

# IMPROVING FDK RECONSTRUCTIONS BY DATA-DEPENDENT FILTERING

Real time tomography project

Rien Lagerwerf, Holger Kohr, Willem Jan Palenstijn & Joost Batenburg. Scientific meeting, April 6, 2018

Computational Imaging Centrum voor Wiskunde en Informatica, Amsterdam

## CT SCAN

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## SCANNING PROCESS



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- Few projection angles

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- many projection angles
- low noise

# ALGEBRAIC FILTER FDK METHOD

# Consider the inverse problem:

$$\mathcal{D}f = g,$$

where

- *D*, the linear 3D cone-beam transform, or forward projection,
- $\cdot$  g, the measured data,
- $\cdot$  f, the unknown object.

# FDK reconstruction:

$$f_{FDK} = \mathbb{F}_h(g) = \mathcal{D}^*(\tilde{g} * h)_{1D},$$

with

- $\cdot \ \mathcal{D}^*$  , the adjoint of  $\mathcal{D}$  , or the backprojection,
- $\cdot$   $\tilde{g}$  , a weighted version of the data g
- $\cdot$  (g \* h)<sub>1D</sub>, a one dimensional convolution,
- $\cdot$  h, a one dimensional filter.

Fix the data and compute the data-dependent<sup>1</sup> filter:

$$\hat{\mathbf{h}} = \underset{\mathbf{h}}{\operatorname{argmin}} \left\| \mathcal{D} \mathbb{F}_{g} \mathbf{h} - \mathbf{g} \right\|_{2}^{2} + \lambda \left\| \mathsf{T} \mathbf{h} \right\|_{2}^{2},$$

with

- $\cdot\,$  Fgh, FDK reconstruction on fixed data g, with filter h,
- $\cdot\,$  T, the Tikhonov operator that imposes the type of regularization,
- $\cdot$   $\lambda$ , the regularization parameter.

<sup>&</sup>lt;sup>1</sup>Similar strategy as [D.M. Pelt, 2014] for 2D FBP.

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LS-FDK: Setting, T = 0, gives the least squares problem, i.e.

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T-FDK:

Setting T = Id, gives the original Tikhonov, i.e.

$$\hat{\mathbf{h}} = \underset{\mathbf{h}}{\operatorname{argmin}} \|\mathbf{D}\mathbb{F}_{\mathbf{g}}\mathbf{h} - \mathbf{g}\|_{2}^{2} + \lambda \|\mathbf{h}\|_{2}^{2}.$$



#### SIMULATED DATA



Figure: Simulated data phantoms.

#### VARYING NUMBER OF PROJECTION ANGLES



Figure: Results for Shepp-Logan phantom.

#### VARYING NOISE LEVELS



Figure: Results for cluttered sphere phantom.

#### **RECONSTRUCTIONS NOISY DATA**



Figure: Cluttered sphere phantom, 360 equidistant projection angles,  $I_0 = 256$ .

High-dose scan: 70 keV, 45 W, 500 ms per projection.

Low-dose scan: 70 keV, 20 W, 100 ms per projection.



Figure: Scanned objects

Gold standard reconstruction: SIRT-300, high-dose data, 500 equidistant projection angles

#### FDK-HN VS T-FDK



Figure: Low-dose, 500 equidistant projection angles.

## Compute an algebraic filter

 $h_{\text{Pom1}}$ 



## Use algebraic filter to reconstruct

$$f_{Pom1 filter} = \mathbb{F}_g(h_{Pom1})$$



#### FDK-HN VS POM1-FILTER



Figure: Low-dose apple, 500 equidistant projection angles.

# SUMMARY AND CONCLUSION

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Paper in preparation:

M.J. Lagerwerf et al., "Improving FDK reconstructions by data-dependent filtering", 2018.



- Joost Batenburg
- · Sophia Bethany Coban
- · Holger Kohr
- · Willem Jan Palenstijn