## Thermoacoustic Tomography in Bounded Domains

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## Outline

(1) TAT: introduction
(2) TAT: models

- In $\mathbb{R}^{n}$
- In $\Omega$ : Full Data
- In $\Omega$ : Partial Data


## Stand-alone medical imaging modalities

- High contrast modalities:
- Optical Tomography (OT);
- Electrical Impedance Tomography (EIT);
- Elastographic Imaging (EI).
- High resolution modalities:
- Computerized Tomography (CT);
- Magnetic Resonance Imaging (MRI);
$\Longrightarrow$ sometimes low contrast.
- Ultrasound Imaging (UI).


## Coupled physics medical imaging modalities

Idea: use physical mechanism that couples two modalities to improve resolution while keeping the high contrast capabilities.

| High <br> Contrast | High <br> Resolution | Hybrid Inverse Problems |
| :---: | :---: | :---: | | Photo-acoustic tomography - PAT |
| :---: |

## Photo-acoustic effect

Photo-acoustic effect:

Graham Bell: When rapid pulses of light are incident on a sample of matter they can be absorbed and the resulting energy will then be radiated as heat. This heat causes detectable sound waves due to pressure variation in the surrounding medium.


## Experimental result



Courtesy UCL (Paul Beard's Lab).

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## Model in $\mathbb{R}^{n}$

Let $\Omega \subset \mathbb{R}^{n}$ be a bounded domain with supp $f \subset \Omega$. Assume the speed $c(x)$ is variable and known in $\Omega$. For $T>0$, let $u$ solve the problem

$$
\left\{\begin{aligned}
\left(\partial_{t}^{2}-c^{2}(x) \Delta\right) u & =0 \\
\left.u\right|_{t=0} & =f \\
\left.\partial_{t} u\right|_{t=0} & =0
\end{aligned} \quad \text { in }(0, T) \times \mathbb{R}^{n}\right.
$$

Measurement: $\Lambda f:=\left.u\right|_{[0, T] \times \partial \Omega}$.

Inverse Problem: recover $f$ from $\Lambda f$.

## Literature in $\mathbb{R}^{n}$

Previous Results: Agranovsky, Ambartsoumian, Anastasio et. al., Burcholzer, Cox et. al., Finch, Grun, Haltmeier, Hofer, Hristova, Jin, Kuchment, Nguyen, Paltauff, Patch, Rakesh, Stefanov, Uhlmann, Wang, Xu, ...

For the Riemannian manifold $\left(\bar{\Omega}, c^{-2} d x^{2}\right)$, let

$$
\begin{gathered}
T_{0}:=\max _{\bar{\Omega}}^{\operatorname{dist}(x, \partial \Omega)} . \\
T_{1}:=\text { length of longest geodesic in } \bar{\Omega} .
\end{gathered}
$$

## Theorem (Stefanov and Uhlmann, 2009)

- $T<T_{0} \Rightarrow$ no uniqueness;
- $T_{0}<T<\frac{T_{1}}{2} \Rightarrow$ uniqueness, no stability;
- $\frac{T_{1}}{2}<T \Rightarrow$ stability and explicit reconstruction.


## Stefanov and UhImann's Time Reversal

Define $A(\Lambda f):=v(0, \cdot)$ (pseudo-inverse of $\Lambda$ ) where $v$ solve the backward problem

$$
\left\{\begin{aligned}
\left(\partial_{t}^{2}-c^{2}(x) \Delta\right) v & =0 \quad \text { in }(0, T) \times \Omega \\
\left.v\right|_{t=T} & =\phi \\
\left.\partial_{t} v\right|_{t=T} & =0 \\
\left.v\right|_{[0, T] \times \partial \Omega} & =\Lambda f
\end{aligned}\right.
$$

where $\phi$ solves

$$
\Delta \phi=0 \quad \text { in } \Omega,\left.\quad \phi\right|_{\partial \Omega}=\Lambda f(T, \cdot)
$$



## Stefanov and Uhlmann's Time Reversal

Denote the error operator by

$$
K f:=f-A(\wedge f)
$$

or equivalently

$$
(I-K) f=A(\wedge f)
$$

Stefanov and Uhlmann showed that $\|K\|<1$ when $T>\frac{T_{1}}{2}$. This leads to the Neumann series reconstruction:

$$
f=(I-K)^{-1} A(\wedge f)=\sum_{m=0}^{\infty} K^{m} A(\wedge f)
$$

Numerical implementation: Qian-Stefanov-Uhlmann-Zhao (2011)

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## Model in $\Omega$

Motivation: placing reflectors around the patient proposed by the UCL photoacoustic group.

