



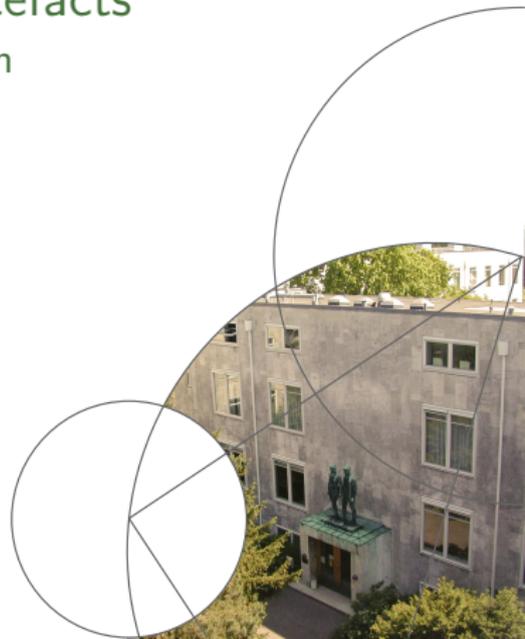
Faculty of Science



# Characterizing and reducing artefacts - caused by varying projection truncation

Leise Borg

September 14, 2016  
Slide 1/42



# Outline

1 Background

2 Analysis

3 Results

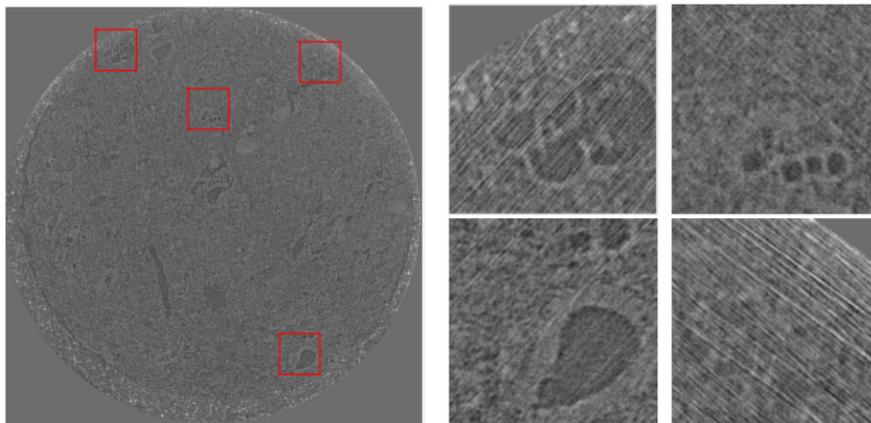
4 Discussion

5 Future work

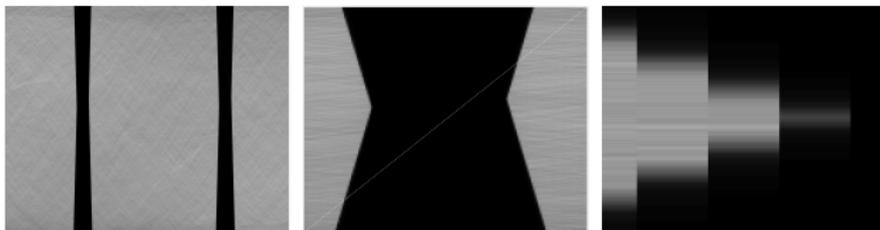
# Introduction

- Porous chalk samples of size  $\sim 1 - 2$  mm.
- Monochromatic, parallel X-ray beam
- Micro-CT

# Vendor reconstruction (a type of FBP)



# Transmission sinogram



**Figure:** *Transmission sinogram,  $T \in [0, 0.53]$ , and two zooms*

$$T = \frac{l}{l_0}$$

Fraction of photons reaching the detector.

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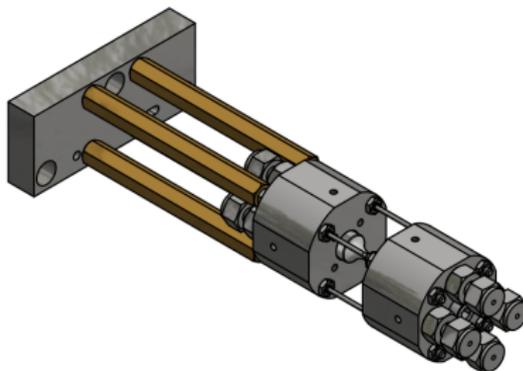
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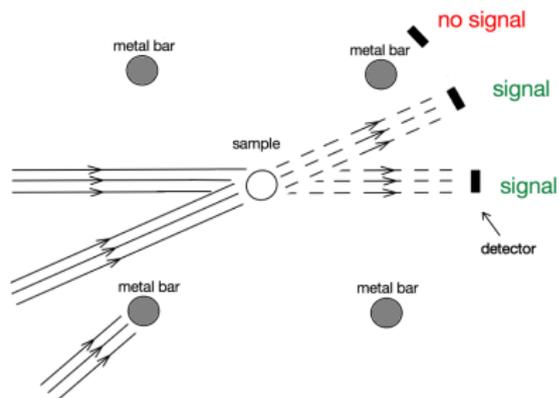
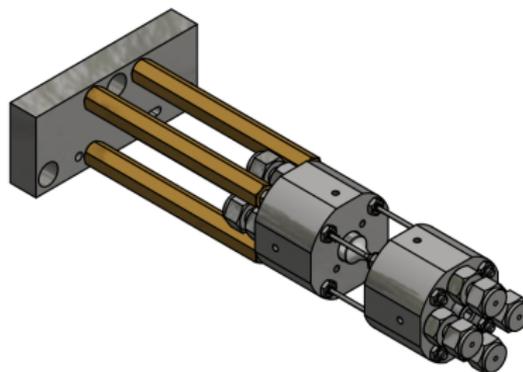
## Experimental set-up



