

# The geodesic X-ray transform with conjugate points

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Joint work with FRANÇOIS MONARD AND GUNTHER UHLMANN

# Formulation of the Problem

Let  $(M, g)$  be a Riemannian manifold, and let  $\gamma_0$  be a fixed geodesic on it *with possible conjugate points*. More general curves are allowed, as well. Let  $\kappa \neq 0$  be a fixed weight function on  $TM$ .

## Main Problem

*What information about the singularities of  $f$  can we recover, given*

$$Xf(\gamma) = \int \kappa(\gamma(t), \dot{\gamma}(t)) f(\gamma(t)) dt$$

*known for all geodesics  $\gamma$  near  $\gamma_0$ ?*

We assume here that  $\text{supp } f$  is disjoint from the endpoints of  $\gamma_0$ .

In particular, if  $Xf(\gamma) = 0$  (or is smooth) near  $\gamma_0$ , what do we get for  $\text{WF}(f)$ ?

This is a linearized version of the problem to recover a unknown speed from travel times.

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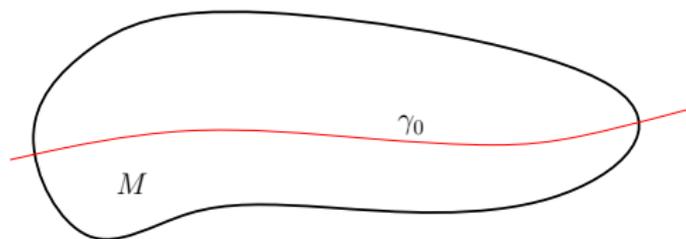
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**Figure:**  $Xf(\gamma)$  known for all  $\gamma$  near a fixed geodesic  $\gamma_0$ .

### Why do we want to know that?

- ▶ In some applications in medical imaging and geophysics, this is all we want to know, to recover the “features” of the image.
- ▶ If we can prove uniqueness somehow (possible even with conjugate points in some cases), we immediately say if we have stability or not.
- ▶ We can think of this as stability analysis even if uniqueness might not hold.

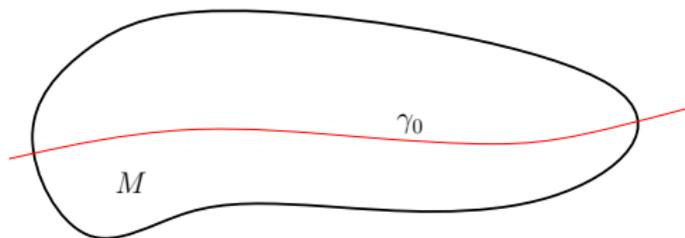


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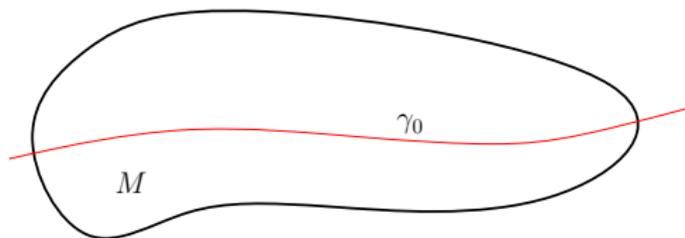


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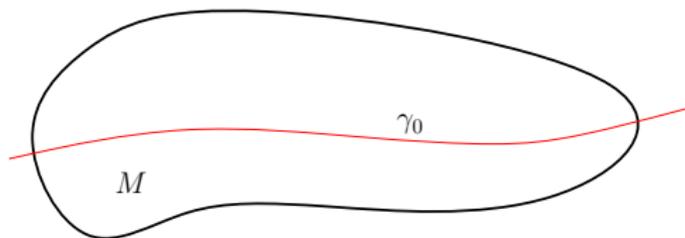


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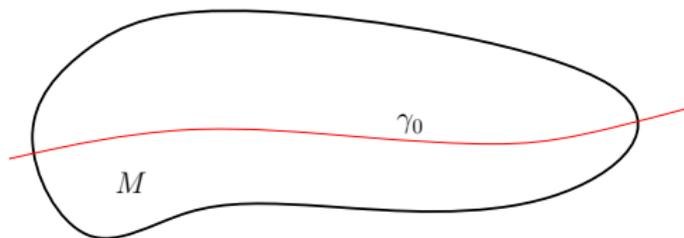


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If no conjugate points, we can do the best thing possible:

## No conjugate points

We can recover singularities conormal to  $\gamma_0$  (and close to those); i.e.,  $\text{WF}(f)$  near  $N^*\gamma_0$ .

If we know  $Xf(\gamma)$  for all (or for a rich enough set of) geodesics, then

- ▶ The problem is Fredholm; hence injectivity implies stability
- ▶ if  $\kappa = 1$ , there is injectivity (Mukhometov et al.)
- ▶ Finitely dimensional smooth kernel
- ▶ Works also for general curves, tensors, incomplete data
- ▶ If the metric (the family of curves) is real analytic, then we have injectivity (hence stability).
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**How much of that is preserved in presence of conjugate points?**

# Conjugate Points

If there are conjugate points, things change quite a bit.

- ▶  $n \geq 3$ : the problem is overdetermined and we could use an open subset of geodesics. If they do not have conjugate points, and their conormals cover  $T^*M$ , we are fine [S-Uhlmann, 2008].
- ▶  $n \geq 3$ , [Uhlmann–Vasy, 2013]: Under a foliation condition (allowing conjugate points), we can do layer stripping.
- ▶  $n \geq 3$ , [S-Uhlmann, 2012]: Conjugate points of fold type might not be a problem, if a certain non-degeneracy condition holds. Hard to verify, and there is no geodesic example (but there are non-geodesic ones).
- ▶  $n = 2$ , [S-Uhlmann, 2012]: If there are conjugate points of fold type, there is always mild instability at least (loss of  $1/4$  derivative) for the local problem ( $\gamma$  near  $\gamma_0$ ).
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## How is this work different?

We give a complete answer of what we can recover (and what we cannot) from knowing  $Xf$  in a neighborhood of one geodesic  $\gamma_0$ .

Once we understand that, we can answer the same question for any partial data problem ( $\gamma$  in an open set).

