

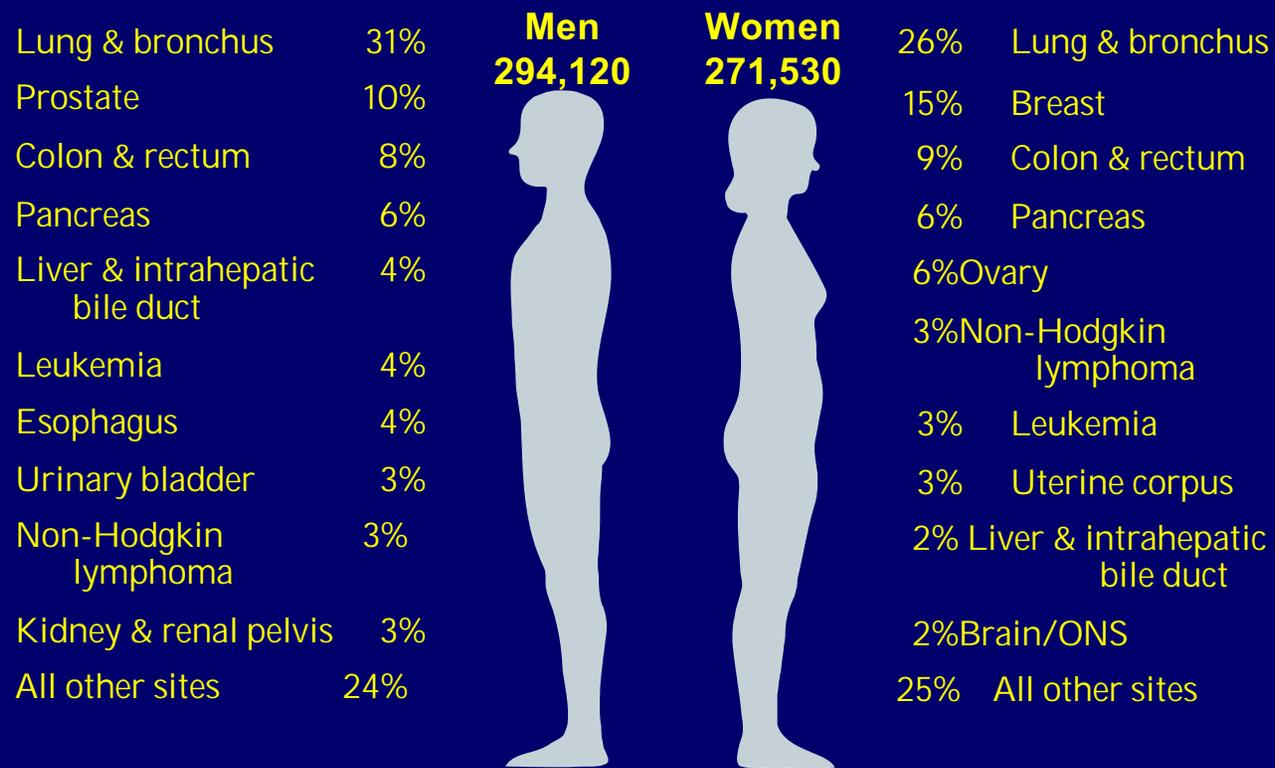
# Imaging Innovations in Cancer Research