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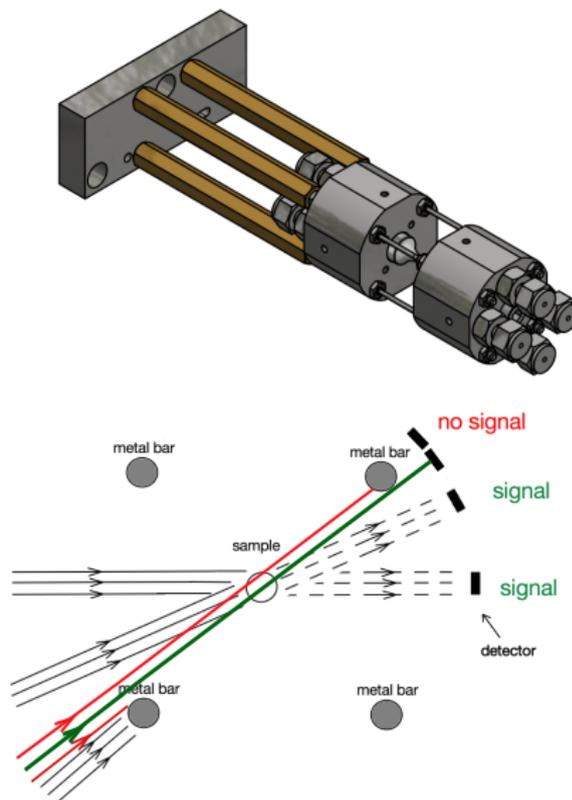
## Experimental set-up



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## Transmission vs. regular sinogram

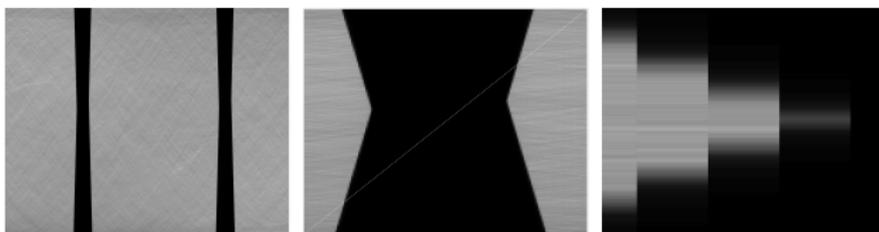


Figure: *Transmission sinogram*,  $T \in [0, 0.53]$

- Physical interpretation of the smooth transitions
- Relation between transmission sinogram ( $T$ ) and regular sinogram ( $S$ ):

$$S = -\log(T) = -\log\left(\frac{I}{I_0}\right)$$

## Introduction of a threshold



Figure: *Regular sinogram*,  $S \in [0, 1.43]$

- Physical interpretation of the smooth transitions
- Relation between transmission sinogram ( $T$ ) and regular sinogram ( $S$ ):

$$S = \begin{cases} 0 & \text{if } -\log(T) > 1.43, \\ -\log(T) & \text{otherwise} \end{cases}$$

# Introduction of a threshold

Some of the data we don't consider as being trustworthy due to scattering effects and some penetration of the metal bar. In the sinogram ( $S$ ) there are now zeros where data is missing. This is also the case for standard LA-problems, such as in mammography. This is not considered a problem since back-projecting zeros adds nothing to the reconstruction.

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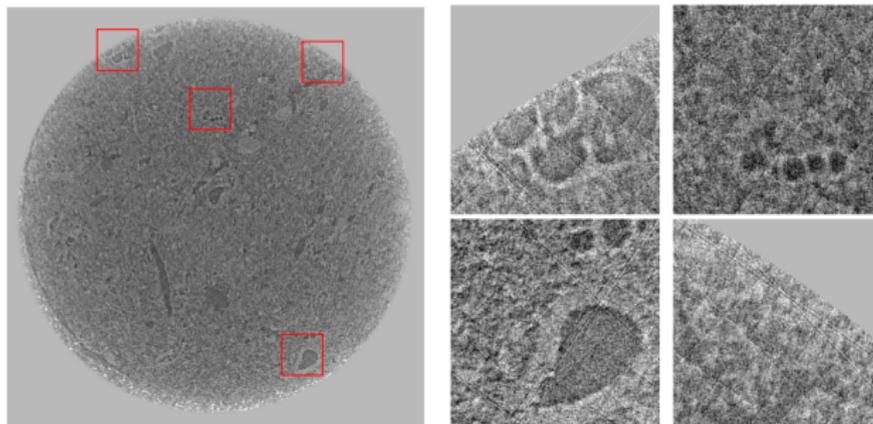
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# Our reconstruction calculated by FBP