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# Typical geometry in 2D

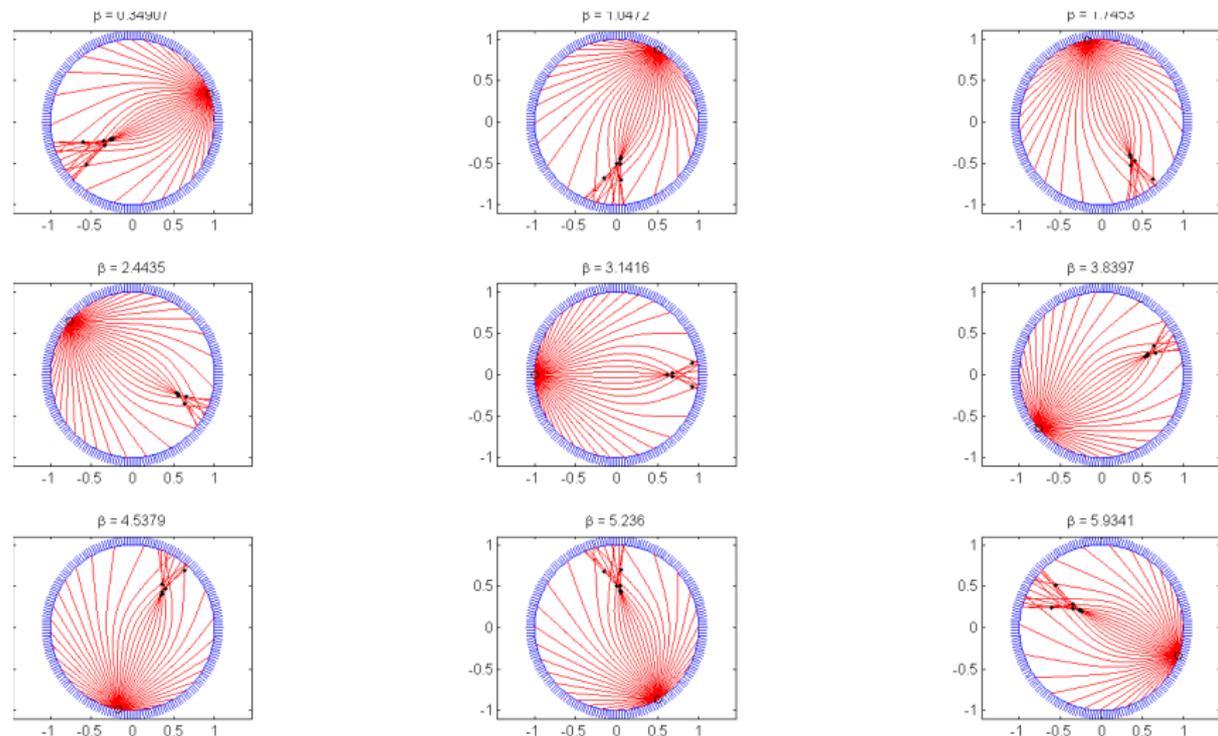
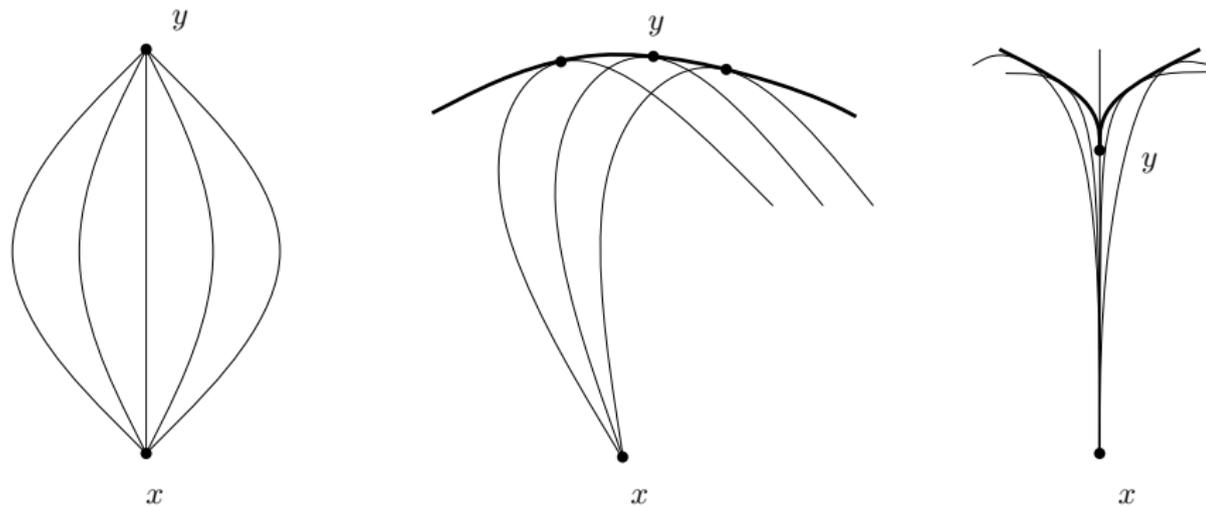


Figure: A cusp and two folds formed by geodesics around a slow region



**Figure:** The three non-degenerate types of conjugate points in the plane together: a blowdown, a fold, and a cusp.

# Main results in a nutshell

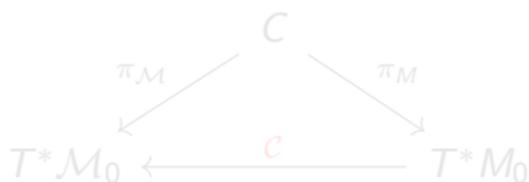
- ▶ Recovery of  $WF(f)$  (for the localized transform, in one direction) is impossible, regardless of the type of the conjugate points — loss of all derivatives at conjugate points!
- ▶ If the weight  $\kappa(x, \theta)$  is an even function of  $\theta$ , reversing the direction of  $t$  of  $\gamma(t)$  does not matter — even knowing  $Xf(\gamma)$  for all  $\gamma$  does not help! The problem then is unstable.
- ▶ For the attenuated transform with a positive attenuation, **if there are no more than two conjugate points along each geodesic**, then there is stability for the global problem! Reason: reversing the time gives us an additional equation.
- ▶ For the attenuated transform with a positive attenuation, **if there are three or more conjugate points along each geodesic**, then there is **no** stability.

Unlike the previous works, we do not study  $X^*X$  (but we have results for it, as well). We work directly with  $X$ .

### Theorem 1

*$X$  is a Fourier Integral Operator in the class  $I^{-\frac{n}{4}}(\mathcal{M}_0 \times M_0, C')$ . It is a  $\Psi$ DO (of order  $-1$ ) if and only if the geodesics in  $\mathcal{M}_0$  have no conjugate points.*

From now on,  $n = 2$ . Then all manifolds in the microlocal diagram



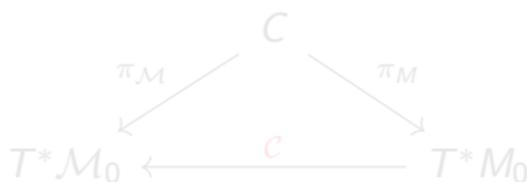
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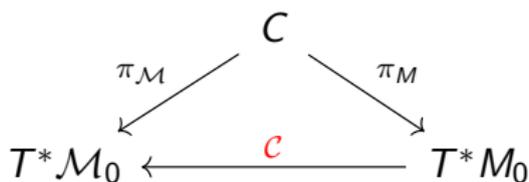
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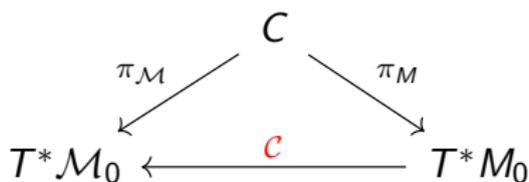
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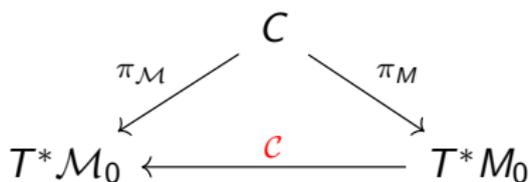
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## Theorem 2

$\mathcal{C}(p, \xi) = \mathcal{C}(q, \eta)$  if and only if there is a geodesic  $[0, 1] \rightarrow \gamma \in \mathcal{M}_0$  joining  $p$  and  $q$  so that

- (a)  $p$  and  $q$  are conjugate to each other,
- (b)  $\xi = \lambda J'(0)$ ,  $\eta = \lambda J'(1)$ ,  $\lambda \neq 0$ , where  $J(t)$  is the unique non-trivial, up to rescaling, Jacobi field with  $J(0) = J(1) = 0$ .

The main idea is to use a partition of unity with cutoffs localized near conjugate points.

Then we have  $X$  acting on  $f$  with small supports, and there are no conjugate points on each piece. So we just need to understand  $X$  without conjugate points, that is all. This is easy (in 2D):

## Theorem 3

Assume no conjugate points and  $n = 2$ . Then  $X$  is an FIO associated with the canonical diffeomorphism  $\mathcal{C}$ . It is elliptic at  $(x, \xi)$  if and only if  $\kappa(x, \xi^\perp / |\xi|) \neq 0$ .

