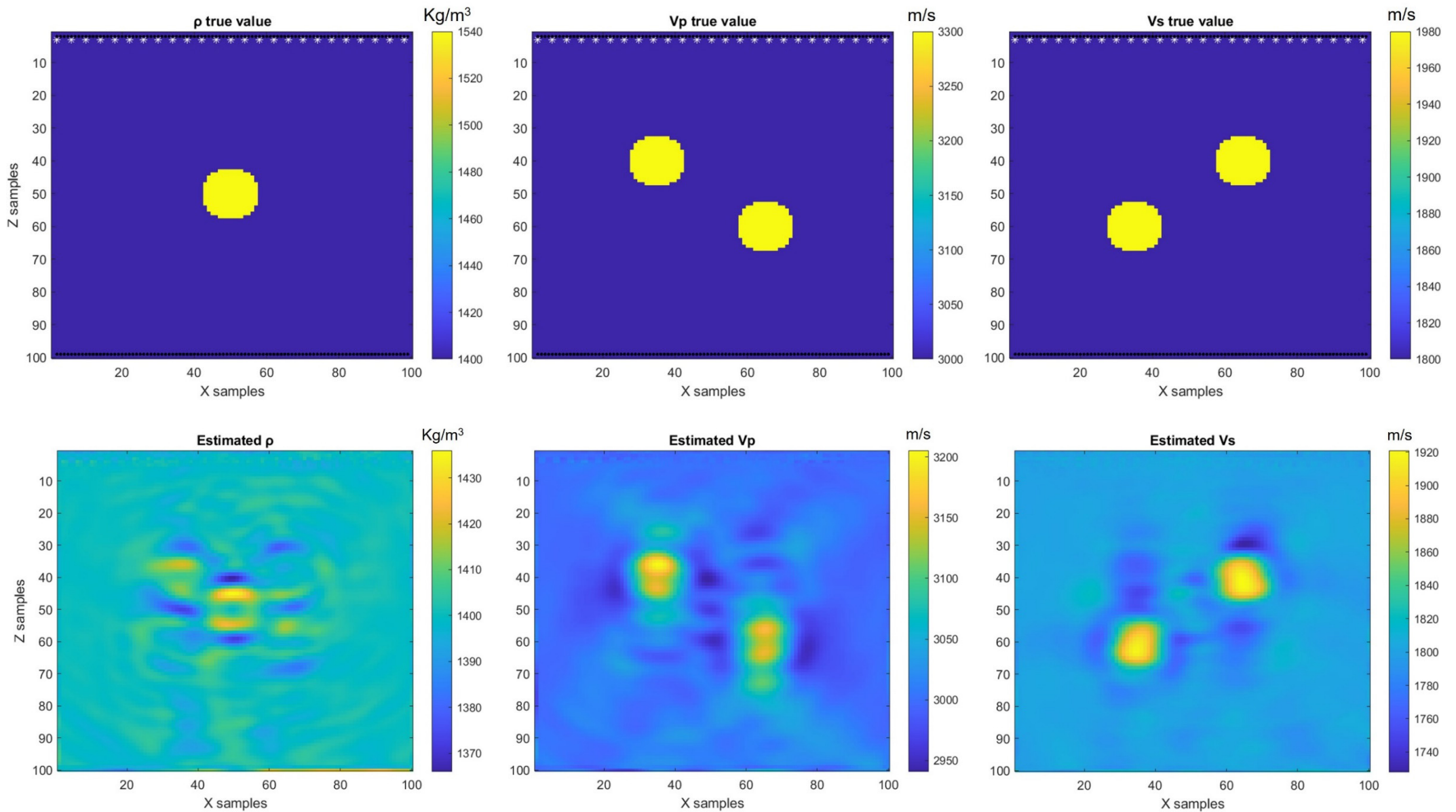
# Workflow and evaluation



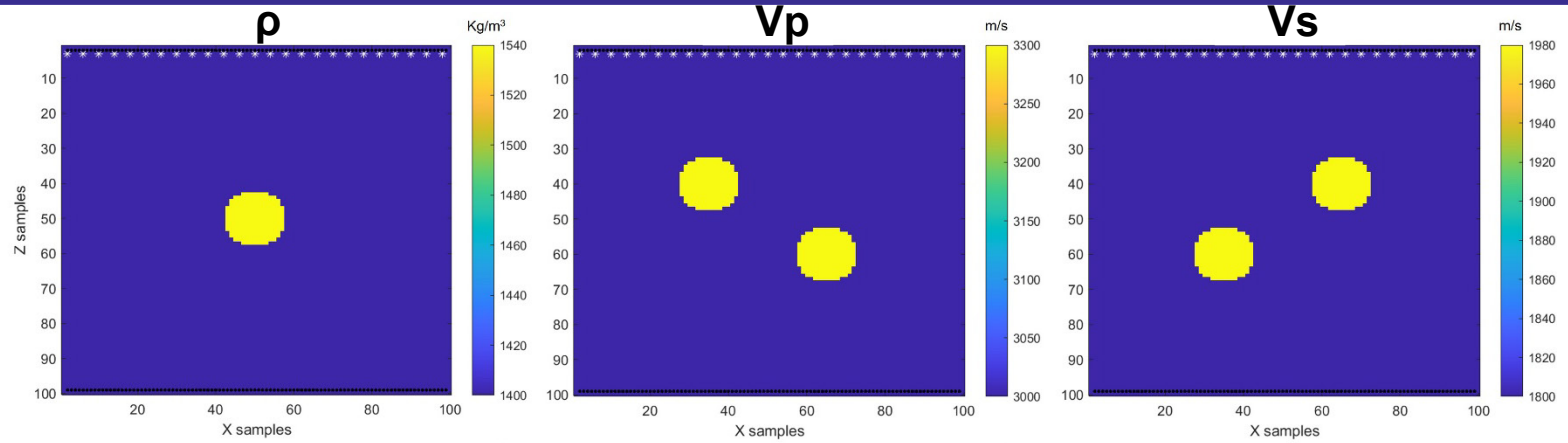
Evaluation metric  