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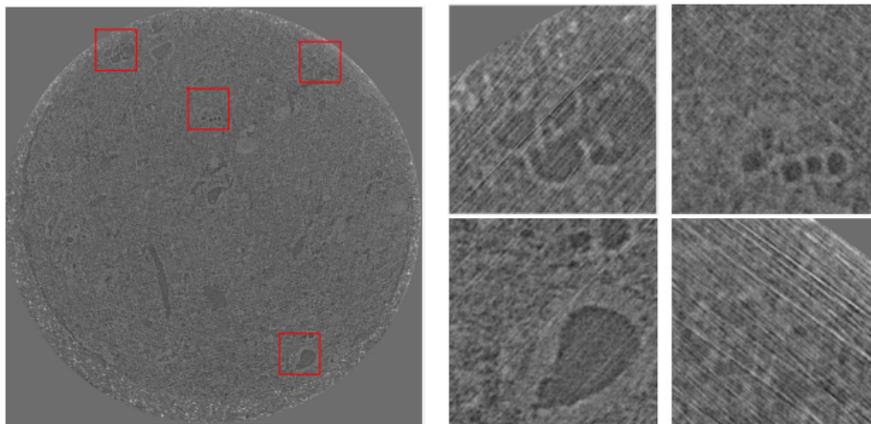
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# Vendor reconstruction



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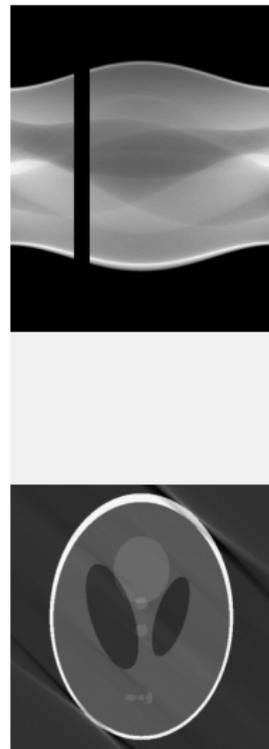
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But where do the streaks  
come from?

# Micro-local analysis<sup>1</sup>

## Singularities:

- are density jumps
- can be described by the tuple,  $(x, \xi)$ , where  $x$  is the singular position and  $\xi$  is the singular direction (normal to the edge).
- We can only expect to reconstruct singularities  $(x, \xi)$ , where  $\xi \in \phi$  ( $\phi$  is the angular range where data has been recorded)

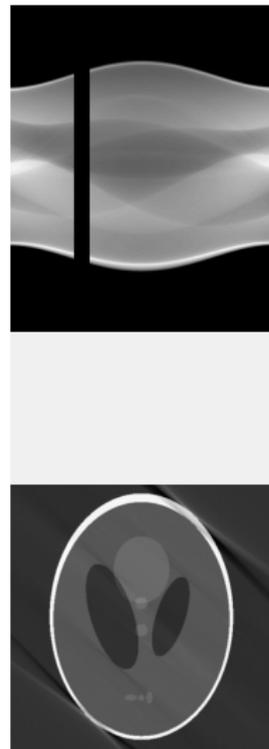


<sup>1</sup>Frikel, J and Quinto, E, T. "Characterization and reduction of artifacts in limited angle tomography", *Inverse Problems* (2013)

# Micro-local analysis<sup>1</sup>

## Streaks:

- are caused by the limited-angle cut-offs in the sinogram
- emerge only from edges in the image
- have an angle perpendicular to cut-off angles in the sinogram
- *can be reduced by smoothing the limited-angle cut-offs in the sinogram*



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<sup>1</sup>Frikel, J and Quinto, E, T. "Characterization and reduction of artifacts in limited angle tomography", *Inverse Problems* (2013)

# Micro-local analysis - applied

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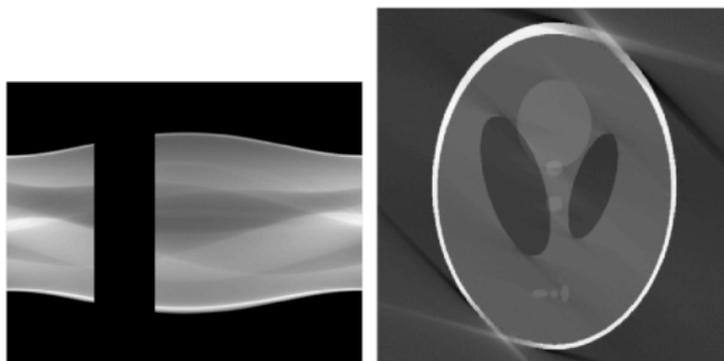
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# Micro-local analysis - applied