**MINI DAS**

DEPARTMENT OF PHYSICS  
DEPARTMENT OF BIOMEDICAL ENGINEERING  
UNIVERSITY OF HOUSTON

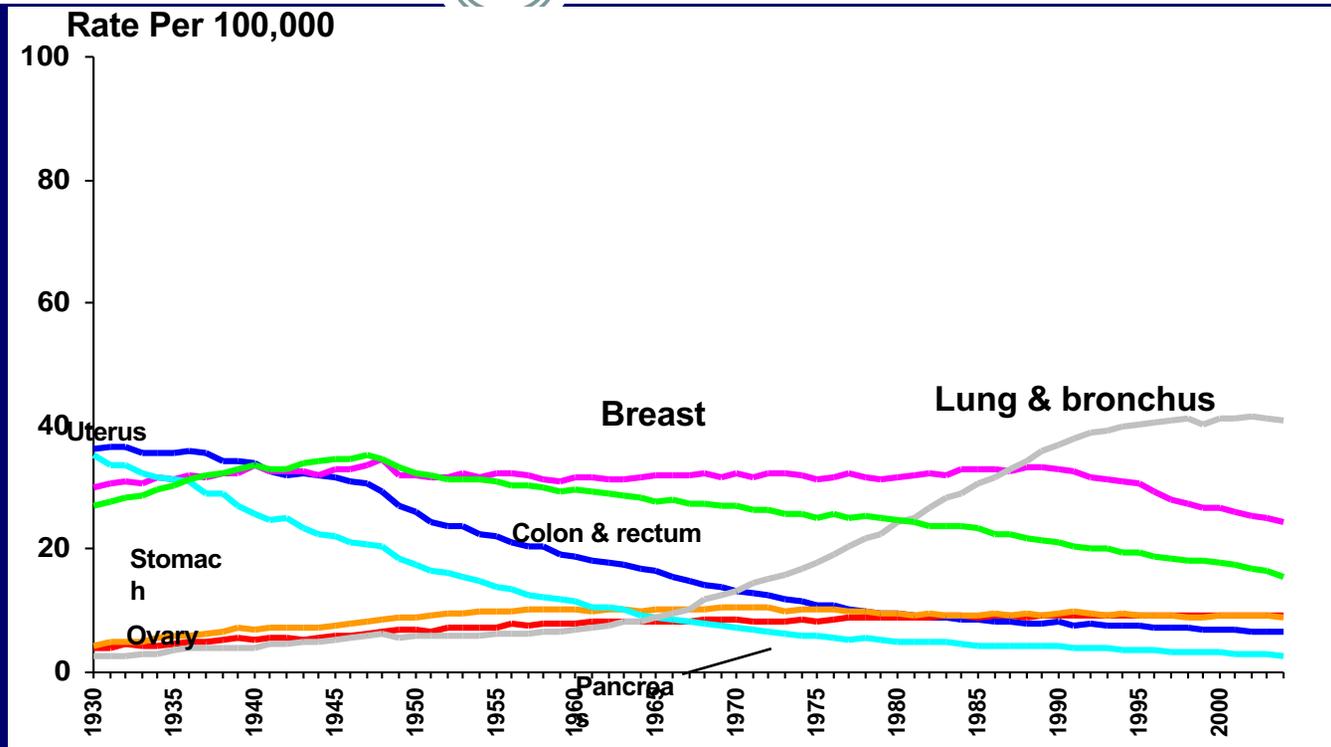
# 2008 Estimated US Cancer Deaths\*



ONS=Other nervous system.  
Source: American Cancer Society, 2008.