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Assume no conjugate points and  $n = 2$ . Then  $X$  is an FIO associated with the canonical diffeomorphism  $\mathcal{C}$ . It is elliptic at  $(x, \xi)$  if and only if  $\kappa(x, \xi^\perp / |\xi|) \neq 0$ .

## Theorem 2

$\mathcal{C}(p, \xi) = \mathcal{C}(q, \eta)$  if and only if there is a geodesic  $[0, 1] \rightarrow \gamma \in \mathcal{M}_0$  joining  $p$  and  $q$  so that

- (a)  $p$  and  $q$  are conjugate to each other,
- (b)  $\xi = \lambda J'(0)$ ,  $\eta = \lambda J'(1)$ ,  $\lambda \neq 0$ , where  $J(t)$  is the unique non-trivial, up to rescaling, Jacobi field with  $J(0) = J(1) = 0$ .

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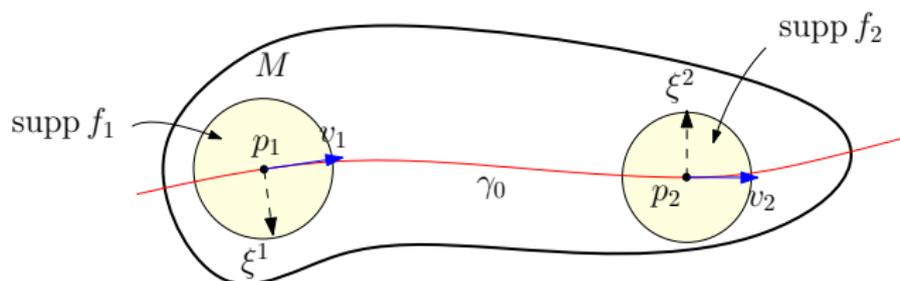
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# Cancellation of singularities

We are ready to prove one of the main results.



Write  $f = f_1 + f_2$ , where  $f_k$  are microlocalized near  $(p_k, \xi^k)$ ,  $k = 1, 2$ , where  $p_1, p_2$  are conjugate. Write also  $X = X_1 + X_2$ . Then

$$Xf = X_1 f_1 + X_2 f_2.$$

But  $X_{1,2}$  are elliptic; therefore

$$X_1 f_1 + X_2 f_2 = g \iff f_1 + X_1^{-1} X_2 f_2 = X_1^{-1} g \iff X_2^{-1} X_1 f_1 + f_2 = X_2^{-1} g$$

## Theorem 4 (Cancellation of singularities)

Given  $f_1$ , one can choose  $f_2$  so that  $X(f_1 + f_2) \in C^\infty$  (microlocally).

Indeed, just solve  $X_1 f_1 + X_2 f_2 = 0$  for  $f_2$  to get  $f_2 = -X_2^{-1} X_1 f_1$ .

In other words, there is a huge microlocal kernel, and we can only recover  $WF(f)$  up to that kernel. Basically, we have one equation for two variables.

This can be generalized easily to  $m$  conjugate points: choose  $f_k$  for all  $k$  but one; then one can solve for the remaining one.

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# Numerical Example

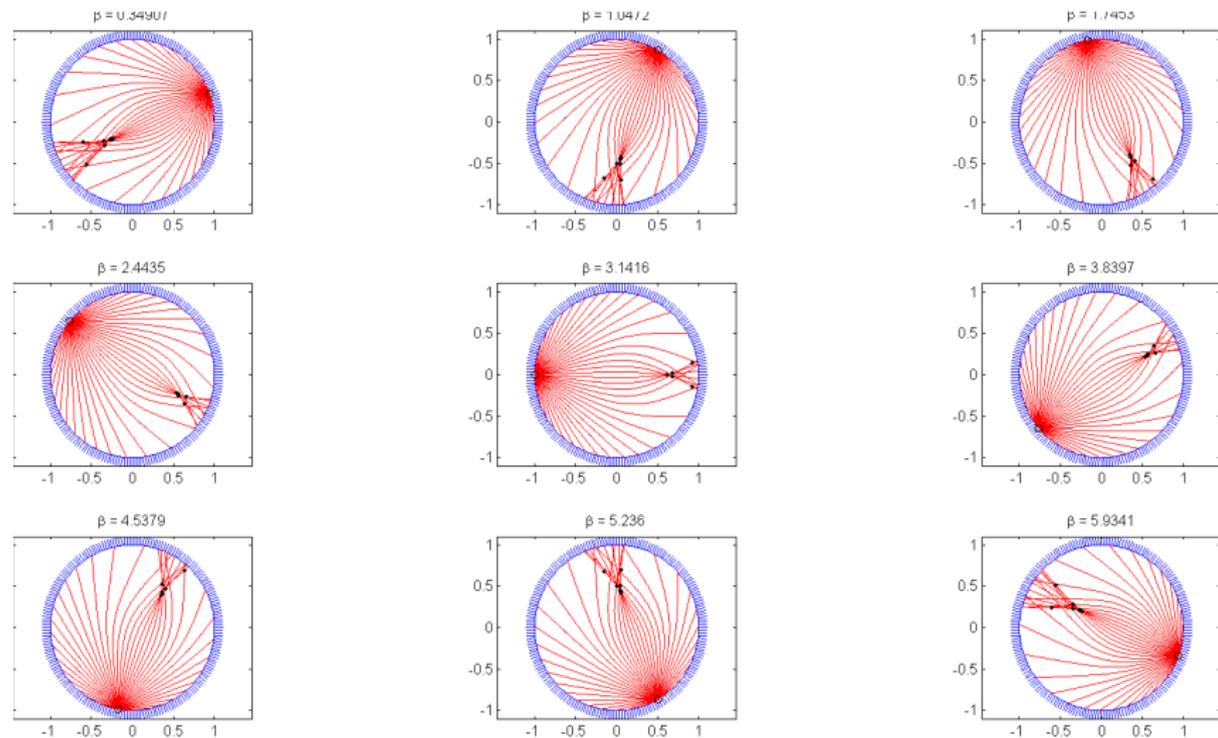
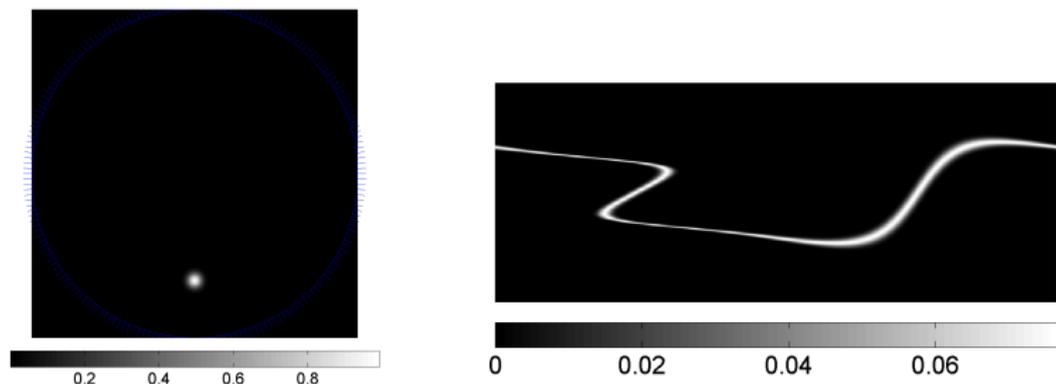


Figure: The geometry of the geodesics

Choose  $f_1$  to be an approximate delta function.