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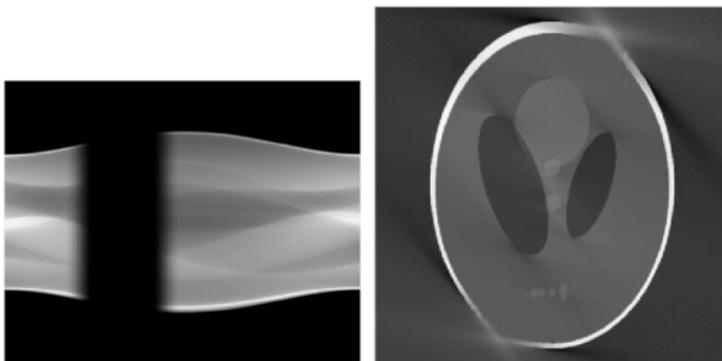
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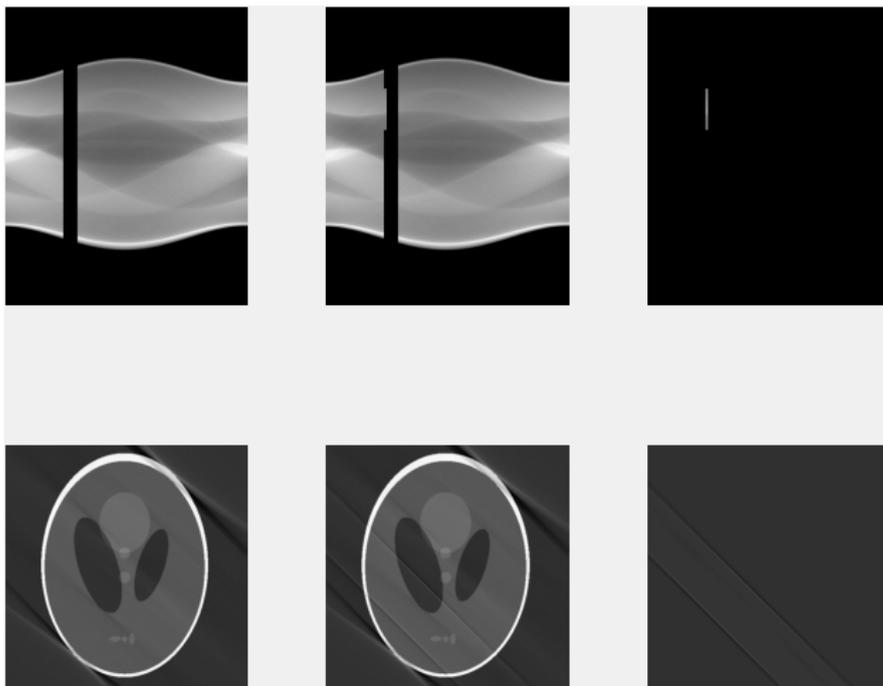
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## Where do the streaks come from?



# Probable solutions

- Micro-local analysis: Sinogram smoothing in the *angular direction*.
- Each of the tips have singularities in the detector direction: Sinogram smoothing in the *detector direction*.

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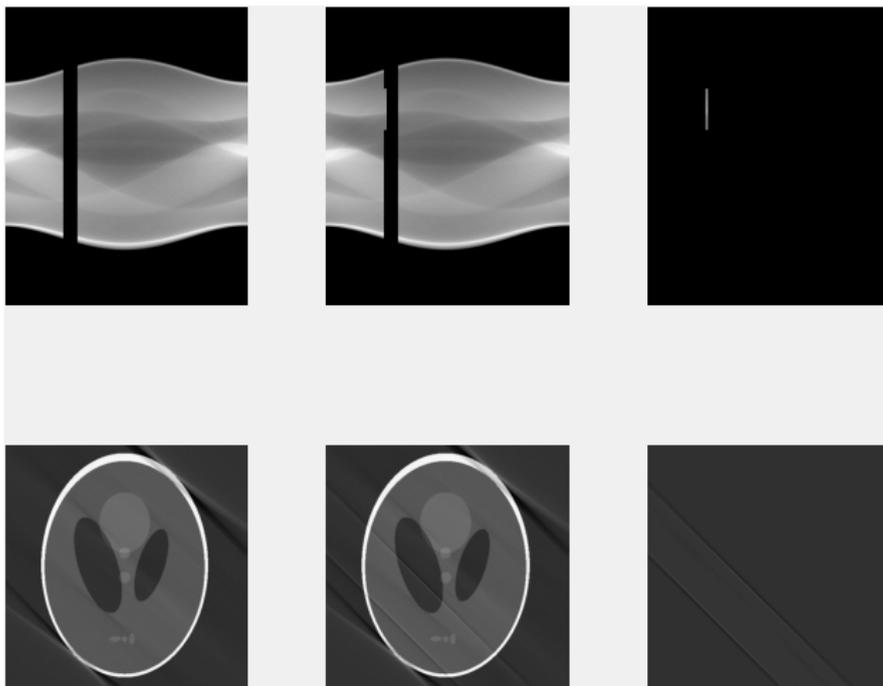
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## Smoothing - before