Mini Das, Cancer Education (Houston),

## Cancer Death Rates\* Among Women, US, 1930-2004

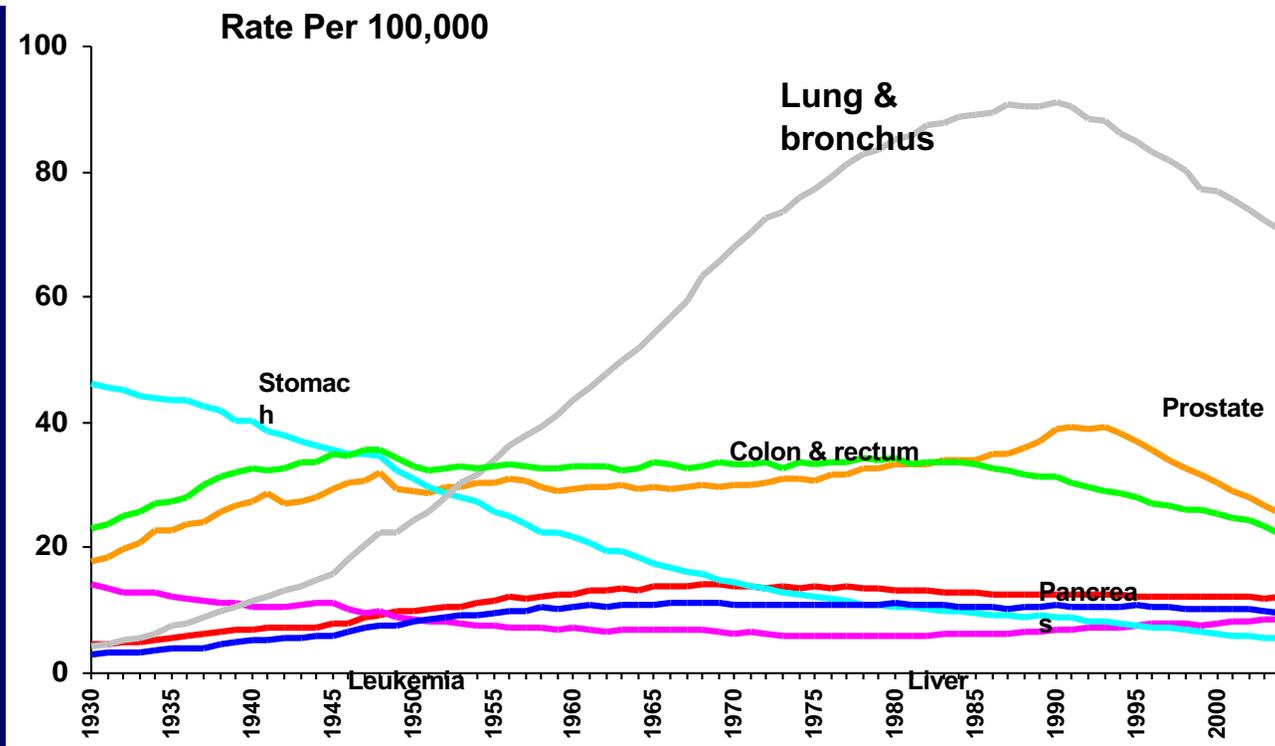


\* Age-adjusted to the 2000 US standard population.

Source: US Mortality Data 1960-2004, US Mortality Volumes 1930-1959, National Center for Health Statistics, Centers for Disease Control and Prevention, 2006.

Mini Das, Cancer Education (Houston),

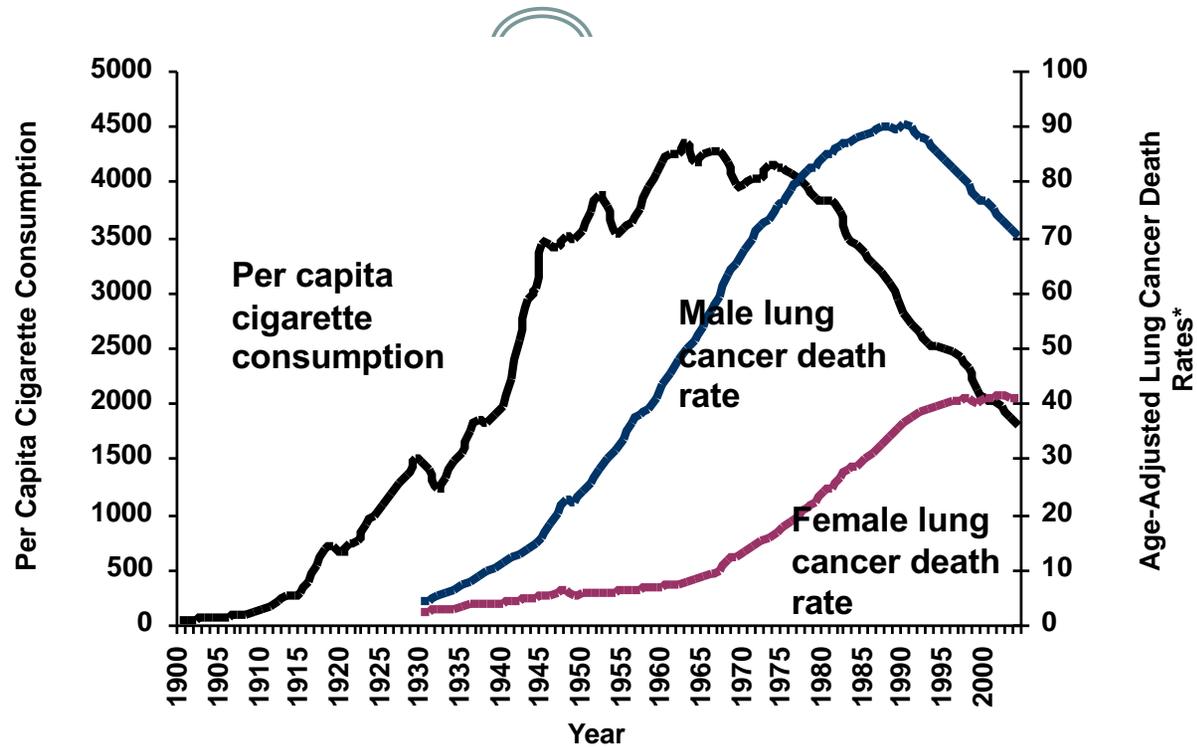
## Cancer Death Rates\* Among Men, US, 1930-2004