Assume the speed $c(x)$ is variable and known in $\Omega$. For $T>0$, let $u$ solve the problem

$$
\left\{\begin{aligned}
\left(\partial_{t}^{2}-c^{2}(x) \Delta\right) u & =0 \\
\left.u\right|_{t=0} & =f \\
\left.\partial_{t} u\right|_{t=0} & =0 \\
\left.\partial_{\nu} u\right|_{(0, T) \times \partial \Omega} & =0 .
\end{aligned}\right.
$$

Measurement: $\Lambda f:=\left.u\right|_{[0, T] \times \partial \Omega}$.

Inverse Problem: recover $f$ from $\wedge f$.

## Literature in $\Omega$

Previous Results: Kunyansky, Holman, Cox, Acosta, Montalto, Nguyen.

For the Riemannian manifold $\left(\bar{\Omega}, c^{-2} d x^{2}\right)$, let

$$
T_{0}:=\max _{\bar{\Omega}} \operatorname{dist}(x, \partial \Omega)
$$

$T_{1}:=$ length of longest geodesic in $\bar{\Omega}$.

## Theorem (Stefanov and Y., 2015)

- $T<T_{0} \Rightarrow$ no uniqueness;
- $T_{0}<T<\frac{T_{1}}{2} \Rightarrow$ uniqueness, no stability;
- $\frac{T_{1}}{2}<T \Rightarrow$ stability and explicit reconstruction.


## Time reversal in $\Omega$ fails!

## Let $v$ solve the problem

$$
\left\{\begin{aligned}
\left(\partial_{t}^{2}-c^{2}(x) \Delta\right) v & =0 \quad \text { in }(0, T) \times \Omega \\
\left.v\right|_{t=T} & =\phi \\
\left.\partial_{t} u\right|_{t=T} & =0 \\
\left.u\right|_{(0, T) \times \partial \Omega} & =\Lambda f .
\end{aligned}\right.
$$

Define the error operator $K f:=f-v(0)$, but $\|K\|=1$ !


## Time reversal in $\Omega$ fails!



Figure: Failure of the time reversal to resolve all singularities. $T=0.9 \times$ diagonal, $c=1$. Increasing $T$ does not help!

## Propagation of singularities



Figure: Propagation of singularities in $[0, T] \times \Omega$ for the positive speed only with Neumann boundary conditions (left) and time reversal with Dirichlet ones (right). In the latter case, the sign changes at each reflection.

## Main idea: averaged time reversal

This leads to the following idea:


## Average with respect to $T$ !

Then the error will average as well and some of the positive and negative contributions will cancel out. This will make the error operator a microlocal contraction.

Let $A(\tau)$ be the time reversal over $[0, \tau]$. Define the averaged time reversal operator as

$$
\mathcal{A}_{0}:=\frac{1}{T} \int_{0}^{T} A(\tau) d \tau
$$

## Averaging works!



Figure: Averaged time reversal. $T=0.9 \times$ diagonal, $c=1$. This is not our inversion yet!

## Comparison with non-averaged time reversal



Figure: For comparison: Failure of the time reversal to resolve all singularities. $T=0.9 \times$ diagonal, $c=1$.

## Explicit Inversion

Let $T_{1}$ be the length of the longest geodesic in $\left(\bar{\Omega}, c^{-2} d x^{2}\right)$.

