

**New Mathematics and Algorithms
for 3-D Image Analysis
IMA, January 9-12, 2006**

On mathematics of
thermoacoustic imaging

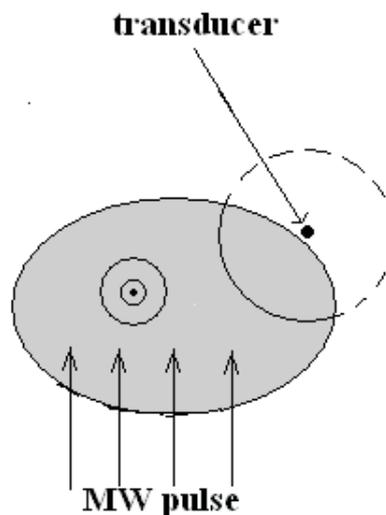
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An outline

1. Thermoacoustic Tomography (TAT or TCT)
2. Mathematics of TAT - circular (spherical) Radon transform
3. Uniqueness of reconstruction
4. Partial data: visible and invisible singularities.
5. Reconstruction: formulas and examples
6. Range conditions
7. Some open problems

1. Thermoacoustic Tomography (TAT or TCT) and its sibling photo-acoustic Tomography (PAT)



The integrals of the MW energy absorption function $f(x)$ over circles centered at transducers' locations are measured.

In mammography, cancerous cells absorb 3 – 5 times more MW (or RF) energy than the healthy ones \Rightarrow high contrast. Also high resolution.

2. Mathematics of TAT - circular (spherical) Radon transform

Circular Radon transform of f on \mathbb{R}^d :

$$Rf(p, r) = \int_{|y-p|=r} f(y) d\sigma(y),$$

Overdetermined.

$S \subset \mathbb{R}^d$ – hypersurface, then

$$R_S f = Rf|_{p \in S}.$$

Problems:

- For what sets S is the R_S injective (i.e., f can be uniquely reconstructed from Rf)?
- If R_S is injective, what are inversion formulas?
- How stable is inversion?
- What happens if the data is incomplete?
- Range description for R_S

3. Uniqueness of reconstruction

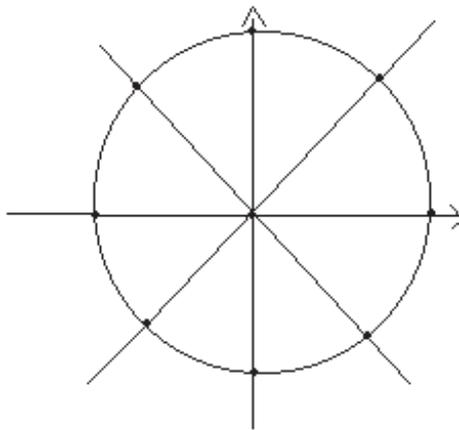
f - compactly supported on \mathbb{R}^d . When does $R_S f = 0$ imply $f = 0$? S - **uniqueness set**.

Non-uniqueness sets in \mathbb{R}^2

(Lin-Pinkus, '92, Agranovsky-Quinto, '94-'96):

I. $S =$ a straight line. $Rf = 0$ for any odd function.

II. A Coxeter system Σ_N of lines:



III. One can add any finite set of points to a non-uniqueness set (not totally trivial).

Theorem 1. (Agranovsky-Quinto, '94-'96, conjectured by Lin-Pinkus, '92)
 $S \subset \mathbb{R}^2$ is a non-uniqueness set iff

$$S \subset \omega \Sigma_N \cup \Phi,$$

Σ_N - Coxeter system of lines, ω rigid motion, Φ is finite.

Proof is based on microlocal analysis and geometry of zeros of harmonic polynomials.

What do harmonic polynomials do here?
The answer (that holds in any dimension) is:

Lemma 2. (various authors '92 – '94) Any non-uniqueness set is a set of zeros of a harmonic polynomials. In particular, any uniqueness set for harmonic polynomials (e.g., any closed hypersurface) is uniqueness set for circular Radon transform.

Relations with a variety areas of analysis - from approximation theory to PDEs, potential theory, and complex analysis. E.g.:

Theorem 3. (P. K., Agranovsky & Quinto '93) *TFAE:*

1. $S \subset \mathbb{R}^d$ is a non-uniqueness set.
2. S is a nodal set for the wave equation, i.e. there exists a compactly supported f such that the solution of the problem

$$\begin{cases} \frac{\partial^2 u}{\partial t^2} = \Delta u \\ u(0, x) = 0 \\ u_t(0, x) = f(x) \end{cases}$$

vanishes on S for any moment of time.

3. S is a nodal set for the heat equation, i.e. there exists a compactly supported f such that the solution of the problem

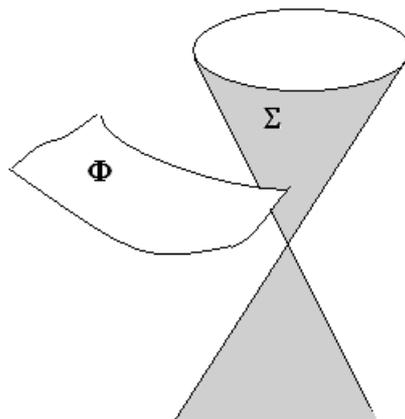
$$\begin{cases} \frac{\partial u}{\partial t} = \Delta u \\ u(0, x) = f(x) \end{cases}$$

vanishes on S for any moment of time.

