# **High Resolution Iterative CT Reconstruction** using Graphics Hardware







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### **Motivation**



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- Iterative reconstruction methods can lead to better reconstruction results than analytical methods:
  - particularly for the case of noisy/incomplete data
- Computational complexity of iterative methods is much higher for iterative methods than for standard FBP-type algorithms
- Fast GPU hardware allows for efficient development and evaluation of iterative reconstruction approaches
- Focus of this work: approaches to circumvent existing hardware limitations

### Outline

- GPU-accelerated SART using CUDA<sup>1</sup>
  - back-projection
  - forward-projection
- Limitations
- **Possible solutions**
- Performance comparison
- **Proof of concept**

Iterative reconstruction of the Catphan CTP528 phantom

<sup>1</sup>Keck, B., Hofmann, H.G., Scherl, H., Kowarschik, M., and Hornegger, J., "GPU-accelerated SART reconstruction using the CUDA programming environment," in [Proceedings of SPIE Conference, Lake Buena Vista 2009], Samei E., Hsieh J., eds., 72582B (2009).





# **GPU-accelerated SART**

- Back-projection (BP): voxel-driven approach (Scherl et al.<sup>2</sup>)
- Forward-projection (FP):
  - based on ray casting
  - CUDA 2.0 supports 3-D textures
  - enabled hardware support for trilinear interpolation of sample points
- Un-matched pair forward-projector and back-projector (Zeng et al.<sup>3</sup>)
- Texture update procedure:
  - copy whole volume into texture (one cuda call) 3D texture

<sup>2</sup>Scherl, H., Keck, B., Kowarschik, M., and Hornegger, J., "Fast GPU-Based CT Reconstruction using the Common Unified Device Architecture (CUDA)," in [Nuclear Science Symposium, Medical Imaging Conference 2007], Frey, E. C., ed., 4464–4466 (2007).
<sup>3</sup>Zeng, G. and Gullberg, G., "Unmatched projector/backprojector pairs in an iterative reconstruction algorithm," IEEE Transactions on Medical Imaging 19, 548–555 (May 2000).





# **Back-projection using CUDA**



# Forward-projection using ray casting



For selected projections P<sub>j</sub> Compute source position out of projection matrix; Compute inverted projection matrix; Call kernel;

#### Kernel:

Compute pixel u and v coordinate and the normalized ray direction; Compute entrance and exit point of the ray to the volume; Perform ray casting: see illustration; Normalize pixel value to world coordinate system units;





# Limitations

- GPU device memory:
  - QuadroFX 5600: 1.5 GB
  - QuadroFX 5800 / Tesla C1060: 4 GB
- Texture size limitations:
  - 3-D arrays in CUDA 2.0 and OpenGL: 2048<sup>3</sup> elements
  - 2-D texture arrays in CUDA 2.0: 16k × 32k float elements
  - 1-D texture arrays in CUDA 2.0: 8k elements
  - 1-D linear texture 2<sup>27</sup> = 512<sup>3</sup> elements: (512 MB float)
- High resolution example from 3-D mammography:
  - 3072 × 2048 × 50 (≈ 1.2 GB)
  - fits into device memory
  - slice resolution exceeds 2048 × 2048 elements
  - ERROR in forward-projection: 3-D texture limitation







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### <sup>1</sup>Keck, B., Hofmann, H.G., Scherl, H., Kowarschik, M., and Hornegger, J., "GPU-accelerated SART reconstruction using the CUDA

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### • Forward-projection (FP) from 2-D texture array:

Possible solution I: CUDA 1.1 approach<sup>1</sup>

- spread volume slices S<sub>i</sub> into 2-D texture array
- fetch two bilinear interpolated (hardware) values from proximate slices
- kernel computes sample point by linear interpolation (software)
- Texture update procedure:
  - slice-wise copy
  - slow (~1s for a 512<sup>3</sup> vol.)





# **Possible solution II: new approach**



### • FP: 2-D texture from pitchlinear memory:

- CUDA 2.2 feature (released May 2009)
- 16k × 32k float elements (2 GB)
- hardware-accelerated bilinear interpolation
- linear interpolation in software
- single volume copy: **no texture update required**

### BP: different memory layout

 adapt memory address computation due to chosen layout



projections

# **Possible solution II: new approach**



### • FP: 2-D texture from pitchlinear memory:

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### • BP: different memory layout

- adapt memory address computation due to chosen layout
- final memory resort to linear layout



projections



- Performing 20 iterations
- Step size used in ray cast algorithm: 0.3 of uniform voxel size

Compared systems:	
GPU:	GPU:
NVIDIA	NVIDIA
QuadroFX 5600	Tesla C1060

# **Reconstruction time comparison**



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Hardware	(	Tesla C1060		
volume representation (FP)	2-D texturearray	3-D texturearray	2-D pitch- linear texture	2-D pitch- linear texture
volume representation (BP)	global memory (linear)	global memory (linear)	global memory (spec. arrangement)	global memory (spec. arrangement)
device memory required [MB]	700	700	350	350
volume synchr. needed	YES	YES	NO	NO
required CUDA version	≥ CUDA 1.1	≥ CUDA 2.0	≥ CUDA 2.2	≥ CUDA 2.2
SART performance in [s] <sup>*</sup>	4234	844	1488	955

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\*preliminary results

- High resolution phantom:
  - Phantomlab Catphan CTP 528
  - 21 high contrast line pairs
- SART reconstructions:
  - 400 simulated phantom projections à 1024x128 pixel
  - 20 iterations







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Hardware	Tesla C1060				
volume resolution	512² x 100	1024 <sup>2</sup> x 100	2048 <sup>2</sup> x 100	3072 x 2048 x 50	
voxel size in mm	0.4 x 0.4 x 0.1	0.2 x 0.2 x 0.1	0.1 x 0.1 x 0.1	0.075 x 0.1 x 0.1	
device memory required [MB]	100	400	1600	1200	
SART per- formance in [s] <sup>*</sup>	1166	2407	11353	4951	

\*preliminary results





512<sup>2</sup>



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1024<sup>2</sup>





2048<sup>2</sup>





3072 x 2048

### Conclusion



- enhanced GPU-accelerated SART
- pro/cons of 3-D texture usage
- trade-off solution for high (non-compatible) resolutions
- proof of concept

# Thanks to HPMI for the travel grant

# Thanks for your attention