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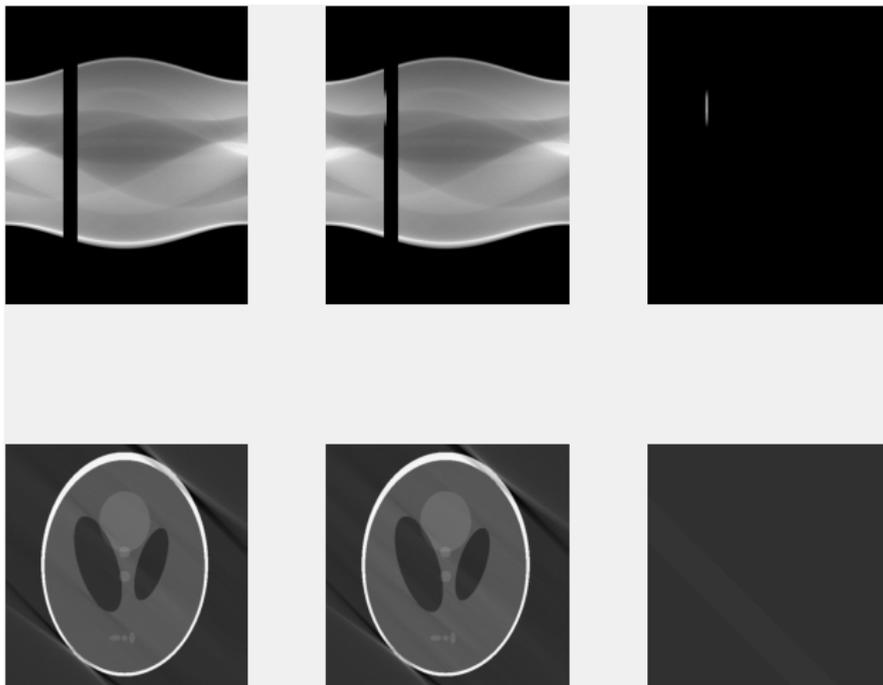
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## Smoothing - after



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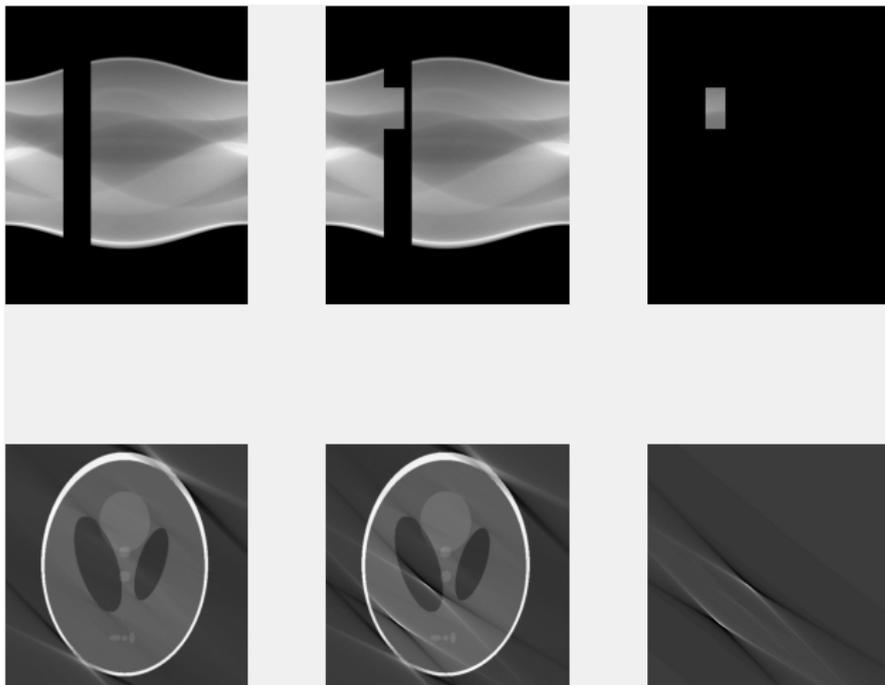
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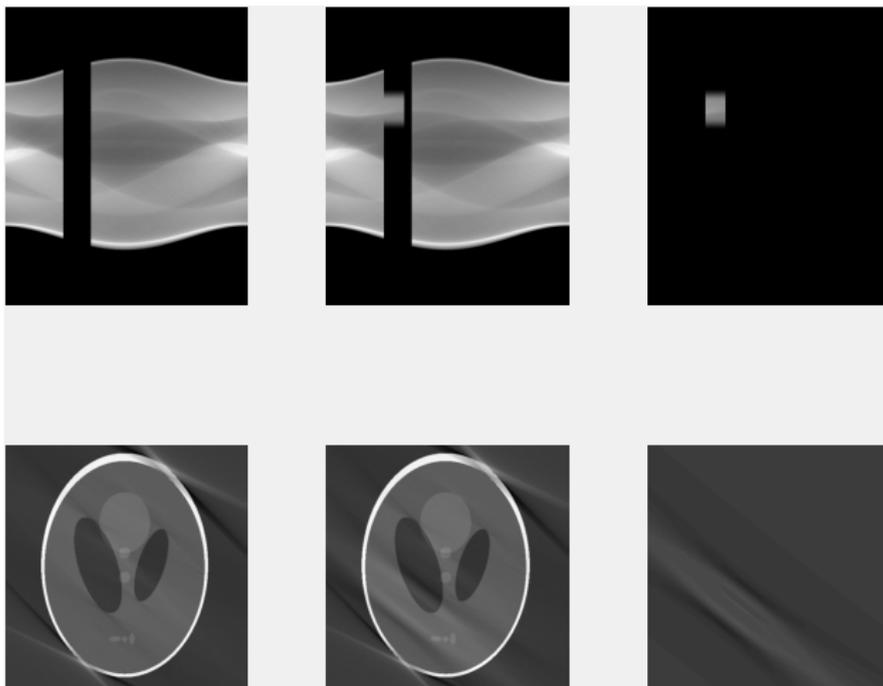
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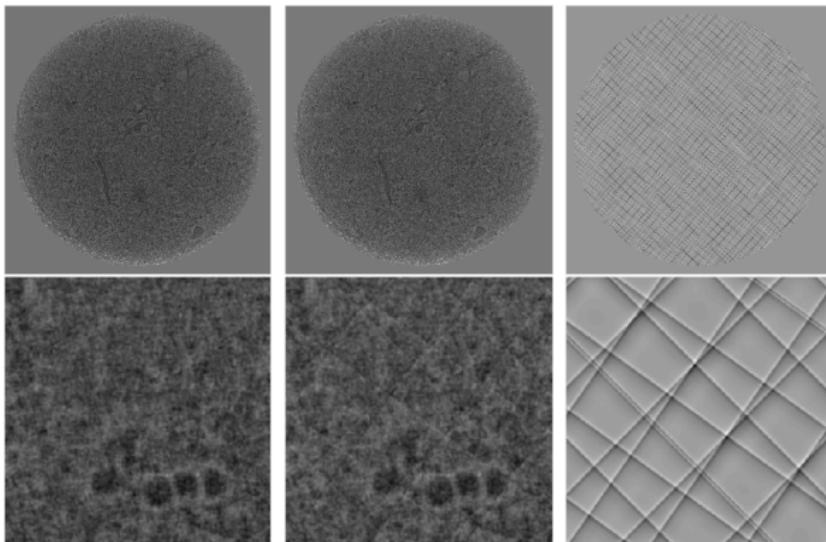
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## Smoothed vs. unsmoothed