Conjecture: $S \subset \mathbb{R}^d$ is a non-uniqueness set iff

$$S \subset \omega\Sigma \cup \Phi,$$

Σ - the surface of zeros of a homogeneous harmonic polynomial, ω is a rigid motion, Φ is an algebraic surface of codimension at least 2.

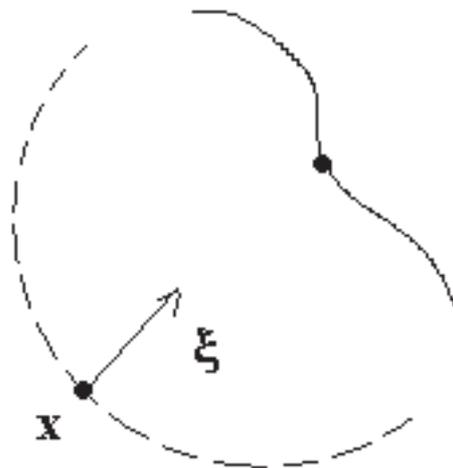


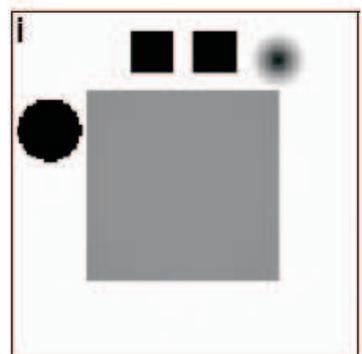
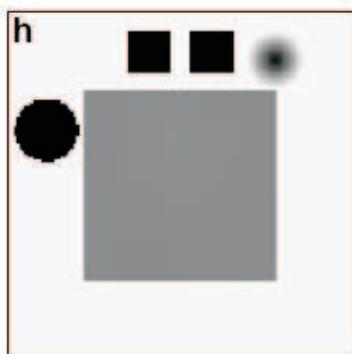
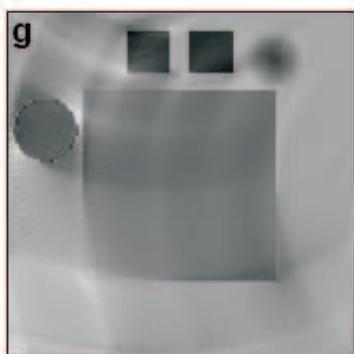
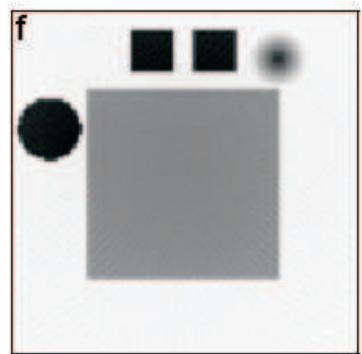
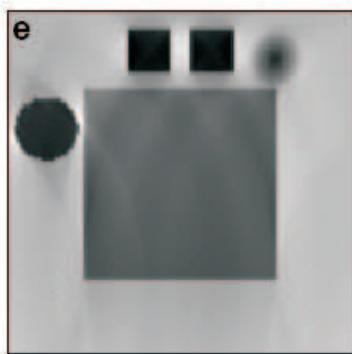
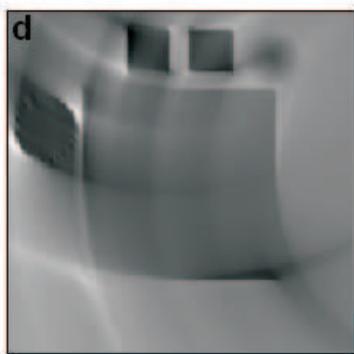
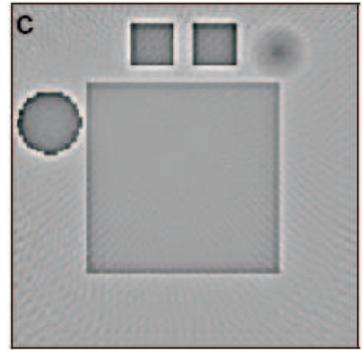
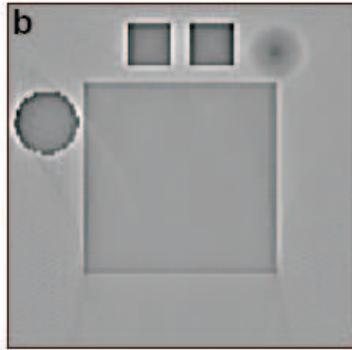
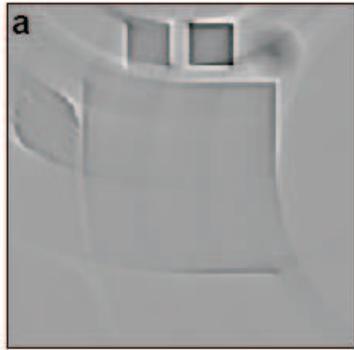
Recent progress based on the wave equation reformulation (Finch & Patch & Rakesh '04, P. K. & Ambartsoumian '05)

4. Partial data: “visible” and “invisible” singularities

Uniqueness of reconstruction does not imply practical recoverability: the reconstruction might be severely unstable.

