



Ring artifact removal method using GPU-based FDK reconstruction for cone beam CT Zsolt Adam Balogh

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# Computed Tomography Mediso AnyScan AnyScan Ζ $\Theta = 0$ Θ V[N-1,N-1,M-1] S $\mathbf{S}_{\mathrm{M}}$ х у V[0,0,0] Ζ

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# Ring artifacts in the sinogram

# Defective and mis-calibrated detector cells may cause artifacts in sinogram:





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# Ring artifacts

# After the reconstruction process rings appear in the image domain:





# **Ring artifacts**

#### **Classification of ring artifact correction methods**

- Image-space methods
  - Reconstruct image and remove rings in image space.
- Fourier-space methods
  - Apply low pass filter in fourier space (during the FDK reconstruction process)
- Sinogram-space methods
  - Find defective pixels and correct in sinogram space.



# Ring artifacts in image space

- Ring correction in polar coordinate (RCP)
  - Using polar coordinate transformation
- Ring correction using homogenity test (RCHT)



Original RCHT RCP



# Ring artifacts in image space

# The image based corrections use polar coordinate transformation







#### **Reconstruction process**

#### The filtered back projection in 2D:

Let  $f : \mathbb{R}^2 \to \mathbb{R}$  be the original volume to be reconstructed.

The Lambert-Beers law determines the transmitted x-ray intensity I after traversing the volume f along a line L:

$$I = I_0 \cdot e^{-\int_{L_{\underline{x}}} f(\underline{x}) d\underline{x}},$$

where  $I_0$  is the known intenity of the radiation emitted at source. We get the sinogram which contains of the projections:

$$p(\theta, r) = \int_{L_{r,\theta}} f(r \cdot \cos \theta - s \cdot \sin \theta, r \cdot \sin \theta + s \cdot \cos \theta) ds$$



#### **Reconstruction process**

#### The filtered back projection in 2D:





#### **Reconstruction process**

# The filtered back projection in 2D:

From the projections we get the original volume to invert the Radon transformation:

 $f(x, y) = R^{-1}\{p(\theta, r)\}$ 

#### The projection theorem:

Let  $P(k,\theta)$  be the 1D Fourier transformation of the projections

$$P(k,\theta) = \int_{-\infty}^{\infty} p(\theta,r) \cdot e^{-2\pi i k r} dr$$

and let F(u,v) be the 2D Fourier transformation of f(x,y)

$$F(u,v) = \int_{-\infty}^{\infty} \int_{-\infty}^{\infty} f(x,y) \cdot e^{-2\pi i (xu+yv)} dxdy$$

Then  $P(k, \theta) = F(k \cos \theta, k \sin \theta)$ 



# Ring artifacts in fourier space

The Filtered Back projection uses Fourier transformation.

During the Fourier transformation we can use different filters and ring correction methods:

- Wavelet-Fourier (WF)
  - Apply low pass filter in Fourier space.
- Modified wavelet-plus-normalization (MWPN)



# Ring artifacts in sinogram space

- Improved sinogram based deringing algorithm (ISDR)
- Ring detection with morphological operators (IMF)
- Median filtering algorithm (MedF)
- Median Filtering with Sum of Curve calculation (MSC)
- Iterative center weighted median filtering (ICWMF)



# Deringing methods in sinogram space

ISDR selects defective cells into three sets:

- Damaged cells (pixel value independent of neighboring data)
- Time independent mis-calibrated cells (fixed offset error)
- Time dependent mis-calibrated cells, (variable offset error)

IMF method uses mathematical morphological filters in three steps:

- IRE for remove intense rings.
- LRE for smoothing the mean cure.
- BRE for band ring elimination.



# Deringing methods in sinogram space MSC algorithm



Pt - projections

FFT – Fast Fourier Transform

M – Median filter



# Deringing methods in sinogram space

#### Our proposed algorithm



- L Local difference function
- En Erosion n times
- Dm Dilatation m times

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# Deringing methods in sinogram space Comparison of original and MSC images



original





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# Deringing methods in sinogram space

#### Comparison of original and our proposed algorithm



#### original

#### Our proposed algorithm



# CUDA (Compute Unified Device Architecture)

A parallel computing platform and programming model invented by NVIDIA. It increases in computing performance by exploiting the power of the graphics processing unit (GPU).

#### Hardware

Kepler microarchitecture GeForce GTX TITAN Black

- compute capacity 3.5,
- memory 6 GB,
- CUDA cores 2688



# **Using CUDA memory and texture**

Store projections and reconstructed image in CUDA device memory:

cudaArray<float> projections;

Use texture to faster data access

texture<float, cudaTextureType3D> t\_Projections;

Texture initialization:

t\_Projections.addressMode[0] = cudaAddressModeClamp;

- t\_Projections.addressMode[1] = cudaAddressModeClamp;
- t\_Projections.filterMode = cudaFilterModePoint;
- t\_Projections.normalized = false;



#### **Texture usage**

Set cudaArray pointer cudaArray\* deviceArrayPtr = projections->getArrayPtr();

Bind texture cudaBindTextureToArray( &t\_Projections, deviceArrayPtr, &m\_ChannelDesc );

Texture reference in kernel float value = (float)tex3D(t\_Projections, (float)x, (float)y, (int)z );

Unbind texture cudaUnbindTexture( t\_Projections );

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#### **Speed comparison**

#### Reconstruction of image with 1452 slices

Mode	Reconstruction time (sec)
Using texture	136.140972
Without texture	152.141553

Reason:

Border check is needed in the kernel without texture mode.



# Thank you for your attention!



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