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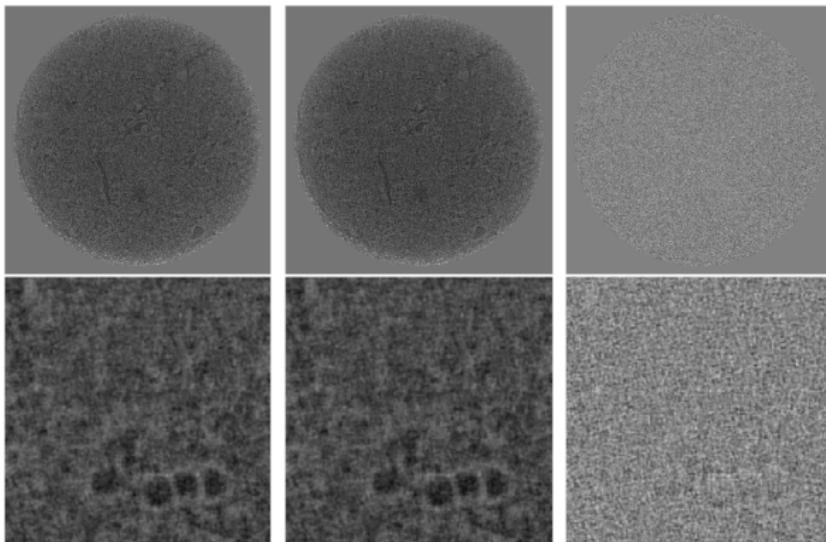
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## Smoothed vs. standard LA



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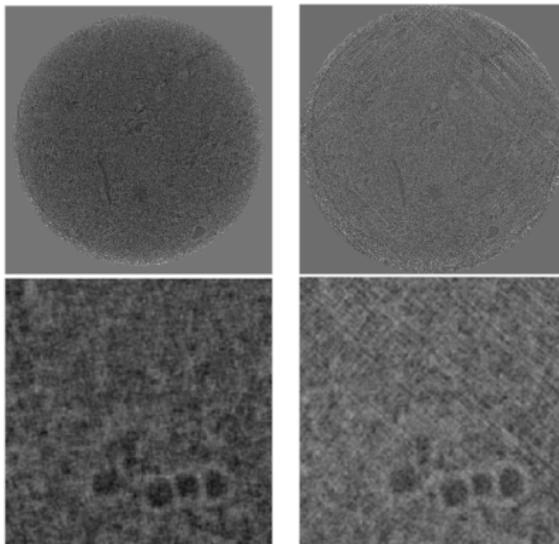
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## Smoothed vs. vendor



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# Discussion

Smoothing in detector direction:

- Removes streak artefacts
- Does not handle overexposure in the parts of the image where extra data is present

