



# Image Reconstruction in Optical Tomography : Utilizing Large Data Sets

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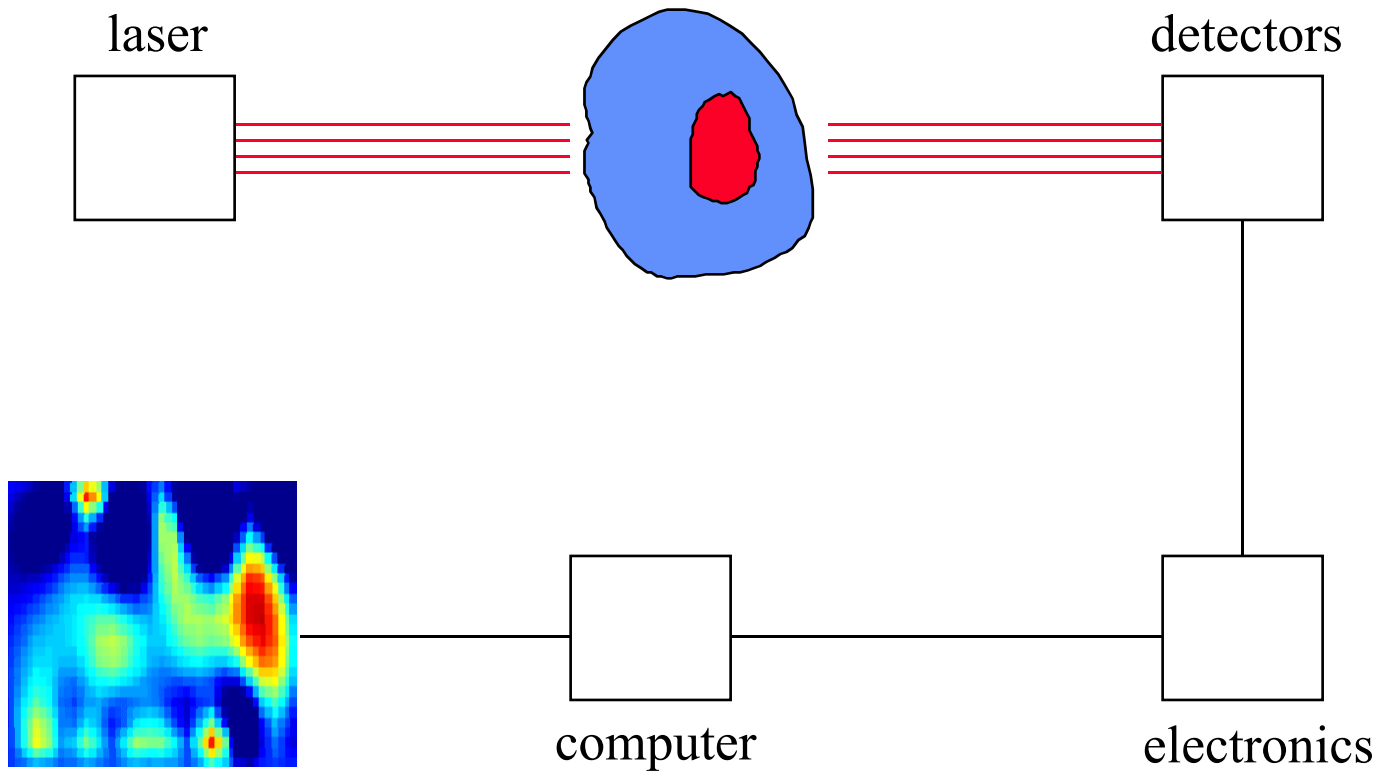
Department of Radiology

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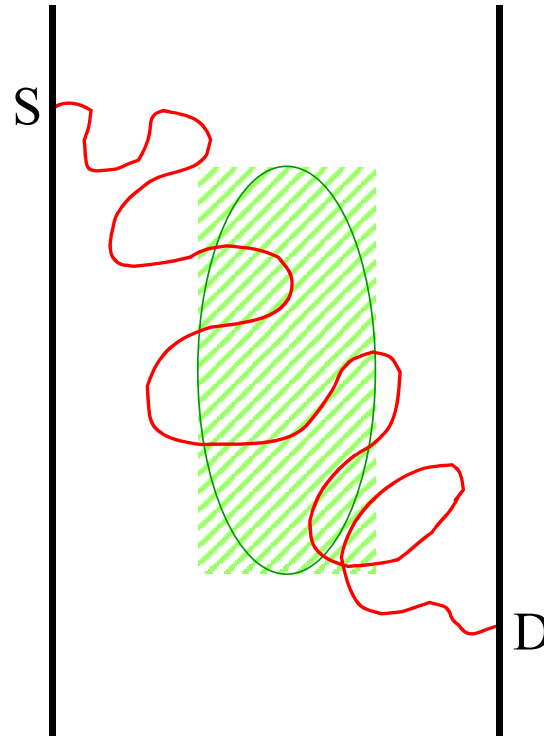
Department of Bioengineering