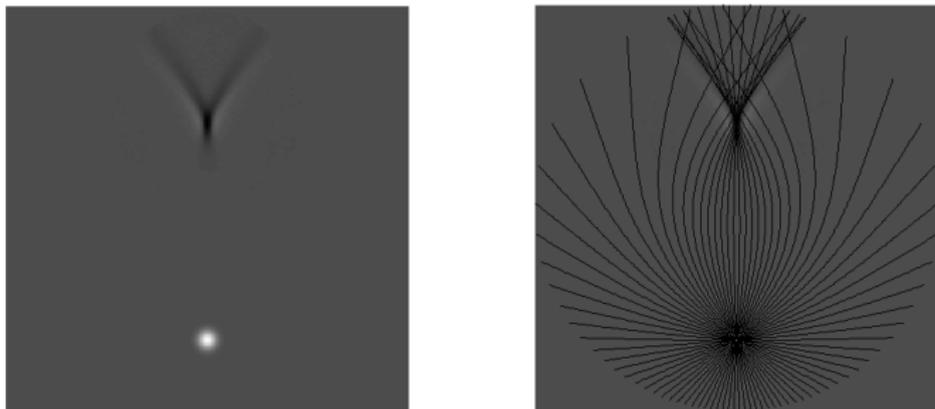
**Figure:** The function  $f_1$  (left) and  $Xf_1$  (right). The horizontal axis is the initial point on the boundary; the vertical one is the initial angle from 0 to  $\pi$ .

Geodesics issued from the bottom in a direction close to a vertical one, will hit the blob once. They are plotted around the 0.06 mark. The ones issued from the top at a downward vertical direction or close would hit the blob three times. They are plotted around the 0.02 mark.

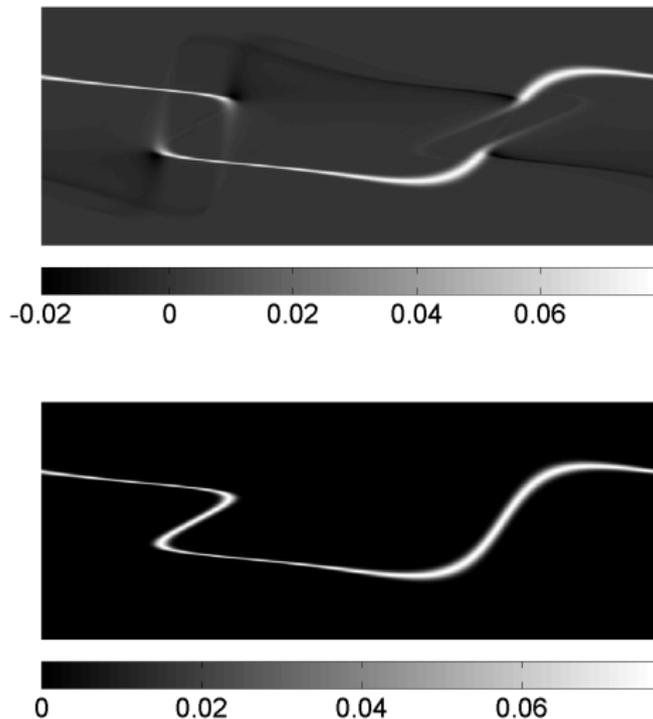
Given  $f_1$ , we construct  $f_2$  as in the theorem:

$$f_2 = -X_2^{-1}X_1 f_1 \quad \text{microlocally.}$$

For this purpose, we invert  $X$  in a smaller domain encompassing the expected location of the artifact (near the conjugate locus).



**Figure:** The function  $f = f_1 + f_2$  (left) and the same function with a few superimposed geodesics on it (right). The “artifact”  $f_2$  appears as an approximate conormal distribution to the conjugate locus of the blob that  $f_1$  represents. The gray scale has changed, and black now represents negative values, around  $-0.5$ .



**Figure:**  $X(f_1 + f_2)$  (top) and  $Xf_1$  (bottom). Some singularities of  $Xf_1$  are nearly erased. The gray scale on top is slightly different to allow for the negative values of  $X(f_1 + f_2)$ . The erased singularities correspond to nearly vertical geodesics.

## Corollary: instability

When there are no conjugate points on the geodesics in  $M$ ,  $\forall n$ , one has

$$\|f\|_{H^s(M)} \leq C \|Xf\|_{H^{s+1/2}(\partial_+ SM_1)} + C_k \|f\|_{H^{-k}(M)}, \quad \forall f \in H_0^s(M)$$

for all  $s \geq 0$ , where  $M_1 \supset \supset M$ . When we know that  $X$  is injective, for example when the weight is constant; then we can remove the  $H^{-k}$  term.

Let  $\kappa(x, \theta)$  be even in  $\theta$  (then integrating over  $\gamma(-t)$  does not provide more information). Then, if there are conjugate points, such an estimate does not hold. Moreover, even

$$\|f\|_{H^{s_1}(M)} \leq C \|Xf\|_{H^{s_2}(\partial_+ SM_1)} + C \|f\|_{H^{s_3}(M)}$$

does not hold, regardless of the choice of  $s_1, s_2, s_3$ .

We therefore have an if and only if condition (up to the borderline case of conjugate points on the boundary) for stability for even weights.

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## The $X^*Xf$ (backprojection) inversion fails

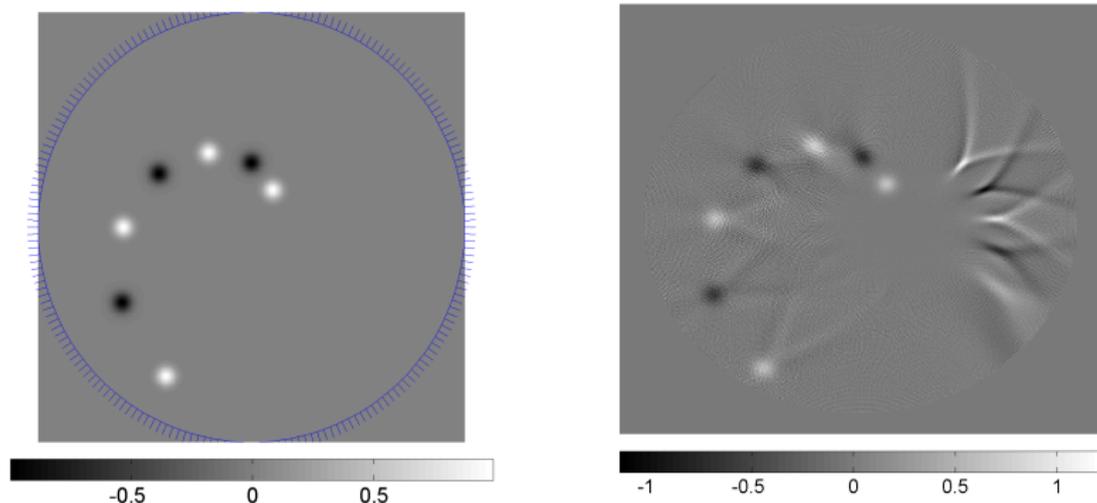


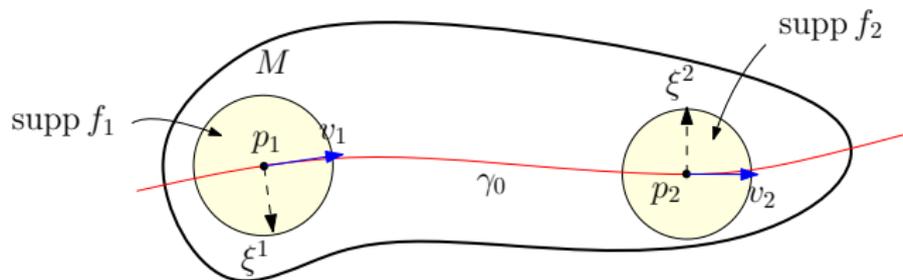
Figure:  $f_1$  (left) and  $C\sqrt{-\Delta_g}X^*Xf_1$  (right).