# Comparison between FBP and Cimmino

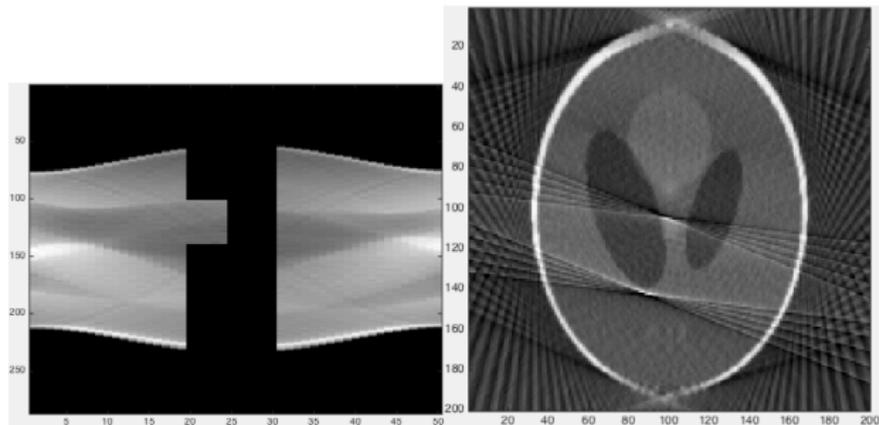


Figure: FBP reconstruction.

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## Comparison between FBP and Cimmino

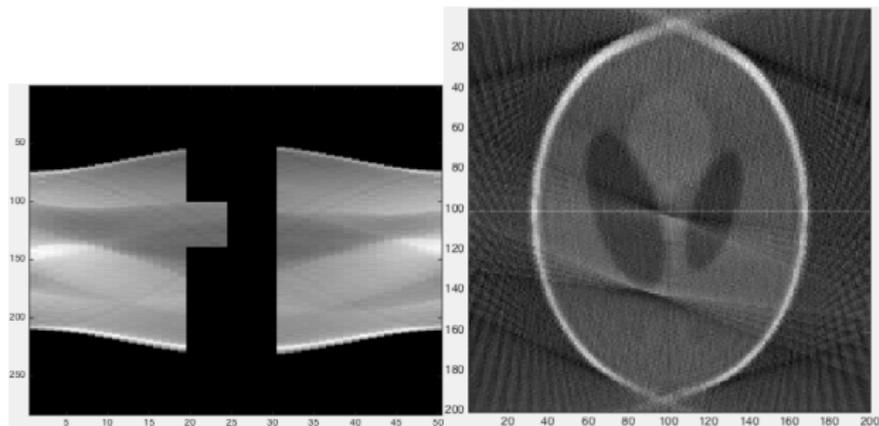


Figure: Cimmino. Zeros in sinogram.

# Comparison between FBP and Cimmino

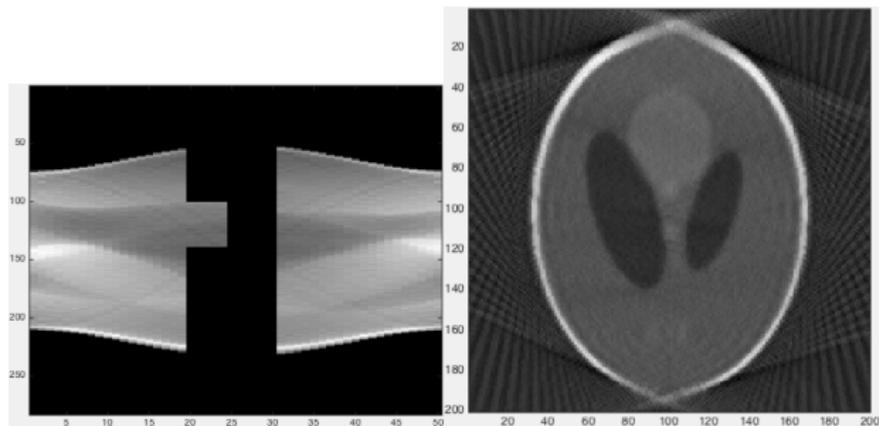


Figure: Cimmino. Rows removed.

# Comparison between FBP and Cimmino

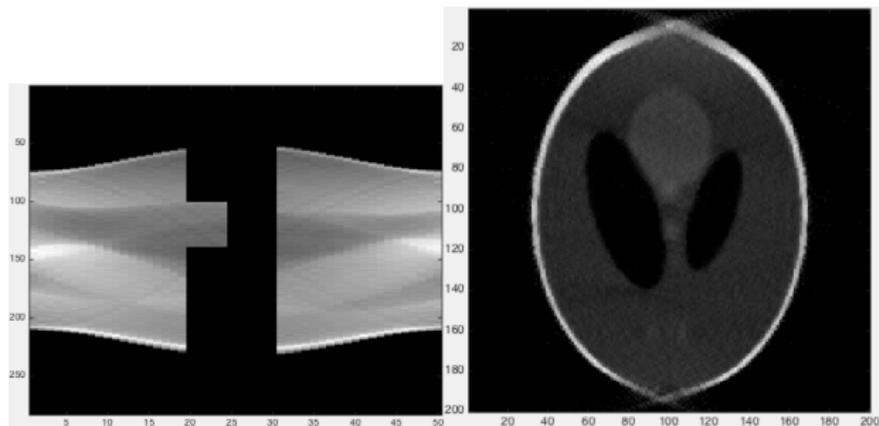


Figure: Cimmino. Rows removed, nonneg. constr.