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# Optical tomography



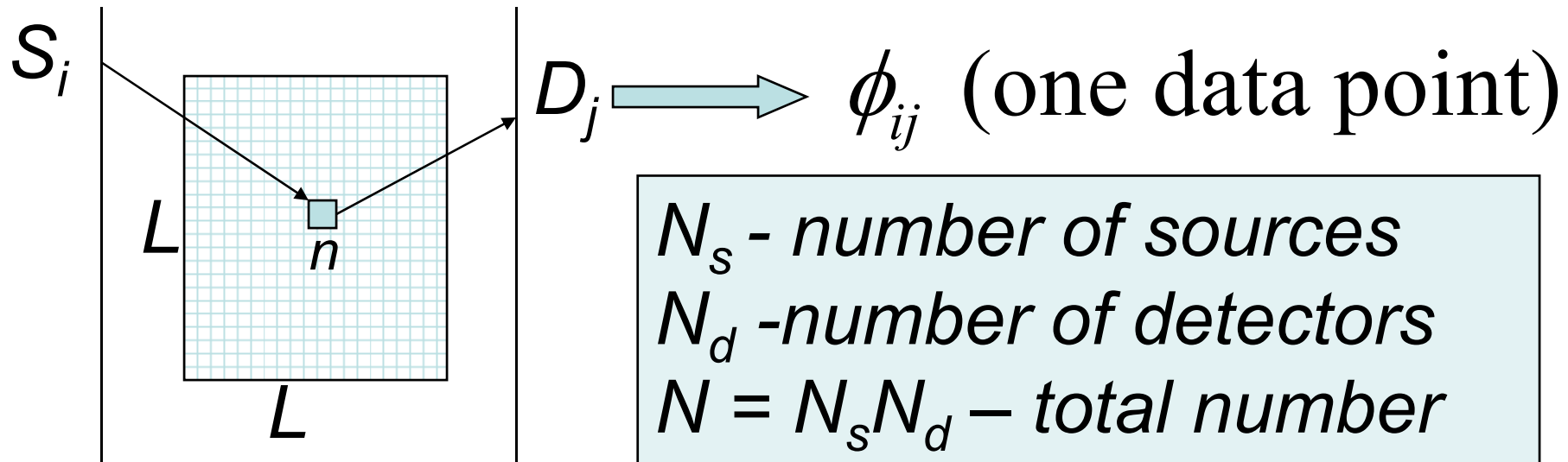
# Inverse problem



- Ill-posed
- Nonlinear

**Problem:** Given measurements from multiple source-detector pairs, reconstruct the spatial distribution of the optical absorption and scattering coefficients.

# Size of the Data Set and Complexity of the Problem



$N_s$  - number of sources  
 $N_d$  - number of detectors  
 $N = N_s N_d$  - total number of data points  
 $L^3$  - number of volume elements

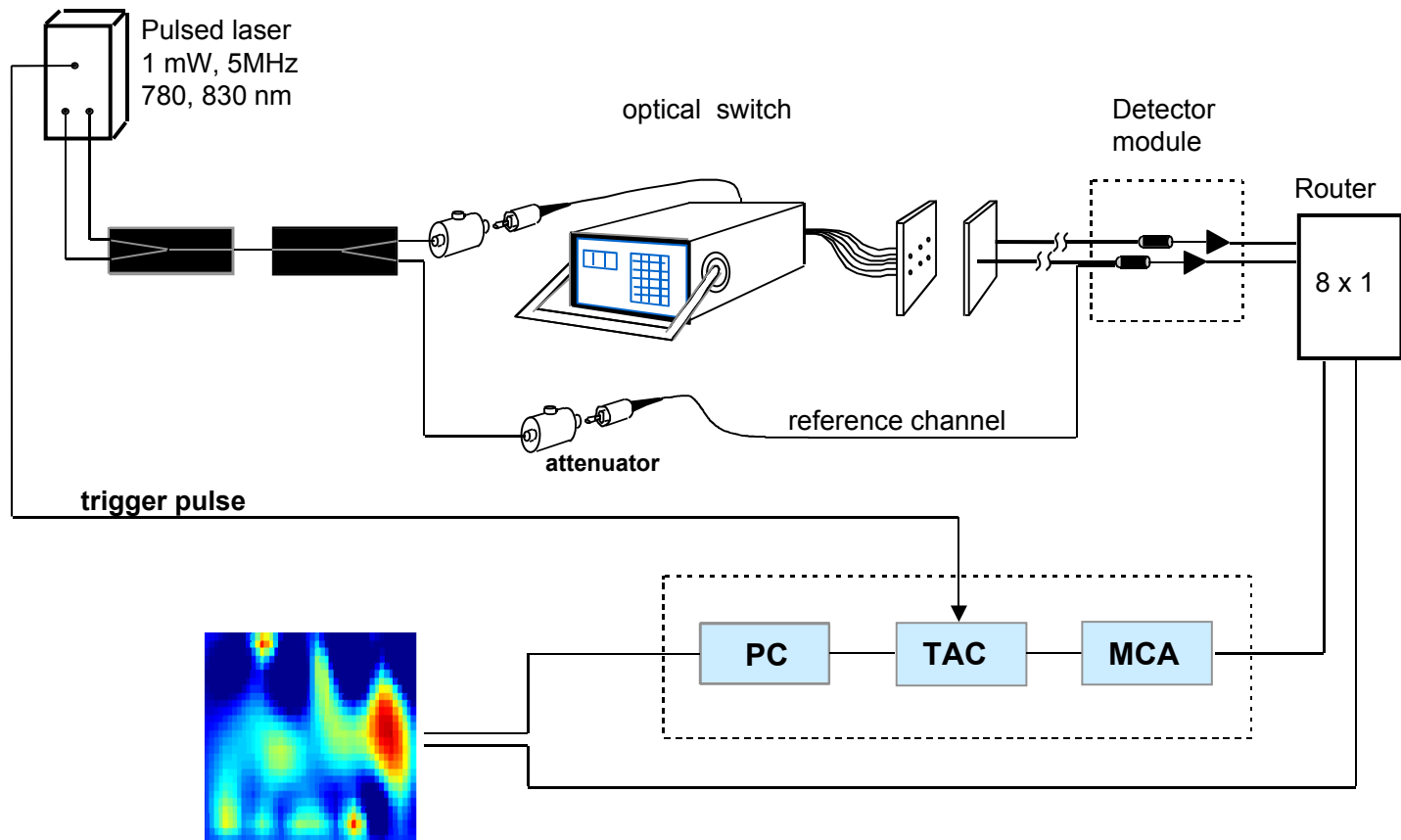
$$\phi_{ij} = \sum_j \Gamma_{ij,n} \delta\alpha_n$$