 ↓  
 3x3 matrix  
 ↓  
 Norm of each block



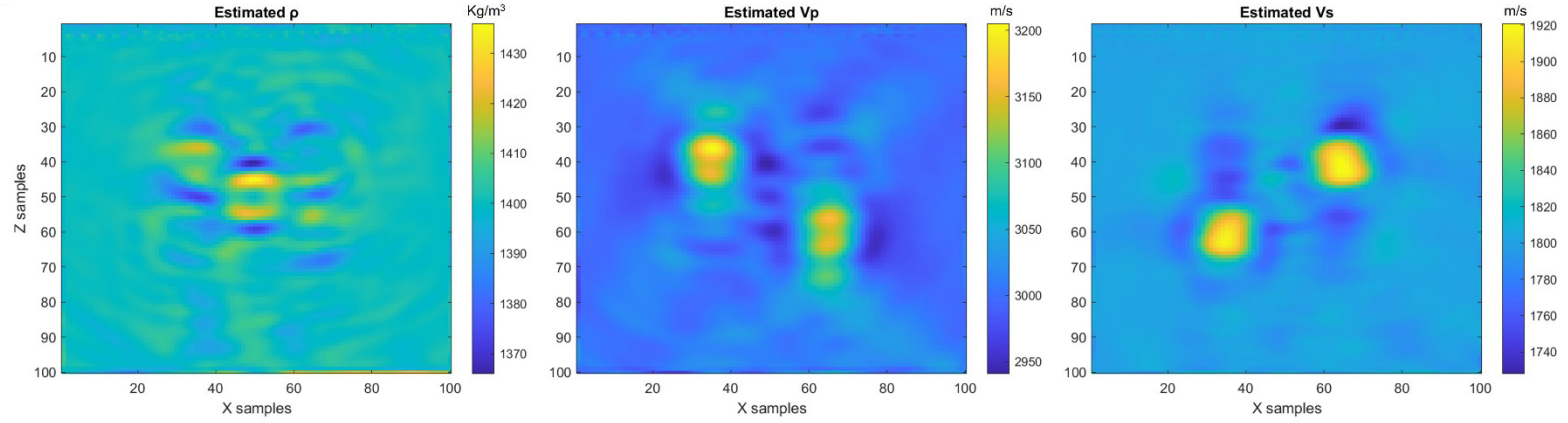
Optimization strategy:  
 Steepest Descent