# Comparison between FBP and Cimmino

- Overexposure is handled by the algebraic method.
- Zeros in a sinogram do not represent missing data. This is not an issue in standard limited-angle problems. But for the special limited-angle problem, it is.
- However, time and space matters.

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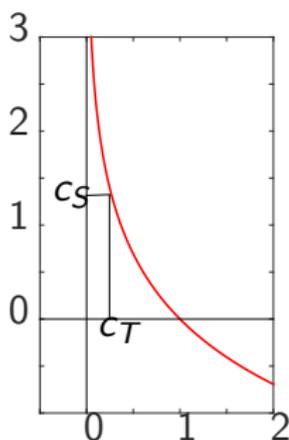
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## What we did:

Mapping of values above threshold  $c_S$  (below  $c_T$ ):

- Zeros do not represent missing data
- Removed the inherent (wanted!) smoothness

$$S = \begin{cases} 0 & \text{if } -\log(T) > c_S, \\ -\log(T) & \text{otherwise} \end{cases}$$



## So let's take a step back:

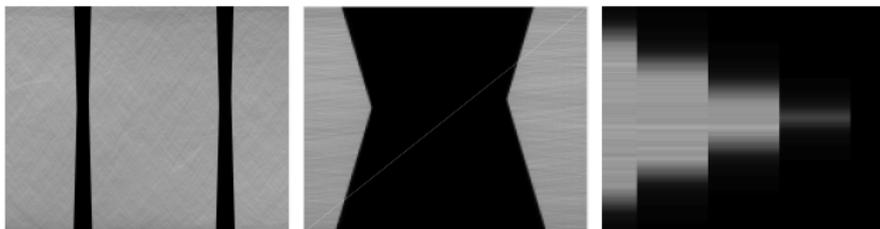
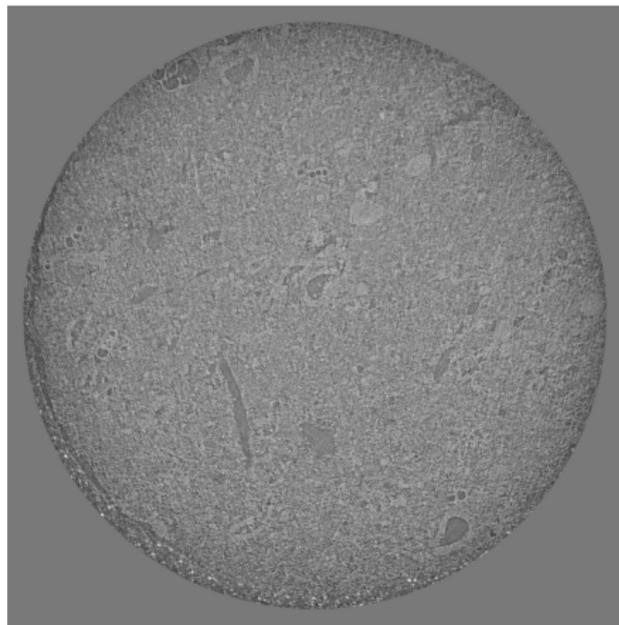


Figure: *Transmission sinogram*,  $T \in [0, 0.53]$

First order Taylor of  $-\log$  around 1:

$$-\log(x) \sim 1 - x$$

## Preliminary results: Taylor expansion



**Figure:** First order Taylor of  $-\log$  around 1 (leaving out the constant terms):  $-\log(x) \sim 1 - x \rightarrow -x$

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*Thanks for listening :)*

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# Taylor expansion

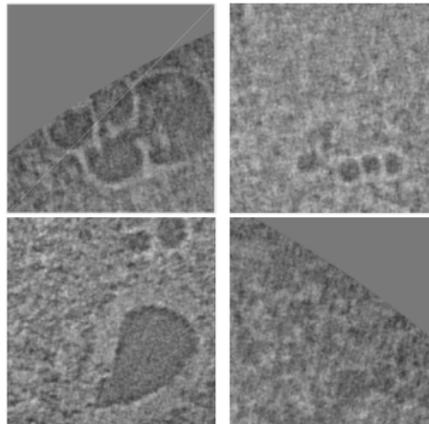
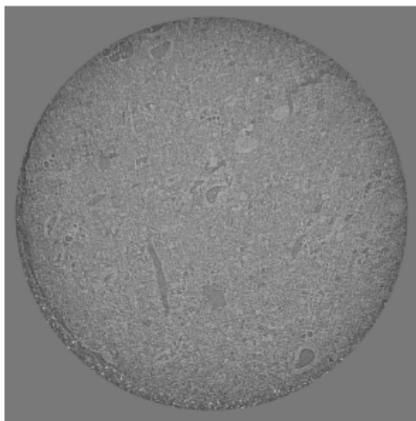
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