$$i = 1, \dots, N_s$$

$$j = 1, \dots, N_d$$

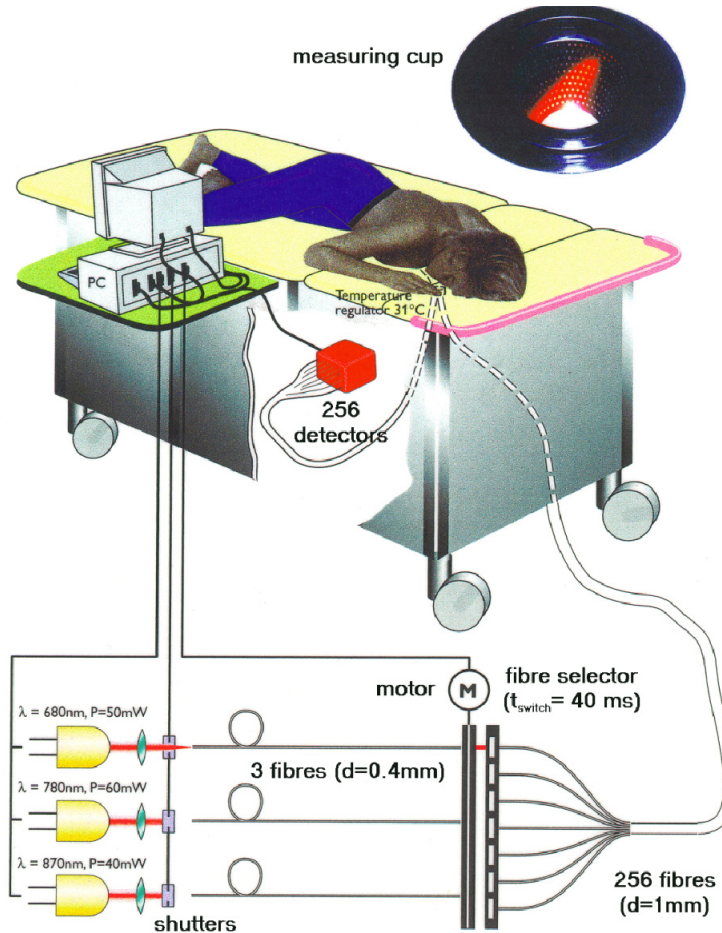
$$n = 1, \dots, L^3$$

# First generation Penn Scanner (~1995)



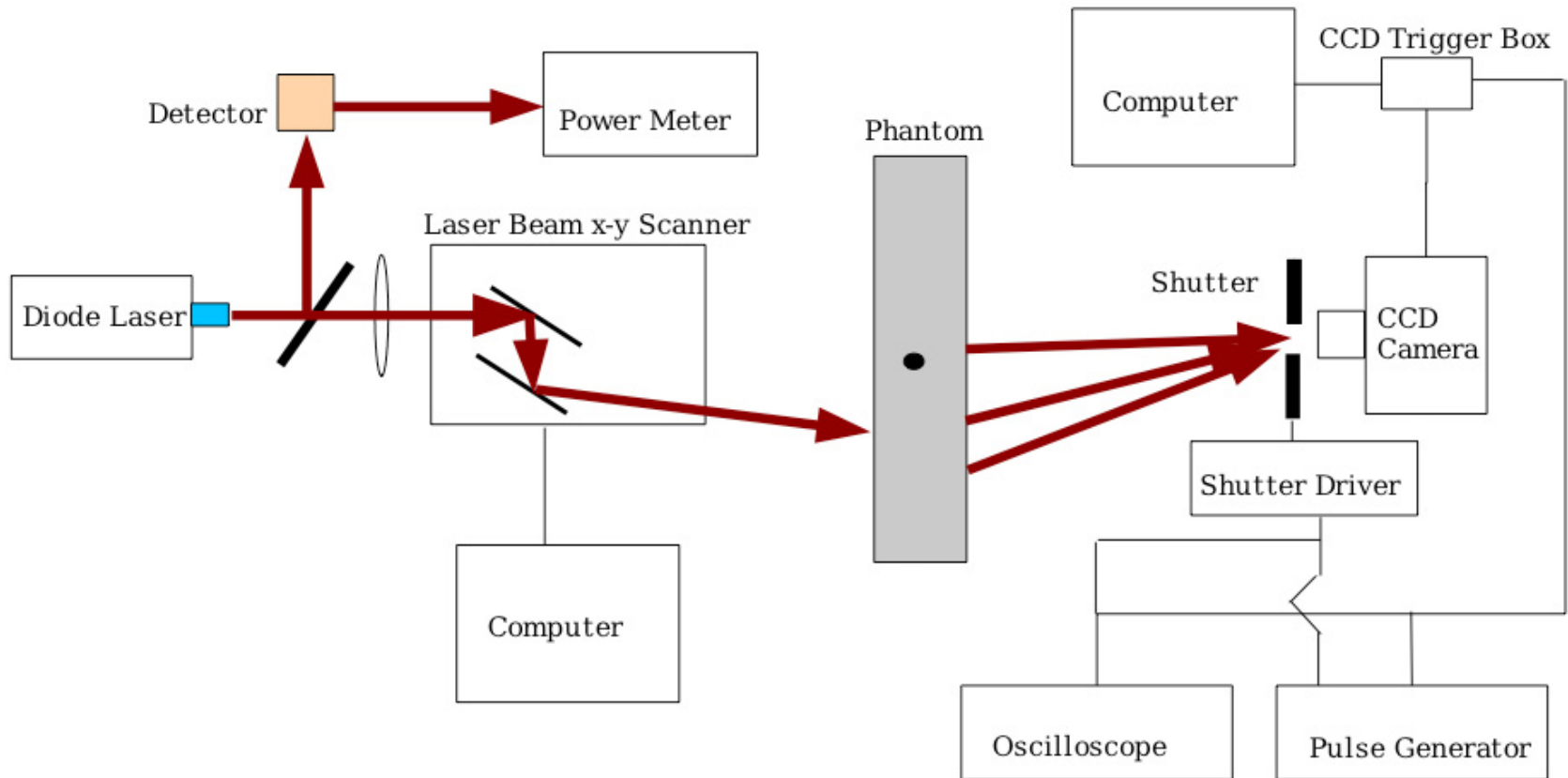
~100 source-detector pairs

# Philips Scanner (~1998)



$\sim 10^5$  source-detector pairs

# Noncontact imager (2005)



$10^8 - 10^{10}$  source detector pairs

# Scaling to Large Data Sets

## QUESTIONS:

- Is it possible to practically use data sets significantly larger than  $10^5$  points ?
- Is more data better ?
- How does the size of data set affect image resolution ?
- How does the size of data set influence noise tolerance and image artifacts ?