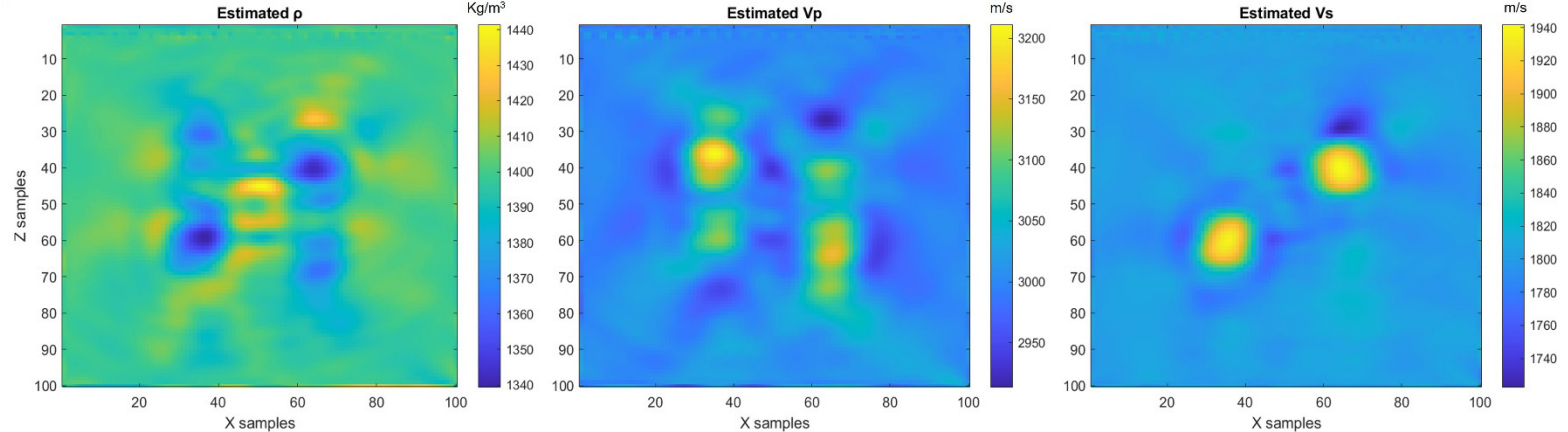
True values



Baseline FWI



Re-parameterized FWI

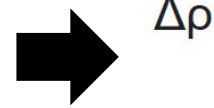
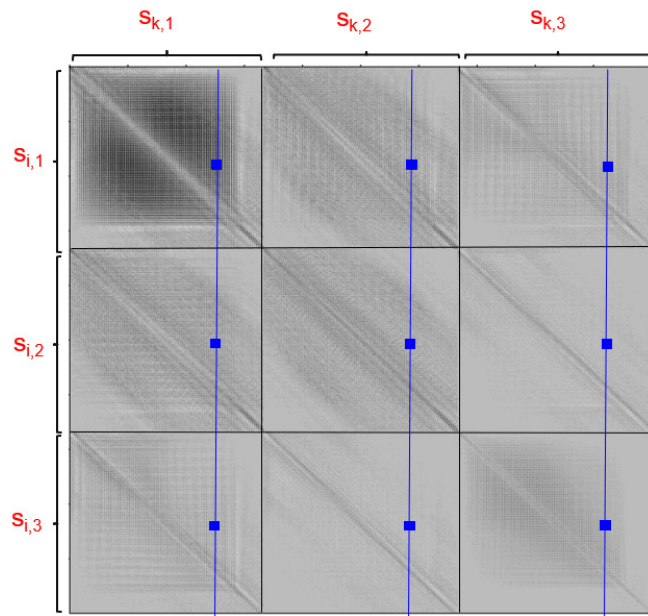