Theorem 4. (Quinto, Louis & Quinto, Am-
bartsoumian & P. K.) A wavefront set point
 (x, ξ) of f is “stably recoverable” from $R_S f$
iff there is a circle centered on S , passing
through x , and normal to ξ at this point.

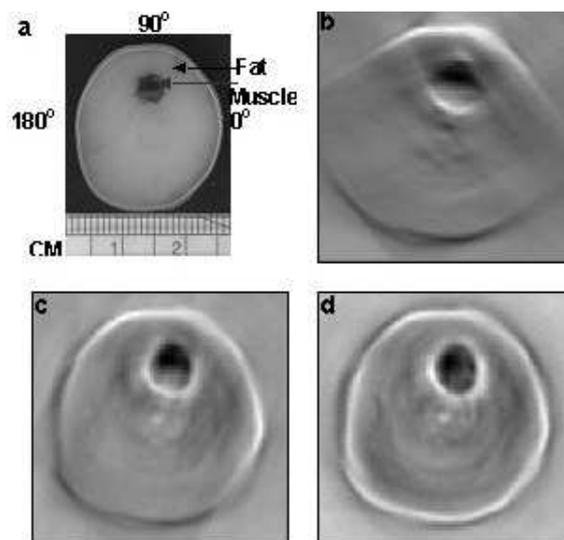




5. Reconstruction: formulas and examples

One of the most popular inversion formulas for the standard Radon transform: data $g(\omega, s)$, where the plane of integration is $x \cdot \omega = s$. Inversion consists of *filtration* by taking second s -derivative of the data and *backprojection* by averaging over all planes passing through the point x where the reconstruction is done.

Approximate inversions for the circular Radon R_S mimic this formula. The results are usually good and can be improved by iterations.



Exact inversions of R_S depend on the surface S . Formulas are known for S being a sphere, cylinder, or a plane.

For S - sphere there are inversions through special functions expansions.

Formulas analogous to standard Radon are known for S sphere in odd dimensions only, and for S plane.

One of the $3D$ formulas for $S = \text{unit sphere}$ (Finch & Patch & Rakesh '04):

$$f(\mathbf{x}) = \frac{1}{16\pi^3} \Delta_{\mathbf{x}} \left(\int_{|\mathbf{p}|=1} \frac{1}{|\mathbf{x} - \mathbf{p}|} R_{TCT} f(\mathbf{p}, |\mathbf{x} - \mathbf{p}|) d\mathbf{p} \right)$$

Implemented by G. Ambartsoumian & S. Patch ('04-'05)

6. Range conditions

Radon's range is of ∞ co-dimensions. Knowing the range is important (error correction, incomplete data completion, etc.).

For standard Radon: for any integer $k \geq 0$,

$$G_k(\omega) = \int_{-\infty}^{\infty} s^k g(\omega, s) ds$$

is a homogeneous polynomial of degree k .

S - sphere. Range conditions for R_S ? S. Patch '04 found an incomplete set of such conditions on data $g(p, r) = R_S f(p, r)$ (p - center, r - radius): for any integer $k \geq 0$,

$$G_k(\omega) = \int_0^{\infty} r^{2k} g(p, r) dr$$

is a (non-homogeneous) polynomial of degree at most k .

A complete set is found in 2D (Ambartsumian & P. K '05) and 3D (D. Finch & Rakesh)

Theorem 5. (Ambartsoumian & P. K '05)

In order for the function $g(p, r)$ on $S^1 \times \mathbb{R}$ to be representable as $R_S f$ with $f \in C_0^\infty(D)$, it is necessary and sufficient that the following conditions are satisfied:

(a) $g \in C_0^\infty(S^1 \times (0, 2))$.

(b) *For any n , the $2k$ -th moment $\int_0^\infty r^{2k} g_n(r) dr$ of the n -th Fourier coefficient of g vanishes for integers $0 \leq k < |n|$. (S. Patch's conditions)*

(c) *For any $n \in \mathbb{Z}$, function $\mathcal{H}_0\{g_n(r)/r\}(\sigma) = \int_0^\infty J_0(\sigma r) g_n(r) dr$ vanishes at any zero $\sigma \neq 0$ of Bessel function J_n .*

7. **Some open problems**

1. Inhomogeneities (variable sound speed) in TAT.
2. Uniqueness sets S for non-compactly supported functions.
3. Uniqueness sets in dimensions > 2 .
4. Backprojection type inversion formulas in even dimensions.
5. Inversion formulas for more general surfaces S .

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