## METHODS:

- We have developed image reconstruction algorithms that are capable of utilizing extremely large data sets
- We have built an experimental imager which can acquire  $\sim 10^8$  data points

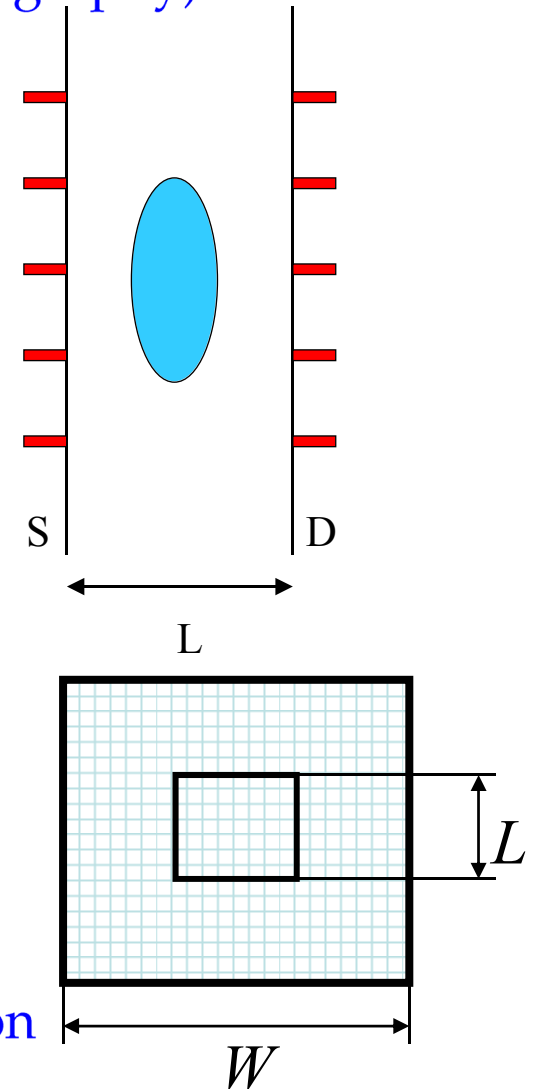


# Simulations: Relation Between Sampling and Resolution

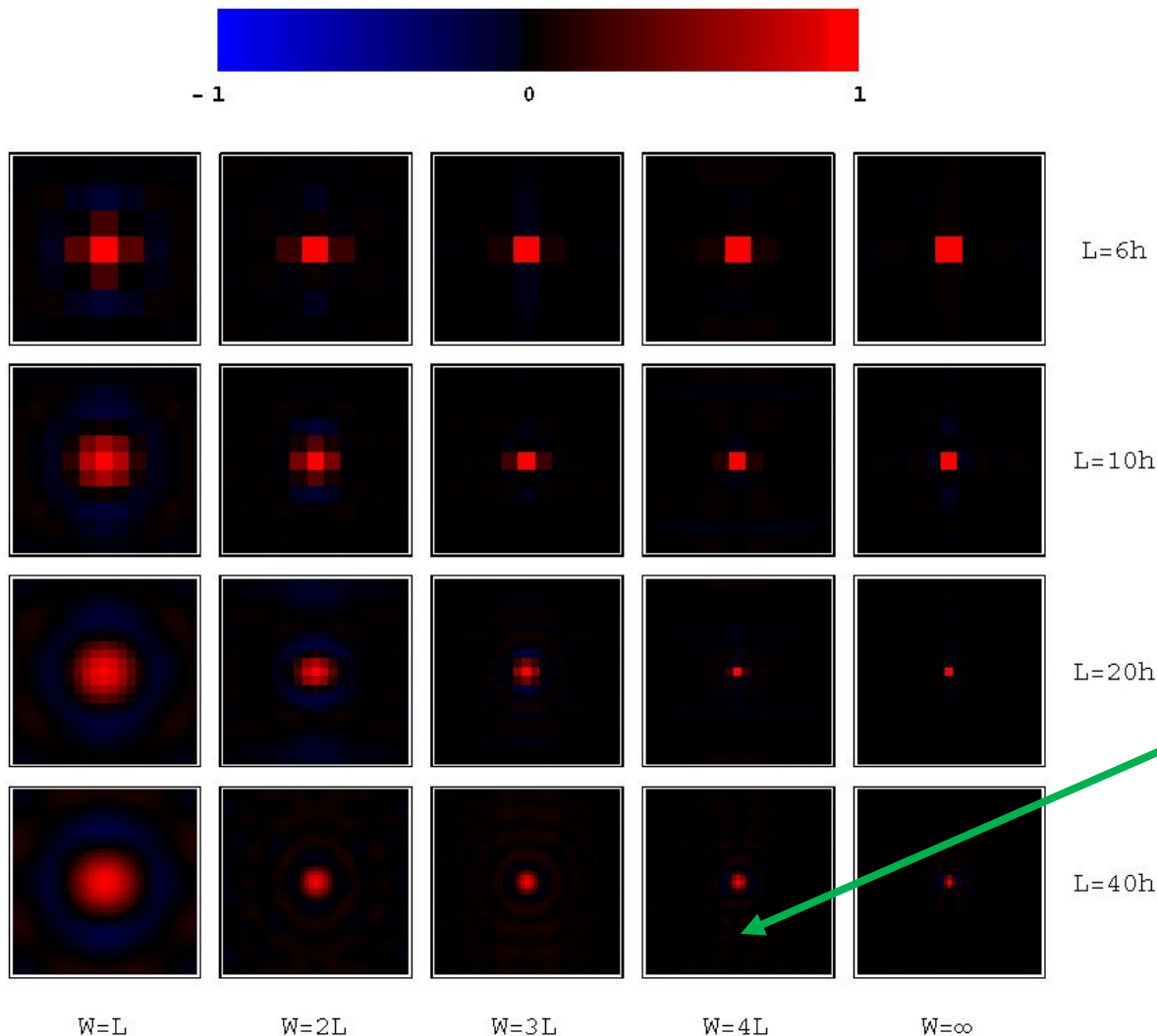
- Slab geometry with absorbing boundaries (mammography)
- Sampling on square lattice with spacing  $h$
- Measurements in window of size  $W$
- Assumptions
  - DC
  - physiologic values of background  $\alpha, D$
  - point absorbers
  - $L = 6$  cm
  - FOV =  $6$  cm  $\times$   $6$  cm

## Resolution

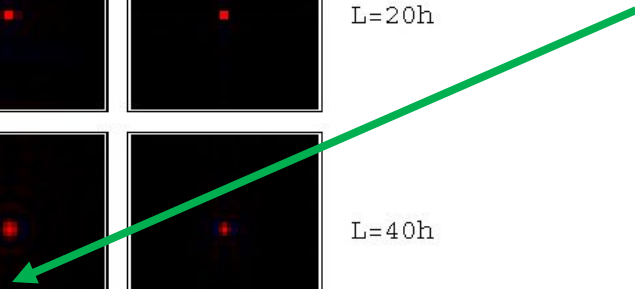
- Fundamental limit of transverse resolution is  $h$
- Depth resolution determined by numerical precision