\*Age-adjusted to the 2000 US standard population.

Source: US Mortality Data 1960-2004, US Mortality Volumes 1930-1959, National Center for Health Statistics, Centers for Disease Control and Prevention, 2006.

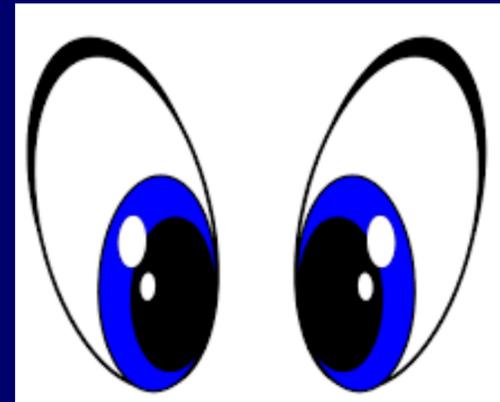
Mini Das, Cancer Education (Houston),



Age adjusted to 2000 US standard population.  
 Source: Death rates: US Mortality Data, 1960-2004, US Mortality Volumes, 1930-1959, National Center for Health Statistics, Centers for Disease Control and Prevention, 2006. Cigarette consumption: US Department of Agriculture, 1900-2004.

Mini Das, Cancer Education (Houston),

# Imaging



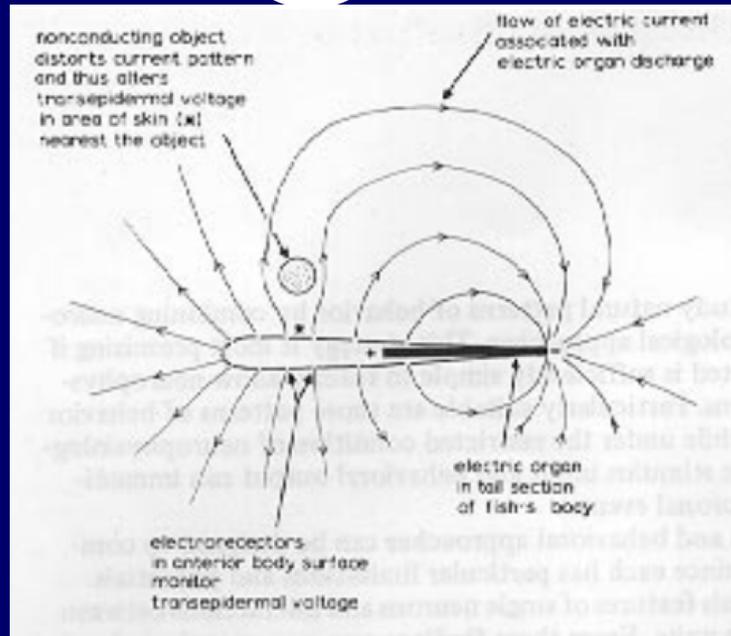
# Sensing, Detection and Imaging

Photons  
(optical, x-ray,  $\gamma$ )

