



POLITECNICO DI MILANO

**PhD Course**  
**Politecnico di Milano**  
**November 14 – 18, 2016**

**Course Title**

**Discrete and Geometric Tomography**

**Professor Responsible**

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**Politecnico di Milano**

**Dipartimento di Matematica**

**“F. Brioschi”**

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**20133 Milano**

**The course will take place at the Department of Mathematics, via Bonardi, Milano (Building *NAVE*).**

**On Monday, November 14** we will meet at the ground floor at 9.00.

**Lectures are at the 3th and the 4th floor**

# Overview

## COMPUTERIZED AXIAL TOMOGRAPHY (CT)

General principles.

The Radon Transform.

Main theoretical reconstruction model.

Examples and applications.

## DISCRETE TOMOGRAPHY (DT)

Discrete models

Ghosts and switching components.

Ryser algorithm.

Algebraic approach.

Uniqueness models.

Uniqueness and additivity.

Some reconstruction algorithms

Examples and applications.

## GEOMETRIC TOMOGRAPHY (GT)

Hammer's problem.

Parallel and point X-rays

Tomography for special geometric objects.

Examples and applications

## DISCUSSIONS

Open problems

Research projects

## MAIN REFERENCES

- 1) Richard Gardner, ***Geometric Tomography***, Cambridge University Press, New York, second edition, 2006.
- 2) Gabor T. Herman and Attila Kuba Eds., ***Advances in discrete tomography and its applications***, Applied and Numerical Harmonic Analysis. *Birkhäuser Boston, Inc., Boston, MA*, 2007.

Further references will be given during the course, and cited papers will be supplied to all interested students

## REFERENCE PAPERS

- [1] S. van Aert, K.J. Batenburg, M.D. Rossell, R. Erni, and G. vanTendeloo, *Three-dimensional atomic imaging of crystalline nanoparticles*, *Nature*, 470, (2011), pp. 374-377.
- [2] A. Alpers and S. Brunetti, *Stability results for the reconstruction of binary pictures from two projections*, *Image and Vision Computing* 25, (2007), pp. 1599-608.
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- [12] Brunetti S., Dulio P., Peri C., *Discrete tomography determination of bounded sets in  $Z^n$* , *Discrete Applied Mathematics*, 183 (11), (2015), 20-30
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- [16] Dulio P., Frosini A., Pagani S., *A geometrical characterization of regions of uniqueness and applications to discrete tomography*, *Inverse Problems*, 31(12), (2015), pp. 125011
- [17] Dulio P.- Peri C., *Discrete Tomography and Plane Partitions*, *Advances in Applied Mathematics*, 50 (3), (2013), 390-408.
- [18] Dulio P.- Peri C., *Discrete tomography for inscribable lattice sets*, *Discrete Applied Mathematics*, 161 (13-14) (2013), 1959-1974.
- [19] Dulio P. *Convex decomposition of U-polygons*, *Theoretical Computer Science*, 406/1-2, (2008), 80-89
- [20] Dulio P.- Peri C., *On the geometric structure of lattice U-polygons*, *Discrete Math.*, 307/19-20 (2007), 2330-2340

- [21] Dulio P.- Gardner R.J.- Peri C., *Discrete point X-rays*, SIAM J. Discrete Math. 20, no. 1 (2006), 171-188.
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Further references will be given during the course, and a few cited papers will be supplied.

## PROGRAM

### **Monday, 14 Morning 9:15-13:15**

*Overview of the Course. A brief history of CAT. Qualitative description of the Radon transform and its inversion for X-ray image reconstruction. Applications and related problems. The origin of Geometric Tomography and of Discrete Tomography. Continuous and discrete parallel X-rays. Continuous and discrete point X-rays. Remarks and examples.*

**Afternoon 2:30-4:30 Discussion and exercise section.**

### **Tuesday, 15 Morning 9:15-13:15**

*Projections of lattice sets with discrete parallel X-rays. The reconstruction problem in Discrete Tomography. Linear Systems and Singular Value Decomposition. Ryser algorithm. Bad configurations, weakly bad configurations, switching components, ghosts. Ridge functions and additivity.*

**Afternoon 2:30-4:30 Discussion and exercise section.**

### **Wednesday, 16 Morning 9:15-13:15**

*Algebraic approach in a finite grid and characterization of switching components. Uniqueness models in discrete tomography. Uniqueness and additivity. Reconstruction with suitable sets of four directions. Characterization of region of interests in a finite lattice grid. Remarks on applications and examples.*

**Afternoon 2:30-4:30 Discussion and exercise section.**

**Thursday, 17 Morning 9:15-13:15**

*Geometric Tomography, Hammer's problem and related uniqueness problems. Mid-point construction. U-polygons and their properties. The theorem of Gardner-McMullen in the Euclidean plane. The results of Gardner and Gritzmann in the integer lattice. Projections of convex bodies with point X-rays. The theorem of Volcic in the Euclidean plane. P-polygons. Some results and examples in the lattice.*

**Afternoon 2:30-4:30 Discussion and exercise section.**

**Friday, 18 Morning 9:15-12:15** *Survey on the presented results, deepening, comments and supplementary material.*

**Afternoon 2:30-4:30 Discussion, open problems and possible research projects**

## **PROGRAM OF THE COURSE**

Overview of the Course. A brief history of CAT. The Radon transform and its inversion for X-ray image reconstruction. Applications and related problems. Discretization of the reconstruction process. The Matlab "radon" and "iradon" functions. Examples and applications. Reconstruction from a limited number of projections. The problem of ghosts.

The origin of Geometric Tomography and of Discrete Tomography. Continuous and discrete parallel X-rays. Continuous and discrete point X-rays. Remarks and examples.

Projections of lattice sets with discrete parallel X-rays. Description of the main models for discrete tomography. Algebraic approach. The reconstruction problem in the grid model as a linear system of equations. Some remarks on Singular Value Decomposition and on stability of solutions.

Binary Tomography. Bad configurations, weakly bad configurations, switching components, ghosts. Ryser algorithm and a few extensions. Examples of binary reconstruction and characterization of the solutions. Ridge functions and additivity.

Algebraic approach in a finite lattice grid and polynomial characterization of switching components. Uniqueness models in discrete tomography. Uniqueness and additivity. Reconstruction with suitable sets of four directions. Characterization of regions of interest in a finite lattice grid. Remarks on possible applications and examples.

Geometric Tomography, Hammer's problem and related uniqueness problems. Mid-point construction. U-polygons and their properties. The theorem of Gardner-McMullen in the Euclidean plane. The results of Gardner and Gritzmann in the integer lattice. Projections of convex bodies with point X-rays. The theorem of Volcic in the Euclidean plane. P-polygons. Some results and examples in the lattice.

### **EXPECTED RESULTS**

The aim of the course is to provide an introduction to Discrete and Geometric Tomography, and to some related research problems. Moving from Computerized Axial Tomography, the focus is naturally turned on the discretization process. Students are expected to learn the main theorems, and the usual approaches to the reconstruction problem from a finite number of projection.

For evaluation, students can choose one of the following options

- Reading one of the research papers cited during the course, and reporting on the corresponding results. Answering possible related questions from the teacher.
- Writing a Matlab code concerning a discussed reconstruction problem. Running the code on different phantom images and producing the corresponding reconstructions.
- Presenting and discussing a possible research project concerning Discrete Tomography. The project should be based on some preliminary result or conjecture.
- Answering questions concerning the topics treated during the course. Detailed proofs of the presented theorems are required