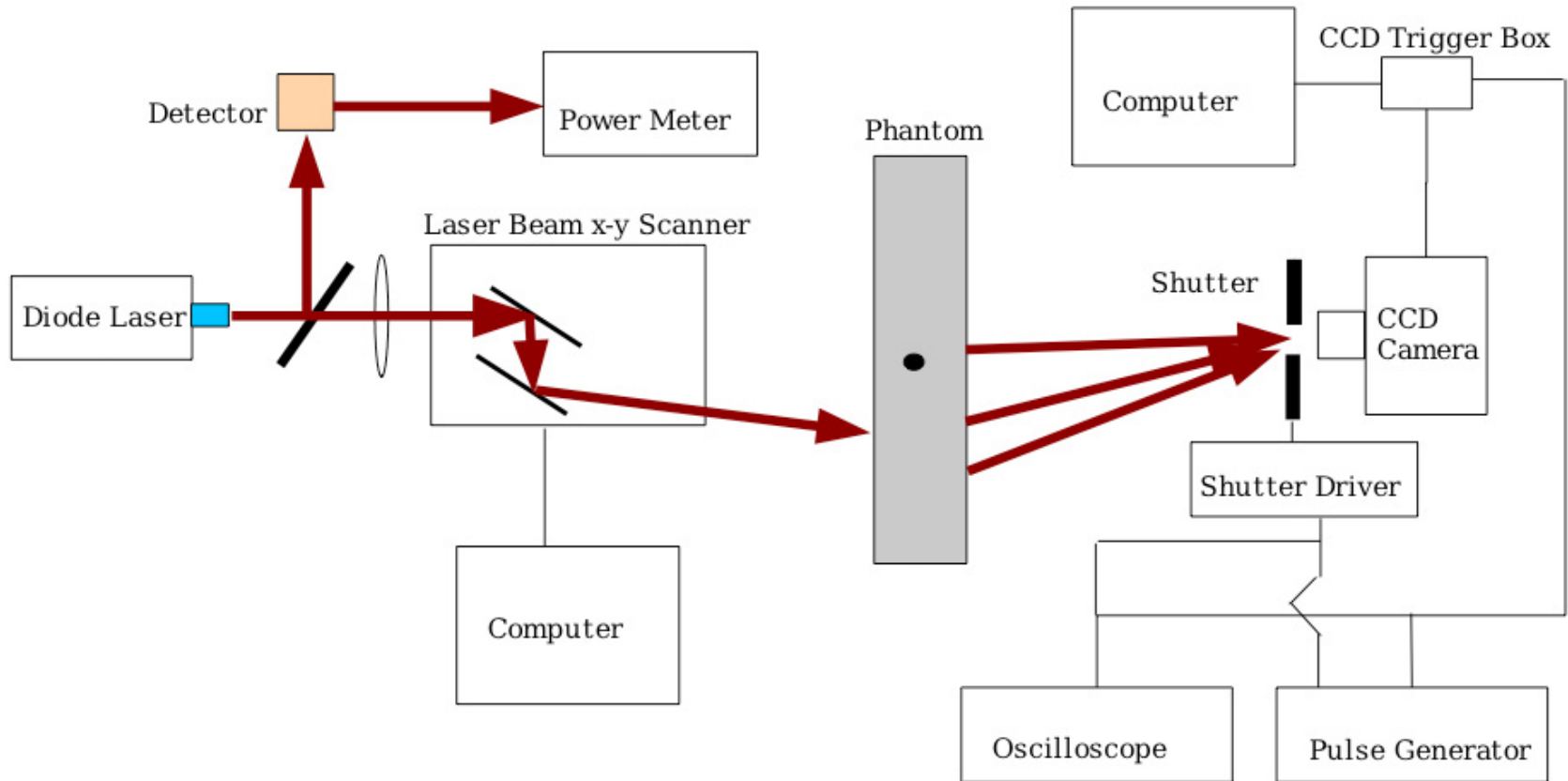
# Sampling and limited data



Data set size approximately corresponding to our current experimental set up

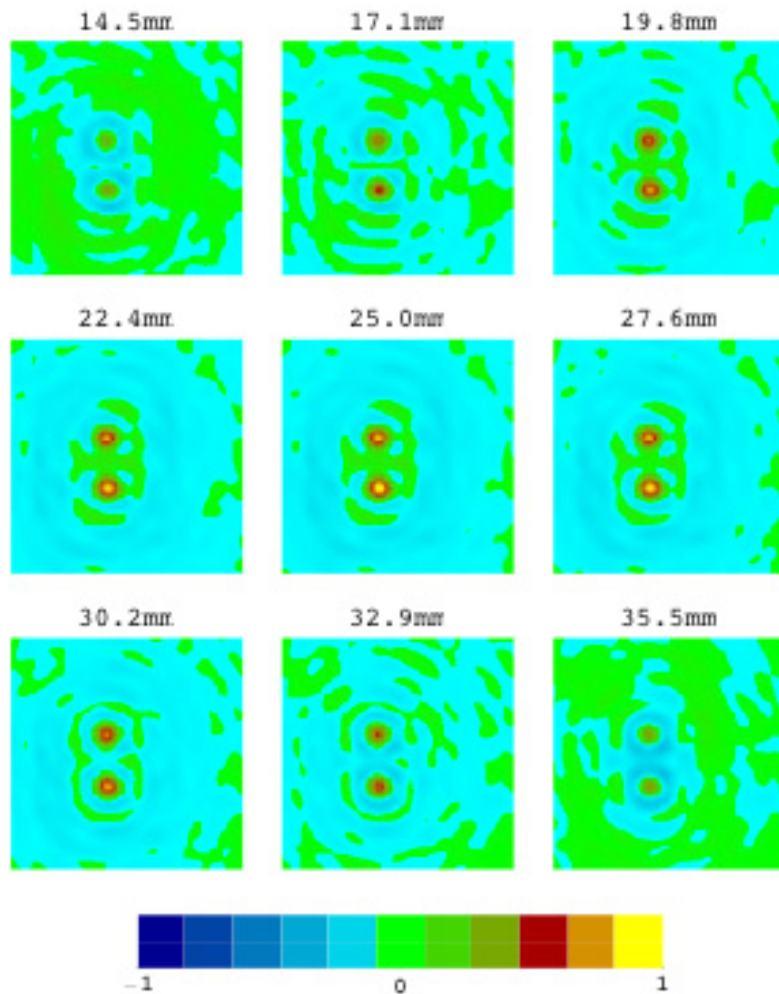


# Noncontact imager



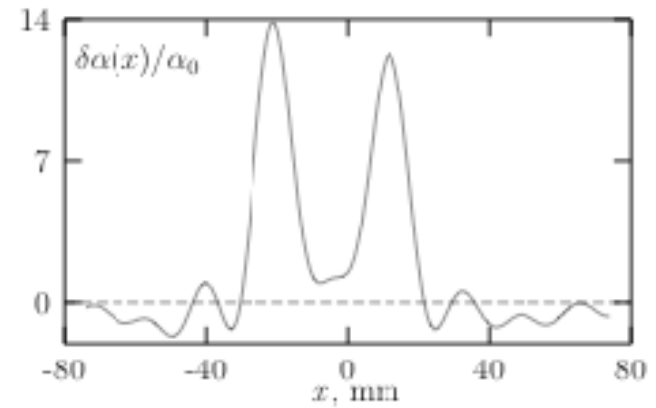
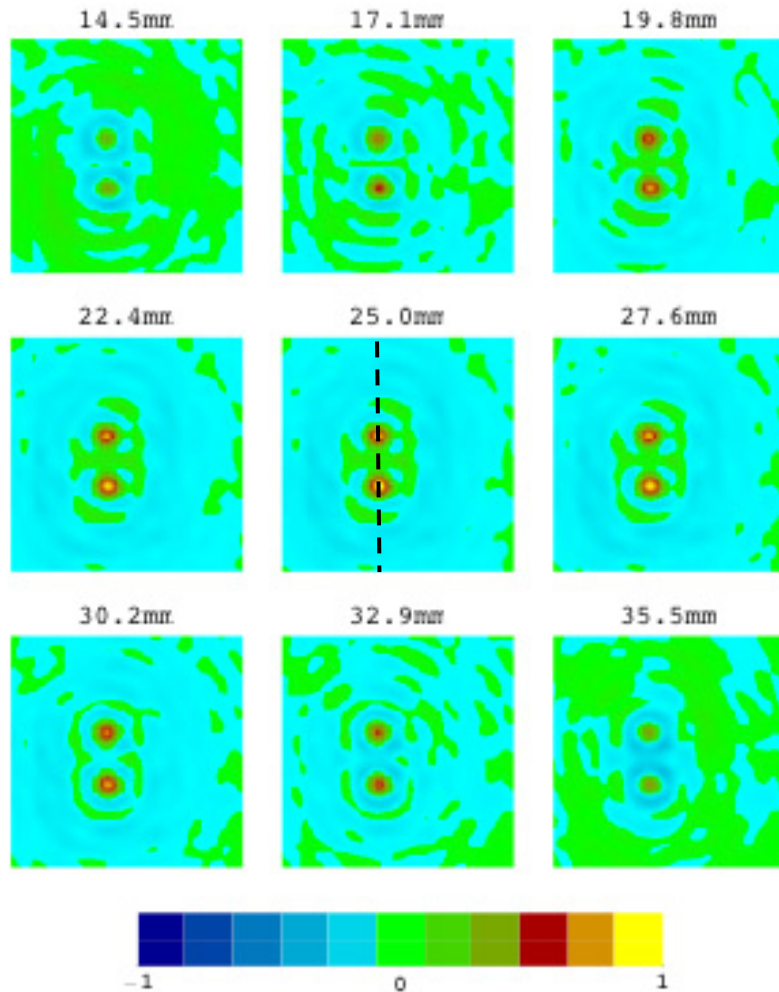
$10^8 - 10^{10}$  source detector pairs

# Reconstructions from experimental data



- $10^8$  source-detector pairs
- $10^3$  sources and  $10^5$  detectors
- 8 mm diameter black balls in 1% Intralipid
- Balls in midplane of sample
- 50 mm slab thickness
- 2.6 mm slice separation
- 15 cm x 15 cm FOV