The artifacts are at the conjugate loci to each point. In the notation above, we see a linear combination of  $f_1$  and  $f_2$  in the reconstruction. Then  $f_2$  is an artifact.

# The attenuated X-ray transform

Assume now that the weight is coming from an attenuation  $\sigma(x, \nu) > 0$ :

$$\kappa(x, \nu) = e^{-\int_0^\infty \sigma(\gamma_{x,\nu}(s), \dot{\gamma}_{x,\nu}(s)) ds}.$$



Then the direction along  $\gamma$  matters. Microlocally, to recover singularities near  $(p_1, \xi^1)$  and  $(p_2, \xi_2)$ , we have two equations. If the determinant is not zero, we can solve them!

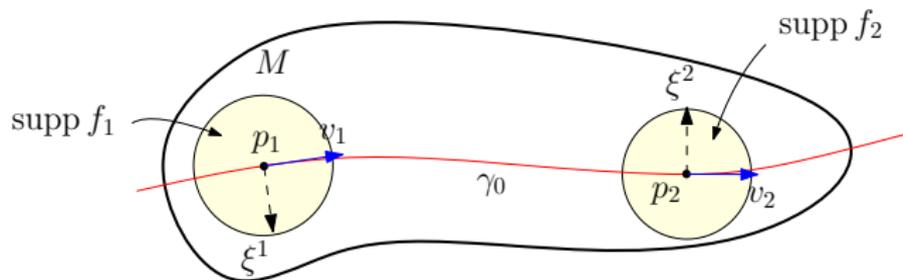
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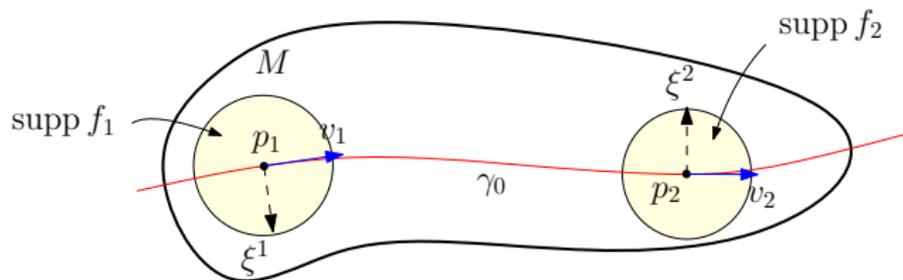
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$$\det \begin{pmatrix} \kappa(p_1, v_1) & < & \kappa(p_2, v_2) \\ \kappa(p_1, -v_1) & > & \kappa(p_2, -v_2) \end{pmatrix} \neq 0.$$

Automatically true! Then we can recover the singularities!

## More examples

Reconstruction with the Landweber iteration method. The metric has conjugate points.

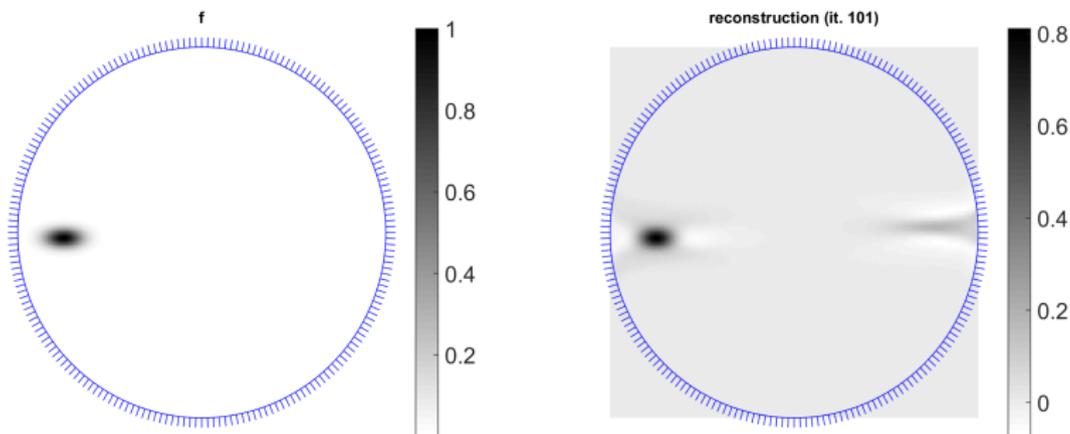


Figure: Attenuation = 0. Left: original; right: reconstruction

There is an artifact at the conjugate locus.

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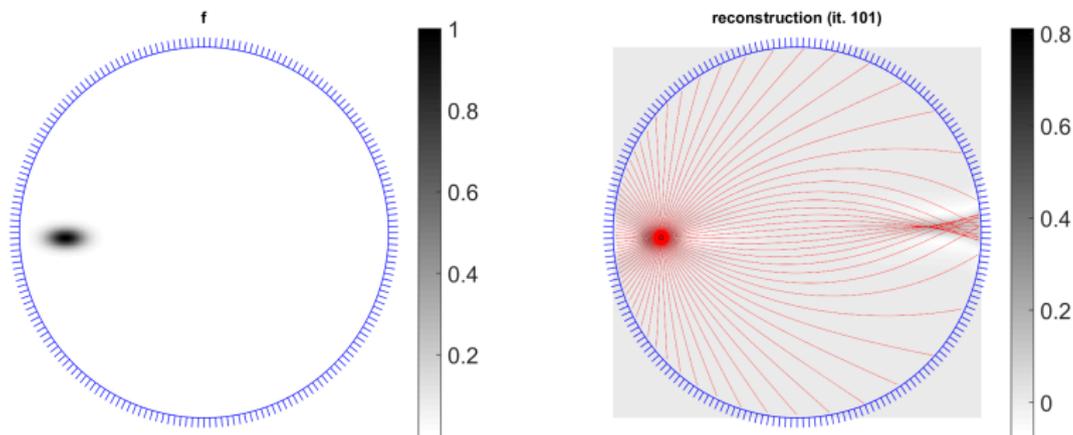


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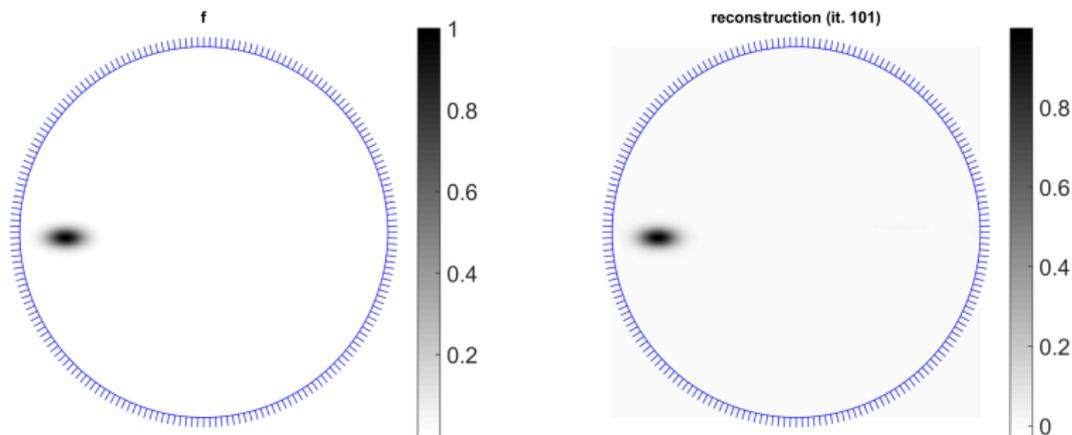


Figure: Variable attenuation with average = 0.6. Left: original; right: reconstruction.