## Theorem (Stefanov-Y., 2015)

Let $\left(\Omega, c^{-2} e\right)$ be non-trapping, strictly convex, and let $T>T_{1}$.
Let $\Omega_{0} \Subset \Omega$. Then $\mathcal{A}_{0} \Lambda=I d-\mathcal{K}_{0}$ on $H_{D}\left(\Omega_{0}\right)$, where $\left\|\mathcal{K}_{0}\right\|_{\mathcal{L}\left(H_{D}\left(\Omega_{0}\right)\right)}<1$. In particular, Id $-\mathcal{K}_{0}$ is invertible on $H_{D}\left(\Omega_{0}\right)$, and the inverse problem has an explicit solution of the form

$$
f=\sum_{m=0}^{\infty} \mathcal{K}_{0}^{m} \mathcal{A}_{0} h, \quad h:=\Lambda f
$$

## Neumann series inversion



Figure: Full data Neumann series inversion, 10 terms, $T=5$, on the square $[-1,1]^{2}$, variable $c=1+0.3 \sin \left(\pi x^{1}\right)+0.2 \cos \left(\pi x^{2}\right)$.
The artifacts are mainly due to the presence of corners. The $L^{2}$ error on the left is $0.44 \%$; and on the right: $0.34 \%$. The $L^{\infty}$ error on the left is about $1.2 \%$; and about $3 \%$ on the right.

## Partial data

Assume the speed $c(x)$ is variable and known in $\Omega$. For $T>0$, let $u$ solve the problem

$$
\left\{\begin{aligned}
\left(\partial_{t}^{2}-c^{2}(x) \Delta\right) u & =0 \\
\left.u\right|_{t=0} & =f \\
\left.\partial_{t} u\right|_{t=0} & =0 \\
\left.\partial_{\nu} u\right|_{(0, T) \times \partial \Omega} & =0 .
\end{aligned}\right.
$$

Partial Data Measurement: $\Lambda f:=\left.u\right|_{[0, T] \times \Gamma}$ where $\Gamma$ is an open subset of $\partial \Omega$.

Inverse Problem: recover $f$ from $\Lambda f$.

## Partial data: uniqueness

Uniqueness: follows from unique continuation. Let

$$
T_{0}:=\max _{\bar{\Omega}} \operatorname{dist}(x, \Gamma)
$$

## Theorem (Uniqueness)

$\Lambda f=0$ for some $f \in H_{D}(\Omega)$ implies $f(x)=0$ for $\operatorname{dist}(x, \Gamma)<T$. In particular, if $T \geq T_{0}$, then $f=0$.

## Partial data: stability

Stability: follows from boundary control by Bardos-Lebeau-Rauch.

## Theorem (Stability)

If each broken geodesic $\gamma(t)$ hits $\Gamma$ for $|t| \leq T \Longrightarrow$ stability. If some does not hit $\bar{\Gamma} \Longrightarrow$ no stability.


Figure: Bardos-Lebeau-Rauch condition: Left: unstable. Right: stable

## Partial data: smooth wave speed reconstruction



Figure: Partial data inversion with data on the indicated part of $\partial \Omega$. Neumann series inversion with 10 terms, $T=5, \Omega=[-1,1]^{2}$. Left: constant speed $c=1, L^{2}$ error $=0.7 \%$. Right: variable speed $c=1+0.3 \sin \left(\pi x^{1}\right)+0.2 \cos \left(\pi x^{2}\right), L^{2}$ error $=2 \%$. Again, the most visible artifacts can be explained by the presence of corners.

## Partial data: discontinous speed

It works well with the following discontinuous speed AND partial data.


## Partial data: discontinuous speed, Iteration =



## Partial data: discontinuous speed, Iteration =



## Partial data: discontinuous speed, Iteration =



## Partial data: discontinuous speed, Iteration =



## Partial data: discontinuous speed, Iteration =



## Partial data: discontinuous speed, Iteration $=$



## Partial data: discontinuous speed, Iteration $=$



## Partial data: discontinuous speed, Iteration $=$



## Partial data: discontinuous speed, Iteration $=$



## Partial data: discontinuous speed, Iteration $=$