# Reconstructions from experimental data

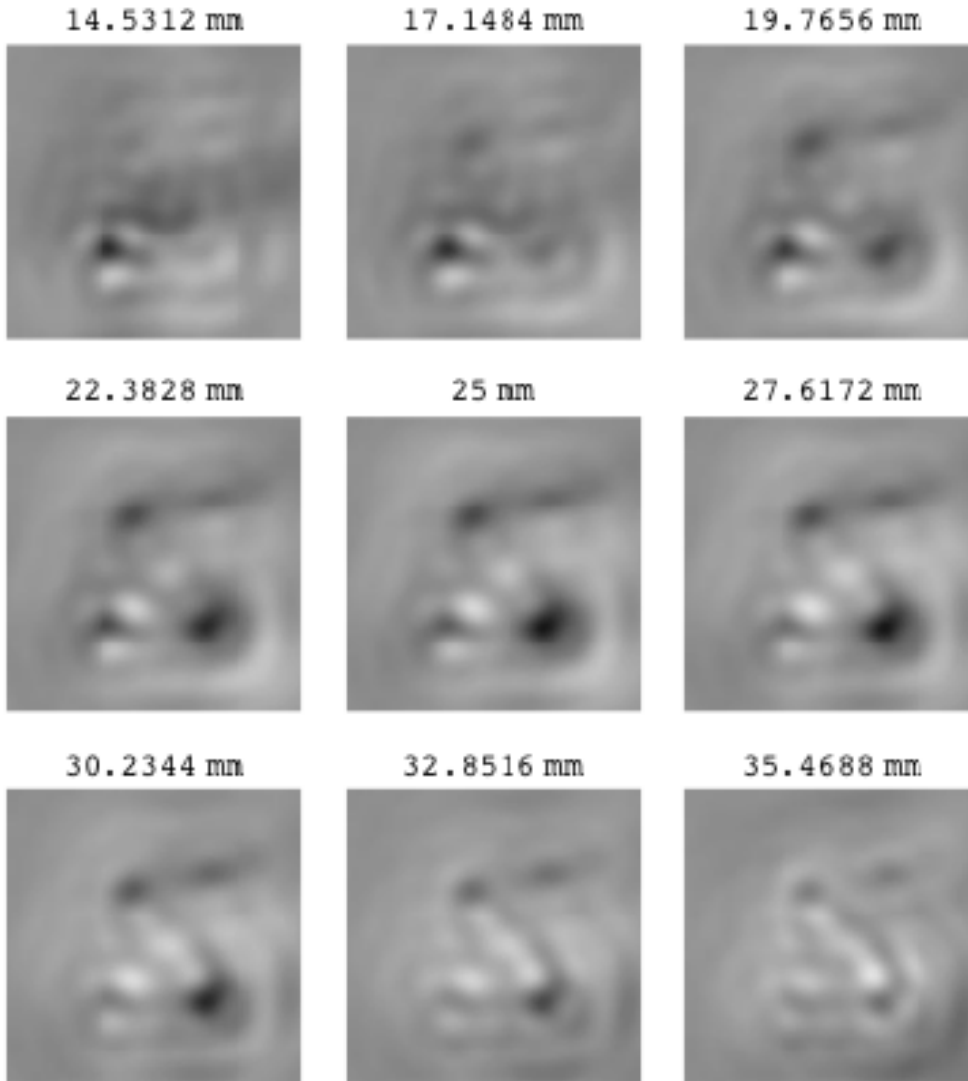


FWHM<sub>xy</sub>=11 mm

FWHM<sub>z</sub>=1.5 cm

Separation=3.3 cm

# Reconstruction of a chicken wing



- $10^8$  source-detector pairs
- $10^3$  sources and  $10^5$  detectors
- 2.6 mm slice separation
- 15 cm x 15 cm FOV

# CONCLUSIONS

- We can reconstruct images from large experimental data sets (currently  $\sim 10^8$  data points)
- Theory and experiment are in agreement at this stage
- Although it is difficult to quantify, image quality seems to be better than in other optical tomography experiments with similar parameters

# FUTURE DIRECTIONS

Three known factors that impact image quality in our experiments:

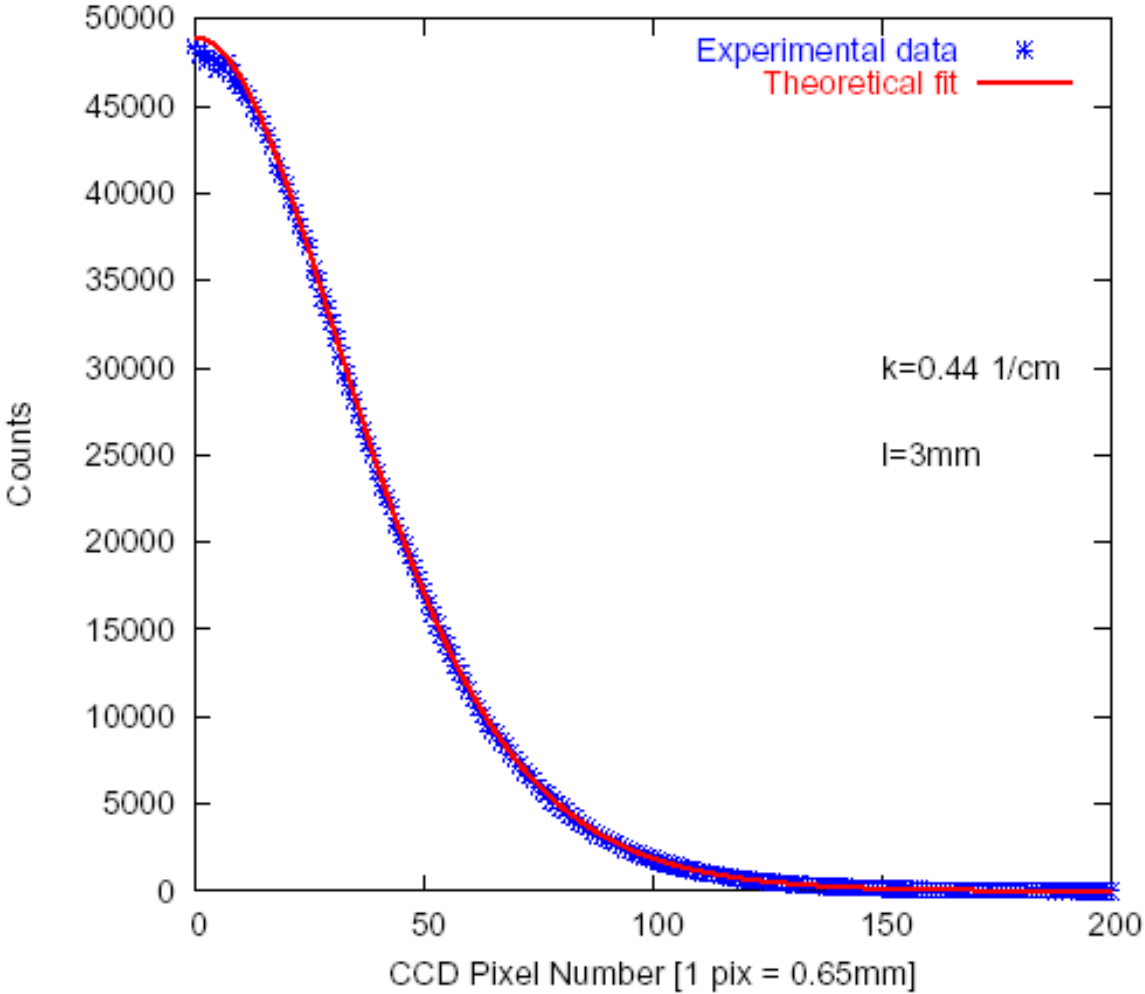
- 1) Noise
- 2) Mechanical design and precision
- 3) Number of sources