T: x=50 z=20



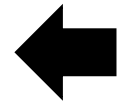


# Results: evaluation of estimates (reference FWI)



$\Delta\rho$

$\Delta V_P$

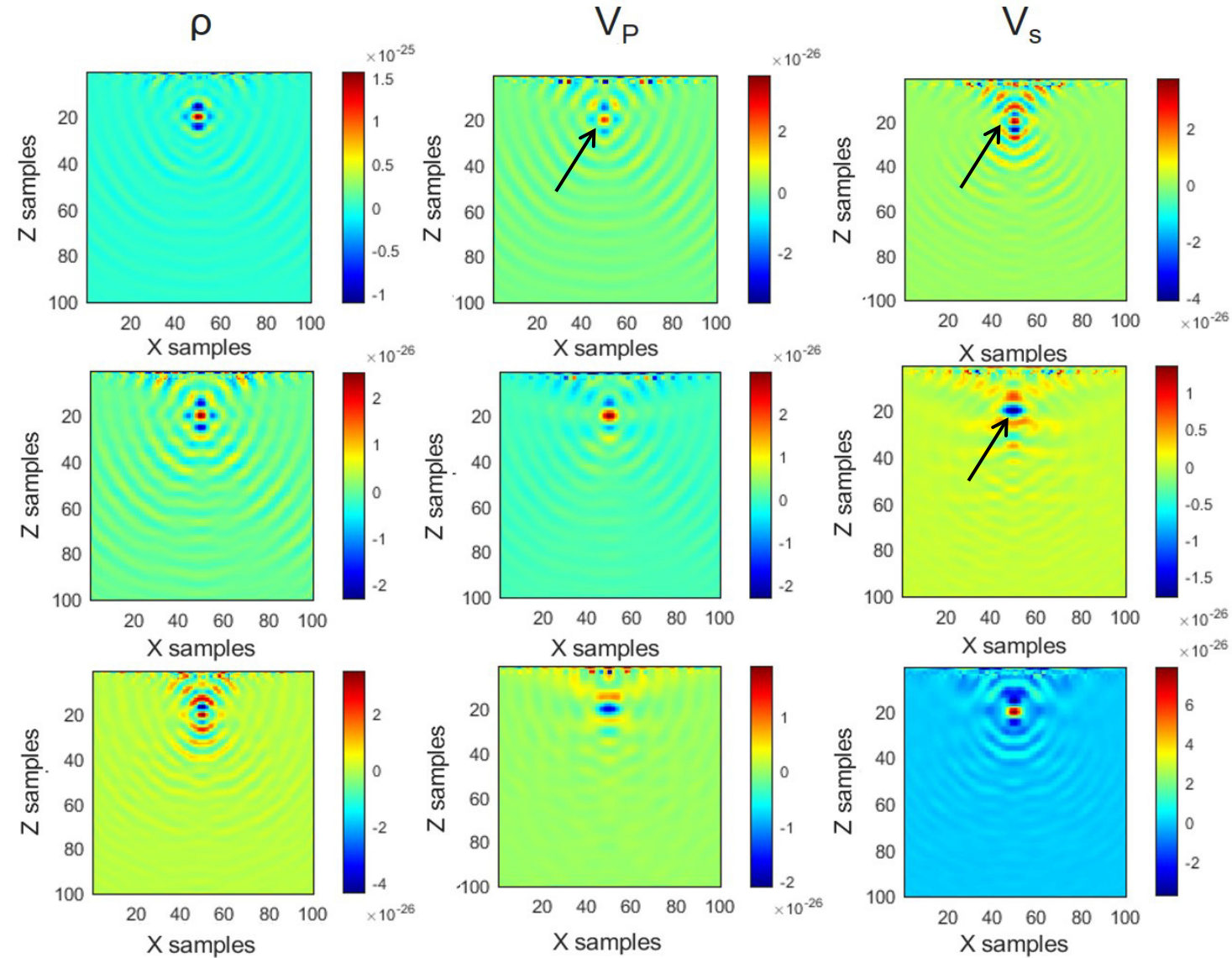


$\Delta V_S$

Normalized crosstalk metric with perturbation at  $x=50$   $z=20$



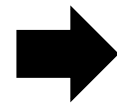
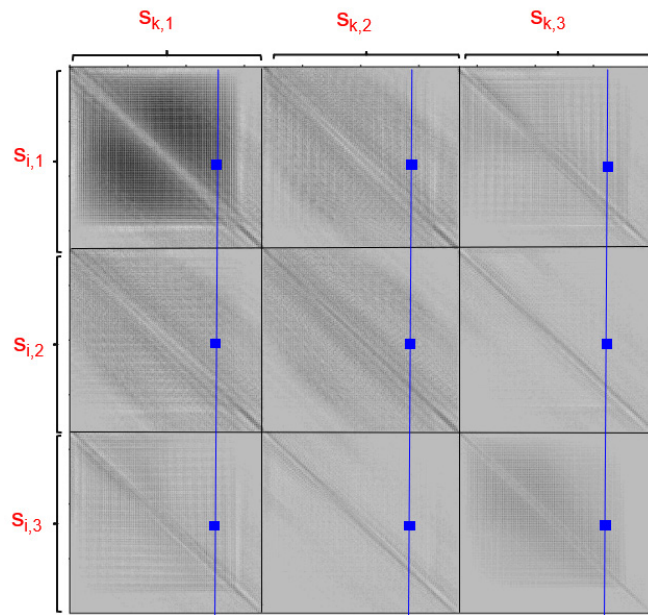
Perturbed location:  $x=50$   $z=20$