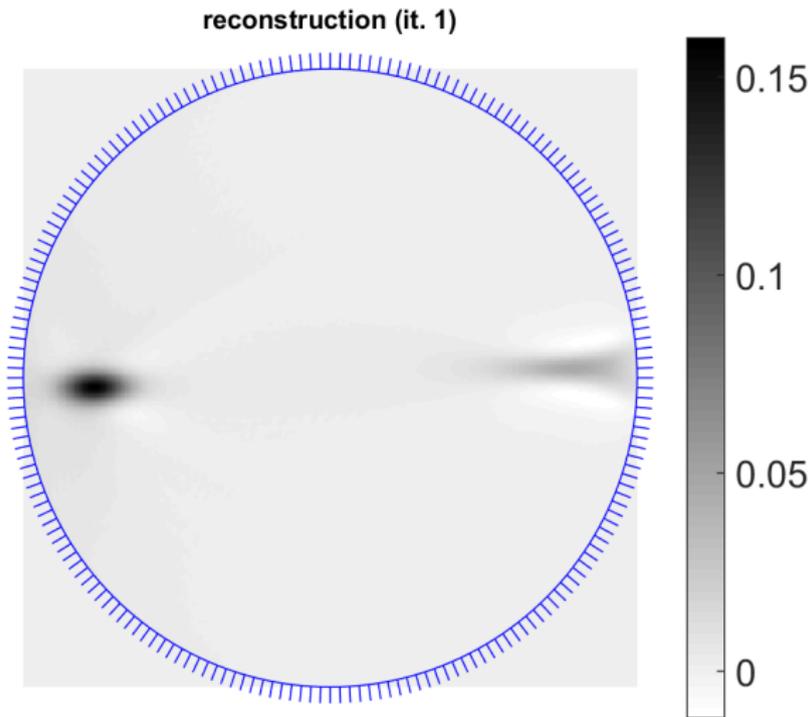


Figure: Variable attenuation with average = 0.6. Iteration #1.

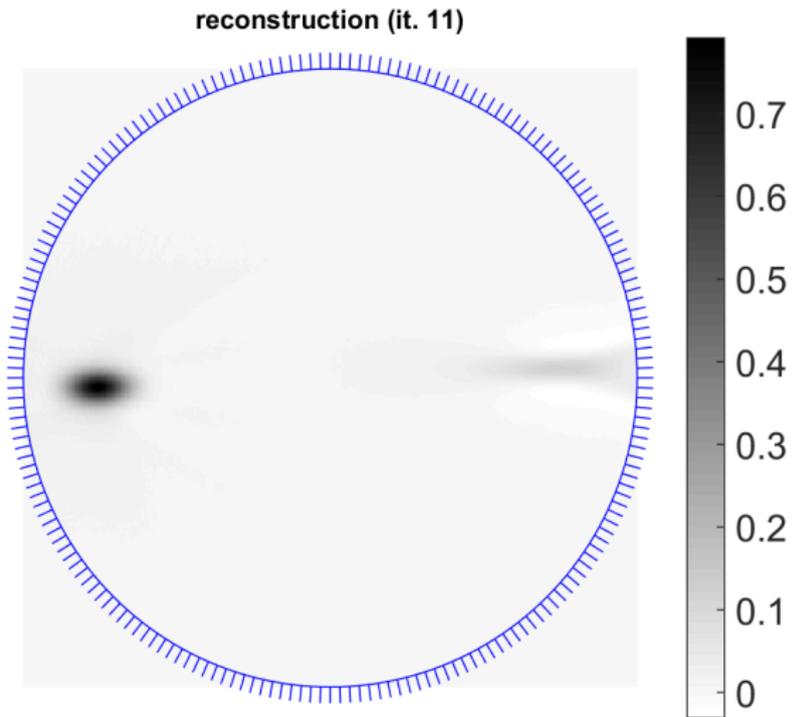


Figure: Variable attenuation with average = 0.6. Iteration #11.

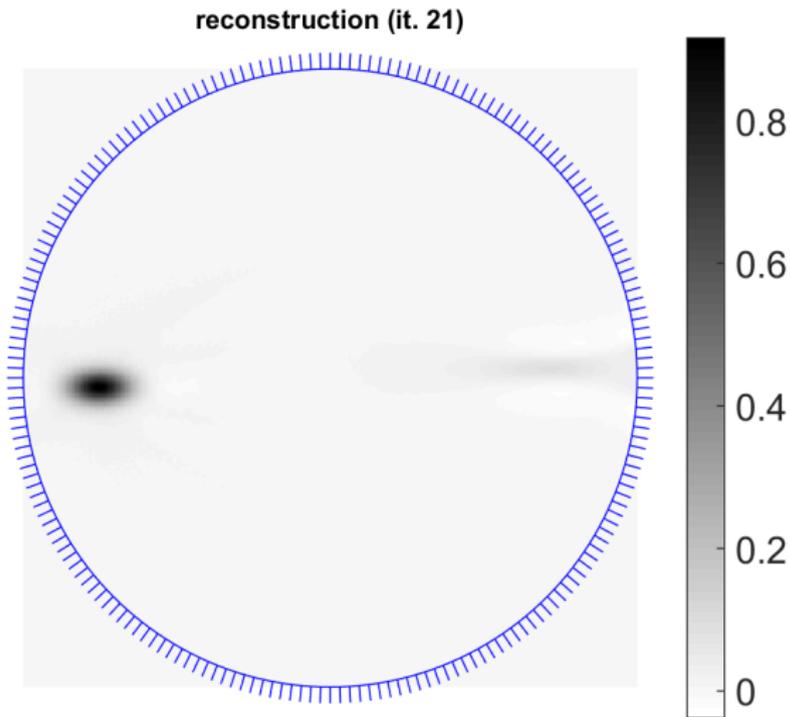


Figure: Variable attenuation with average = 0.6. Iteration #21.

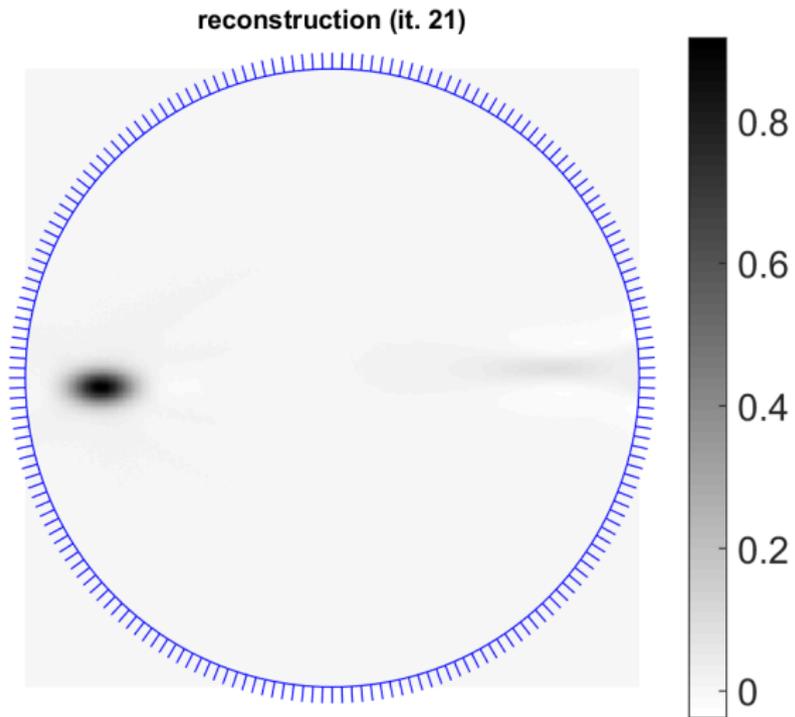


Figure: Variable attenuation with average = 0.6. Iteration #21.