## Solutions:

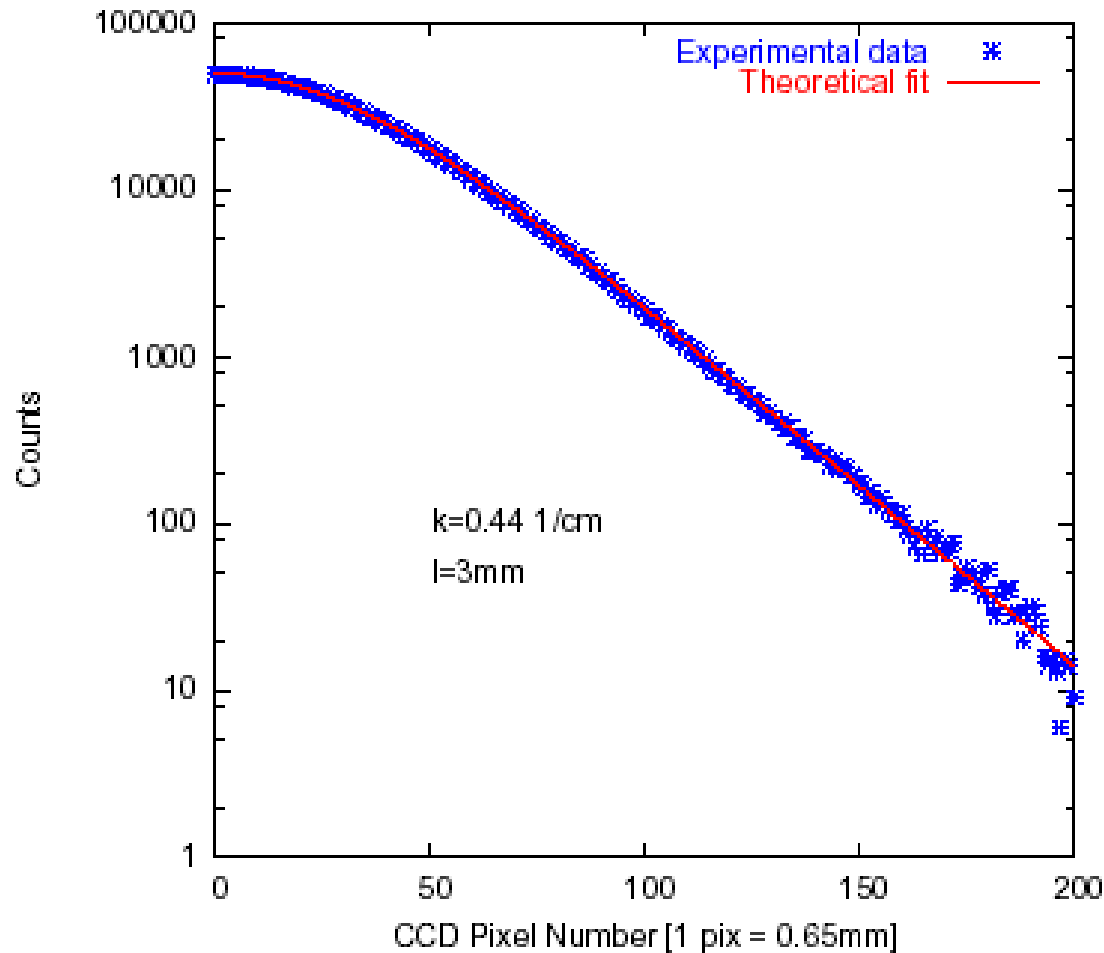
- 1) Higher laser power, overexposing the tails of transmission function (but not enough is known about the nature of noise at this time ...)
- 2) Better mechanical precision
- 3) Using a faster CCD camera (video-rate) will allow us to increase the number of sources by about the factor of 100.



# Transmission Through a Slab: Experimental Data vs Theoretical Fit



# Transmission Through a Slab: Experimental Data vs Theoretical Fit (LIN –LOG Scale)



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- **RECENT PUBLICATIONS** (see <http://whale.seas.upenn.edu>):

## 2005

- G.Y.Panasyuk, J.C.Schotland, and V.A.Markel, "Radiative transport equation in rotated reference frames, " submitted to J.Phys.A. (2005).
- Z.Wang, G.Y.Panasyuk, V.A.Markel, and J.C.Schotland, "Experimental demonstration of an analytic method for image reconstruction in optical tomography with large data sets," submitted to Opt. Lett. (2005).
- G.Y.Panasyuk, V.A.Markel, and J.C.Schotland, "Superresolution and corrections to the diffusion approximation in optical tomography," submitted to Appl. Phys. Lett. (2005).
- V.A.Markel, J.C.Schotland, "Multiple projection optical diffusion tomography with plane wave illumination," Physics in Medicine and Biology, 50(10), 2351 (2005).

## 2004

- V.A.Markel, J.C.Schotland, "Symmetries, inversion formulas and image reconstruction for optical tomography," Phys. Rev. E 70(5), 056616 (2004).
- V.A.Markel, J.C.Schotland, "Dual-projection optical diffusion tomography," Opt. Lett. 29(17), 2019 (2004).
- V.A.Markel, "Modified spherical harmonics method for solving the radiative transport equation," Waves in Random Media 14(1), L13 (2004).
- V.N.Pustovit, V.A.Markel, "Propagation of diffuse light in a turbid medium with multiple spherical inhomogeneities," Appl. Opt. 43(1), 104 (2004).

## 2003

- V.A.Markel, J.A.O'Sullivan, J.C.Schotland, "Inverse problem in optical diffusion tomography. IV. Nonlinear inversion formulas," JOSAA 20(5), 903 (2003).
- V.A.Markel, V.Mital, J.C.Schotland, "Inverse problem in optical diffusion tomography. III. Inversion formulas and singular value decomposition," JOSAA 20(5), 890 (2003).

## 2002

- V.A.Markel, J.C.Schotland, "Effects of sampling and limited data in optical tomography," Appl. Phys. Lett. 81(7), 1180 (2002).
- V.A.Markel, J.C.Schotland, "Scanning paraxial optical tomography," Opt. Lett. 27(13), 1123 (2002).
- V.A.Markel, J.C.Schotland, "The inverse problem in optical diffusion tomography. II. Inversion with boundary conditions," JOSAA 19(3), 558 (2002).

## 2001

- V.A.Markel, J.C.Schotland, "Inverse scattering for the diffusion equation with general boundary conditions," Phys. Rev. E 64(3), R035601 (2001).
- J.C.Schotland, V.A.Markel, "Inverse scattering with diffusing waves," JOSAA 18(11), 2767 (2001).
- V.A.Markel, J.C.Schotland, "The inverse problem in optical diffusion tomography. I. Fourier-Laplace inversion formulas," JOSAA 18(6), 1336 (2001).