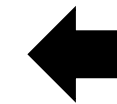


# Results: evaluation of estimates (re-parameterized FWI)



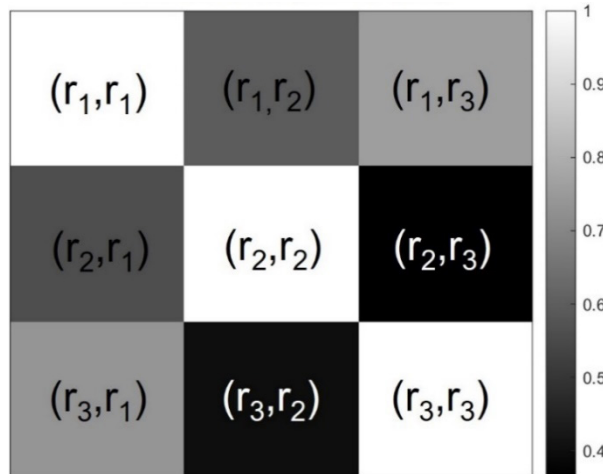
$\Delta r_1$

$\Delta r_2$

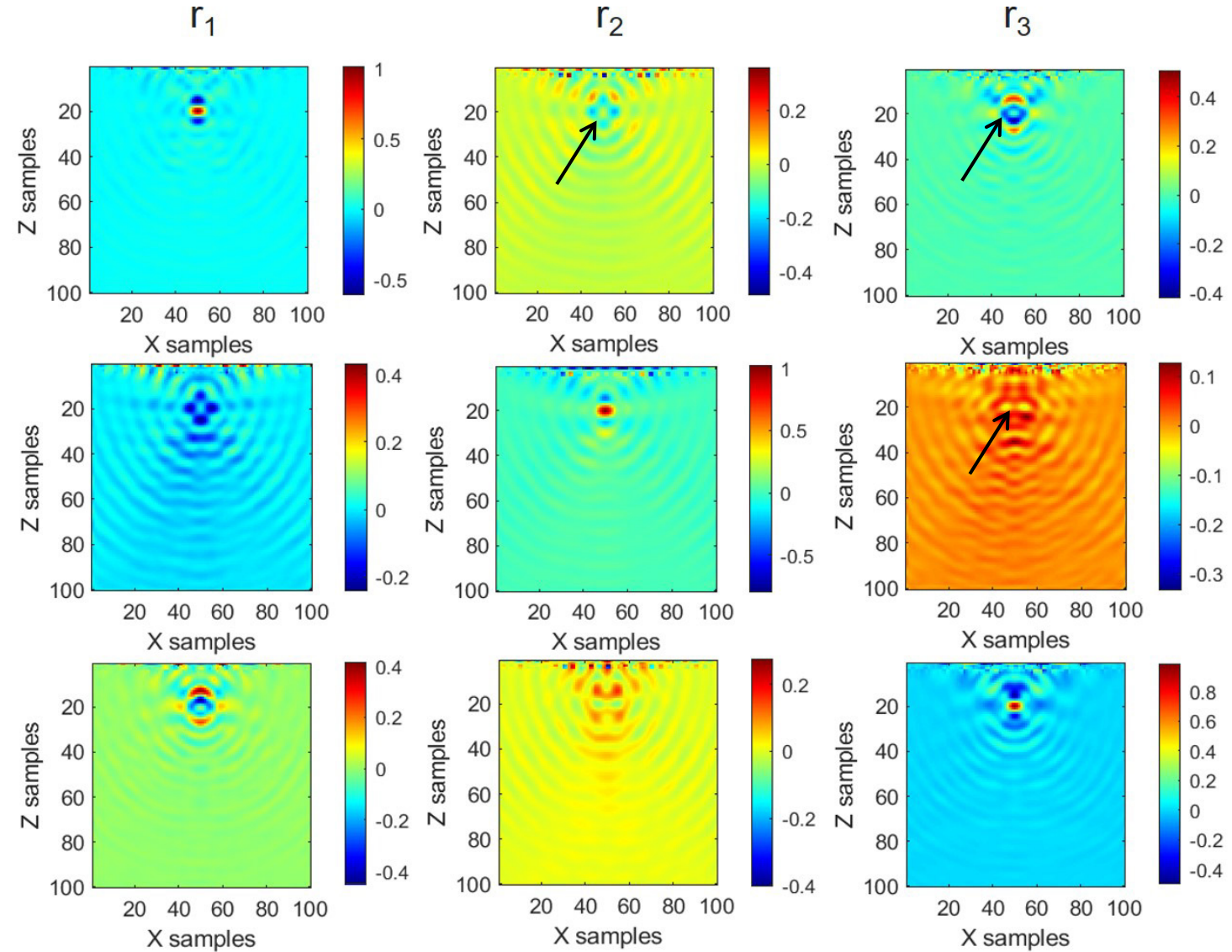


$\Delta r_3$

Normalized crosstalk metric with perturbation at  $x=50$   $z=20$



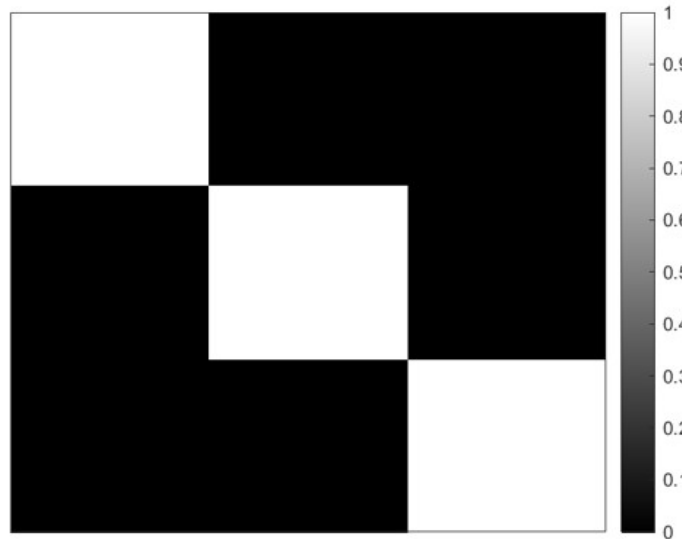
Perturbed location:  $x=50$   $z=20$





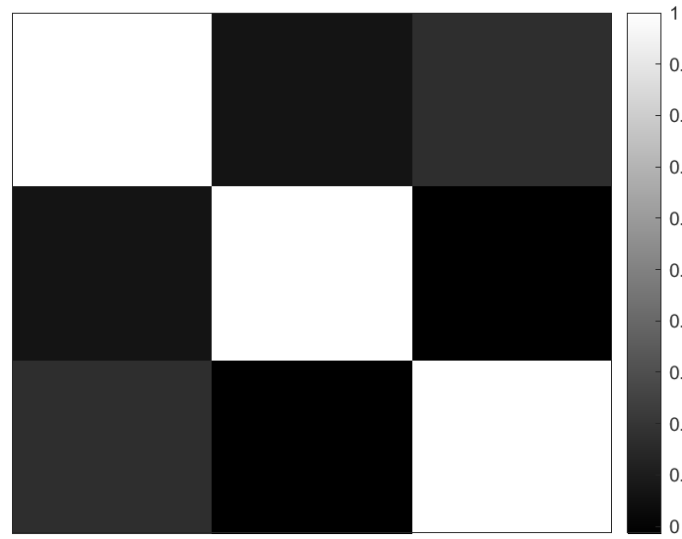