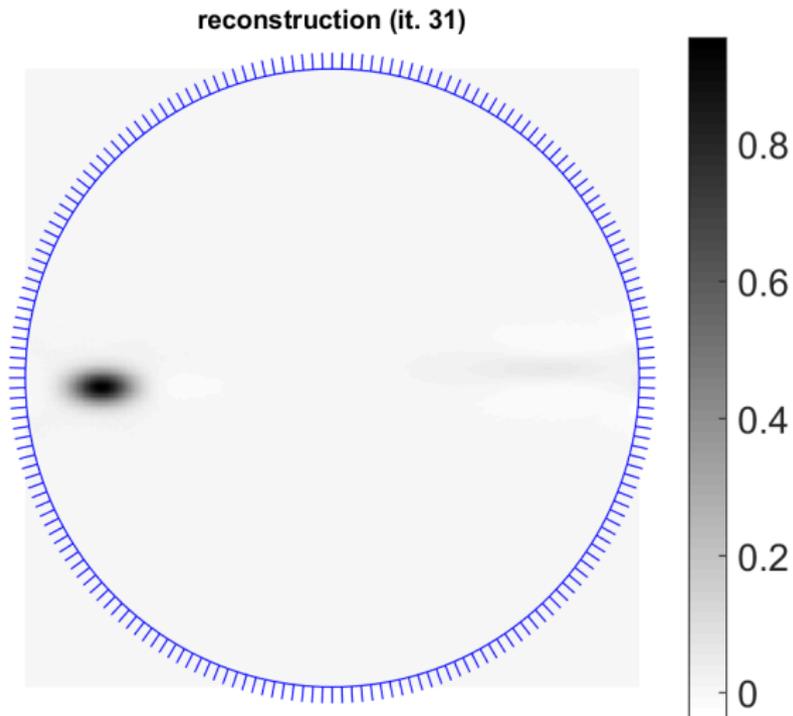


Figure: Variable attenuation with average = 0.6. Iteration #31.

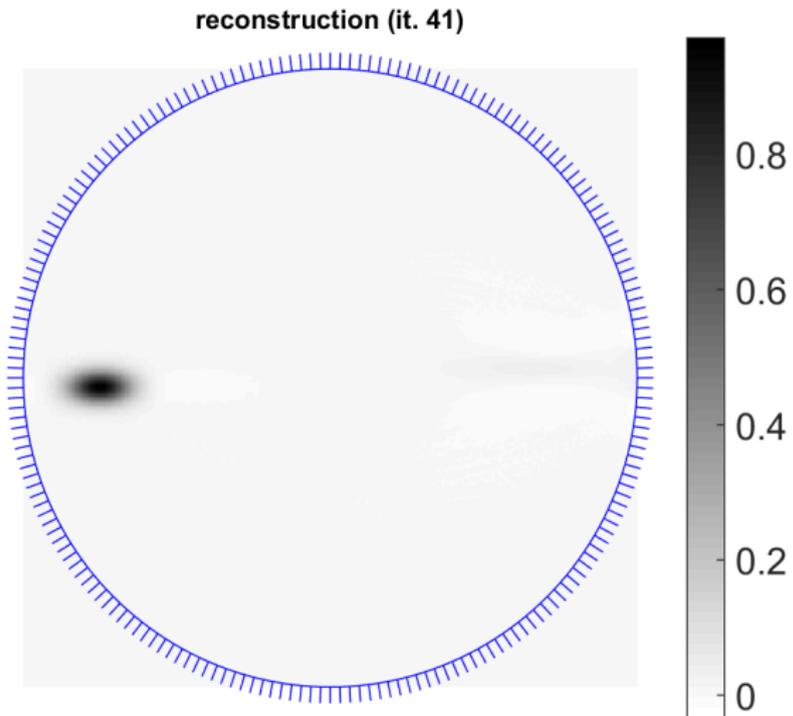


Figure: Variable attenuation with average = 0.6. Iteration #41.

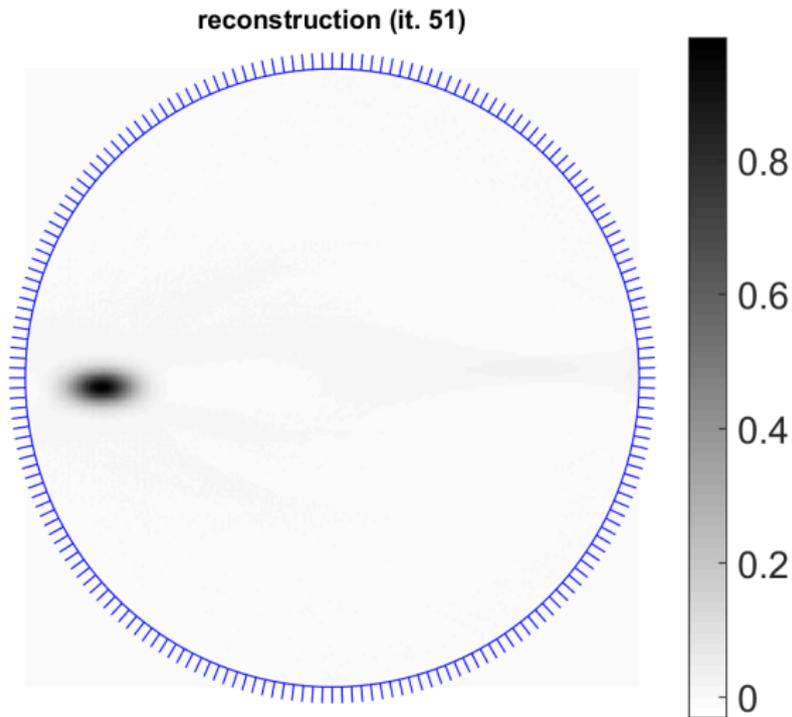


Figure: Variable attenuation with average = 0.6. Iteration #51.

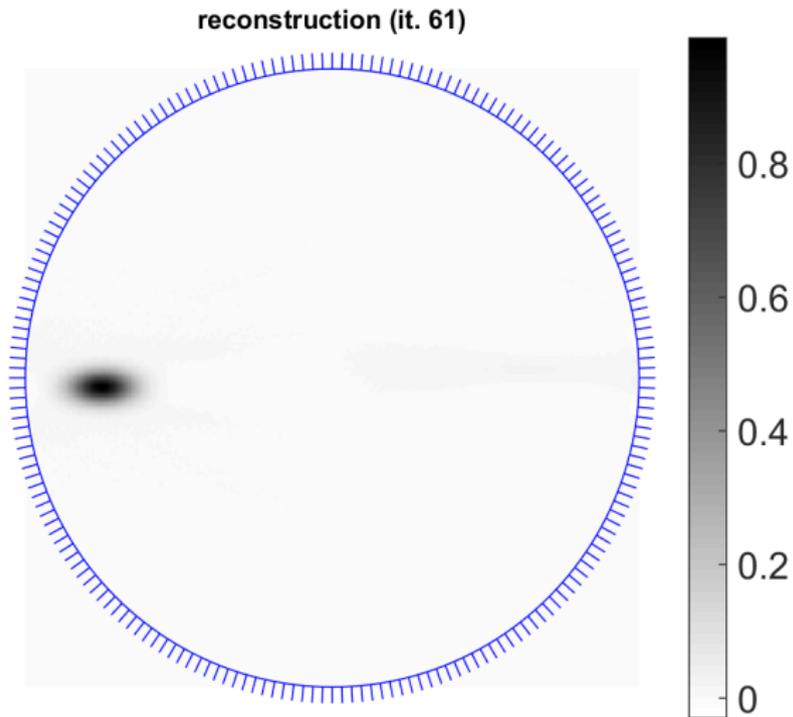


Figure: Variable attenuation with average = 0.6. Iteration #61.