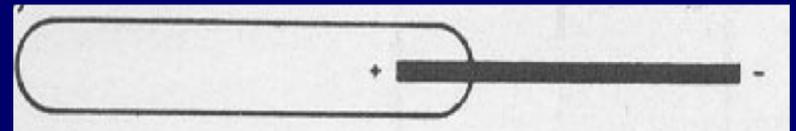
Sound

Magnetic Field

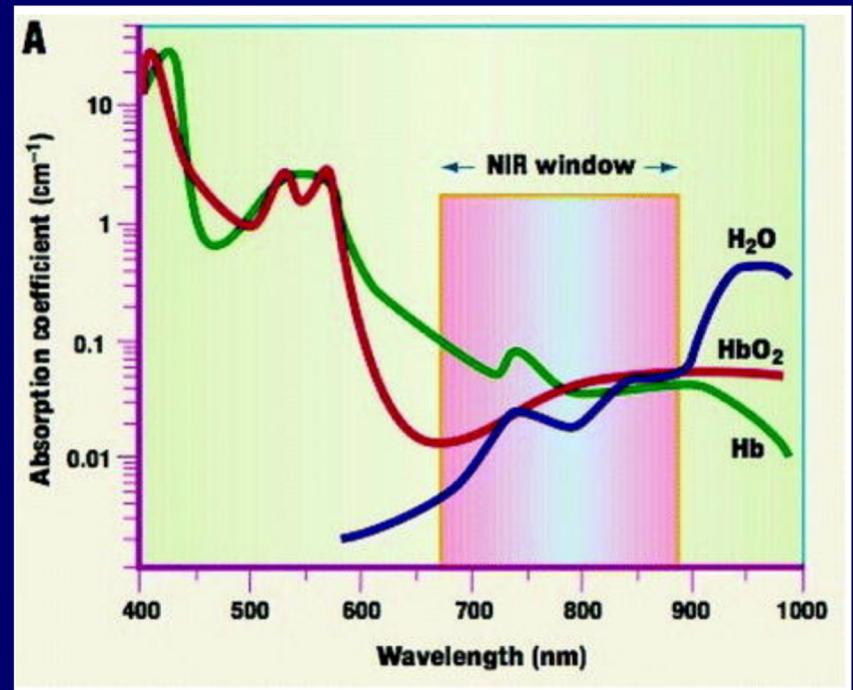
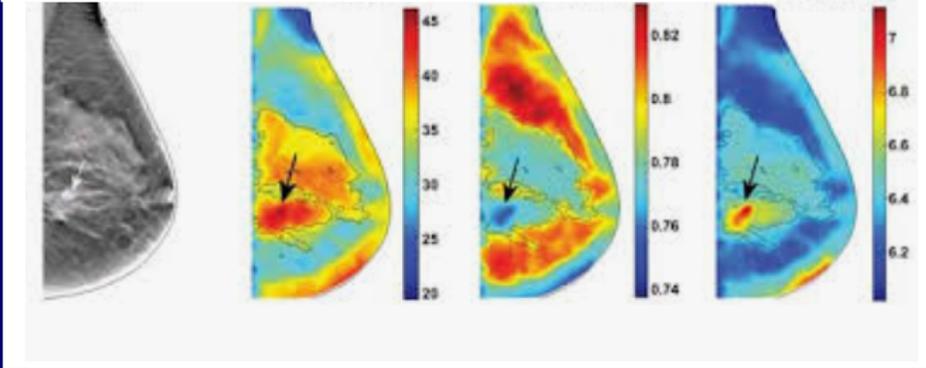
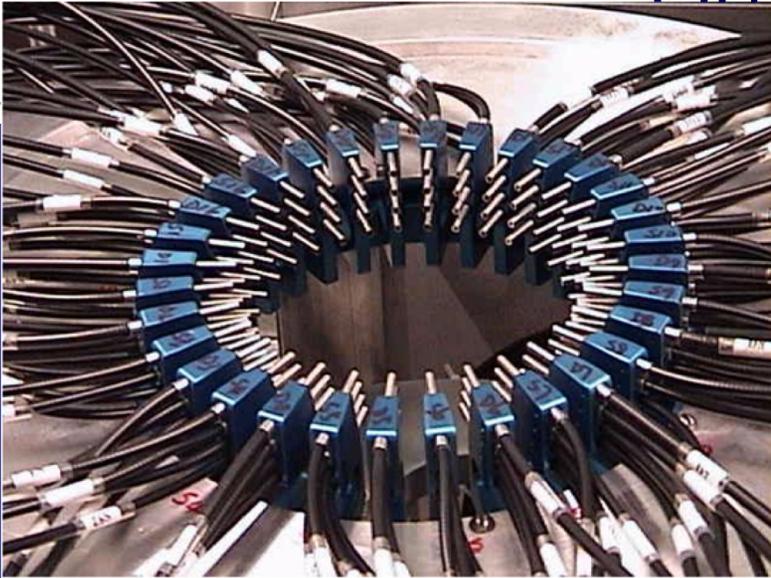
Electric Field