# Results: evaluation of estimates from re-parameterized FWI

Normalized Hessian  
at  $x=50$   $z=20$



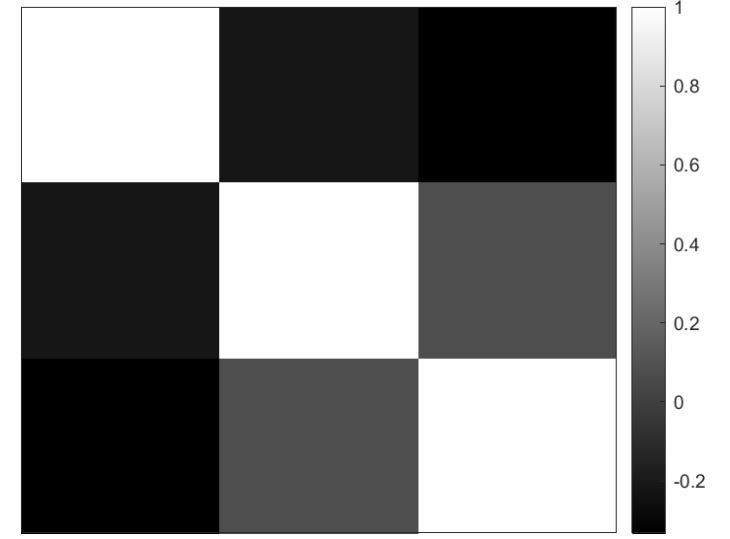
at design position

Normalized Hessian  
at  $x=20$   $z=20$



off design position

Normalized Hessian  
at  $x=80$   $z=80$



off design position



- Treat FWI parameterization as coordinate transform problem
- Seek set of parameters within which  $\mathbf{H} = \mathbf{I}$
- Approach: design  $\mathbf{T}$  based on single point (computable)
  - It works! At design point
  - Crosstalk induced at other locations
- Next steps:

Different procedure to compute  $\mathbf{T}$  with contribution of all locations



- CREWES sponsors
  - CREWES faculty, staff and students
- Natural Science and Engineering Research Council of Canada (CRDPJ 543578-19)



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# Thank you!