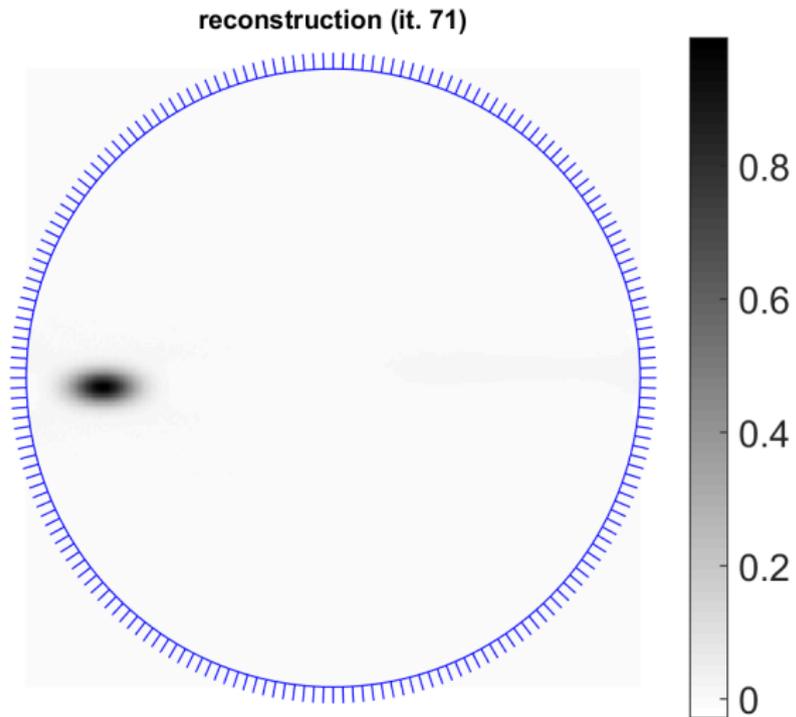


Figure: Variable attenuation with average = 0.6. Iteration #71.

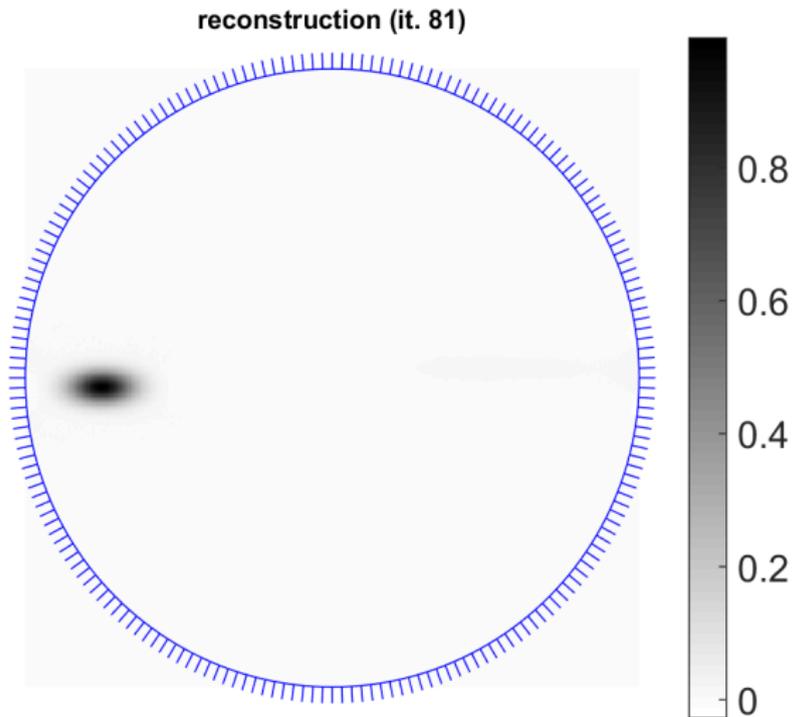


Figure: Variable attenuation with average = 0.6. Iteration #81.

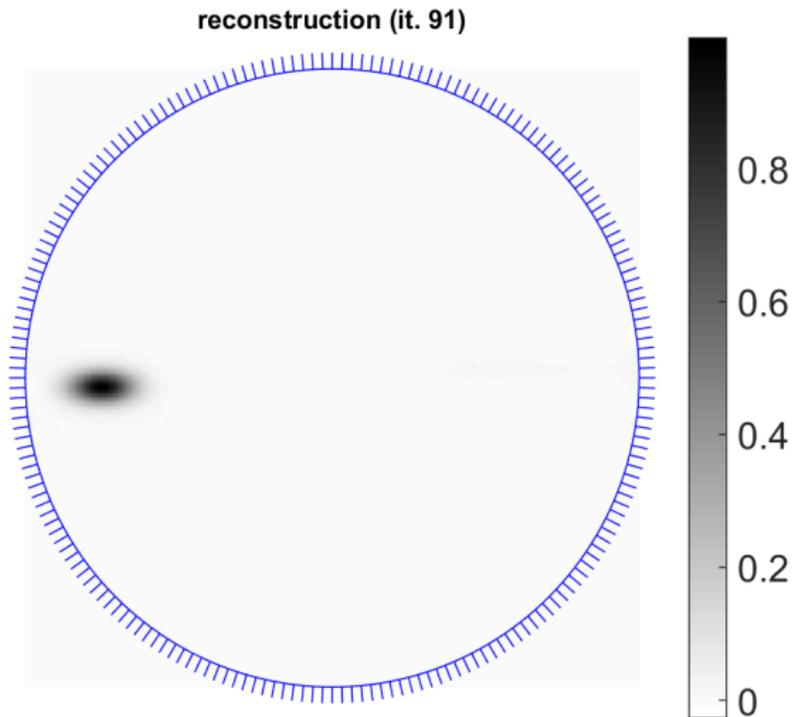


Figure: Variable attenuation with average = 0.6. Iteration #91.

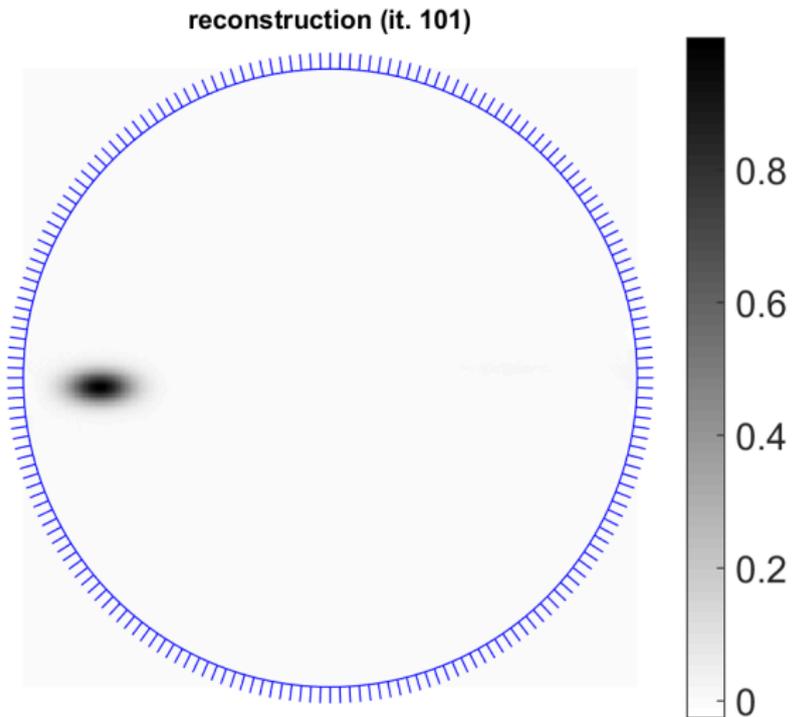


Figure: Variable attenuation with average = 0.6. Iteration #101.