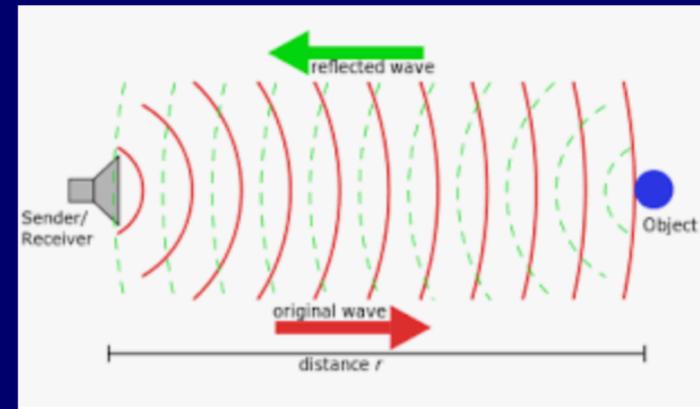
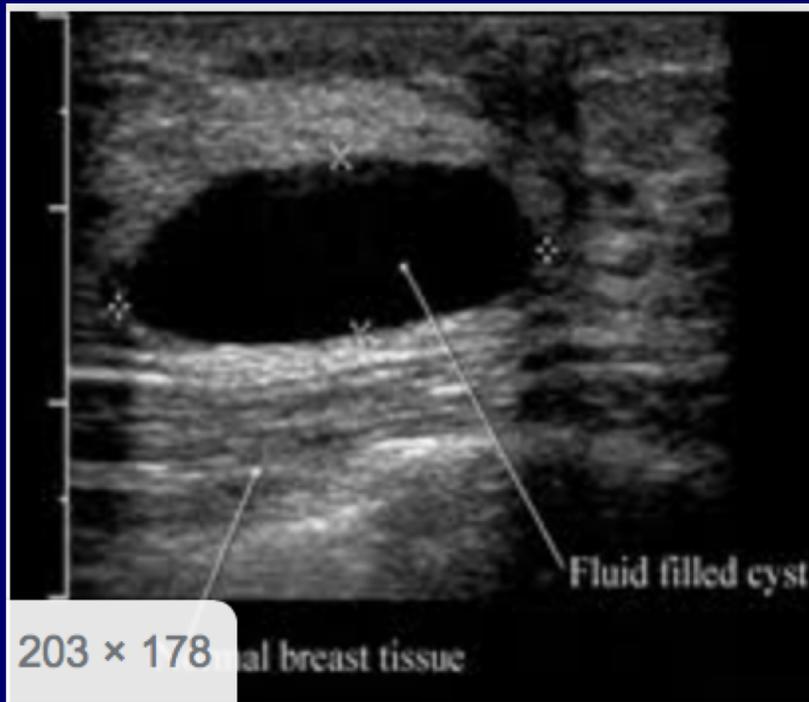
Electrolocation



# Optical Imaging

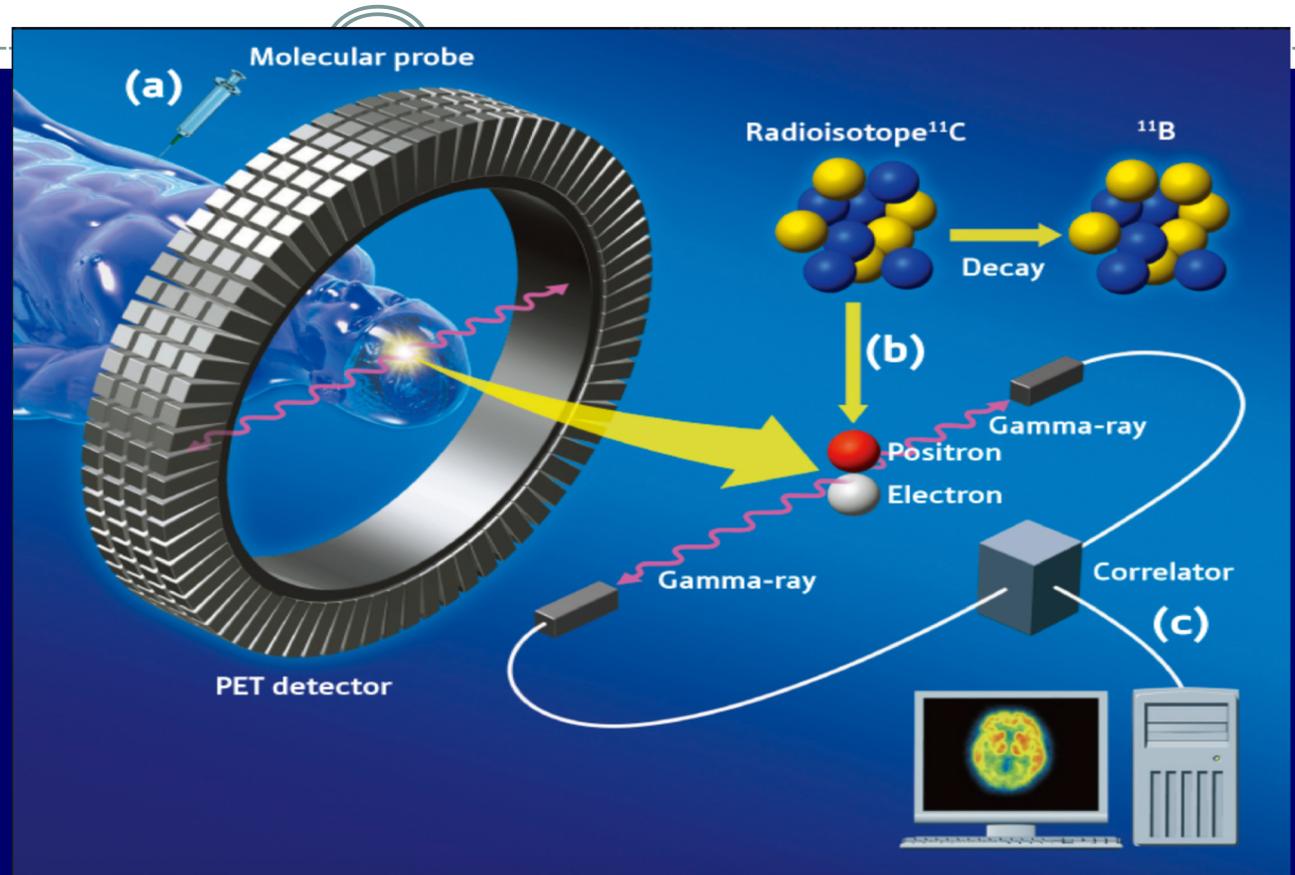


# Ultrasound Imaging

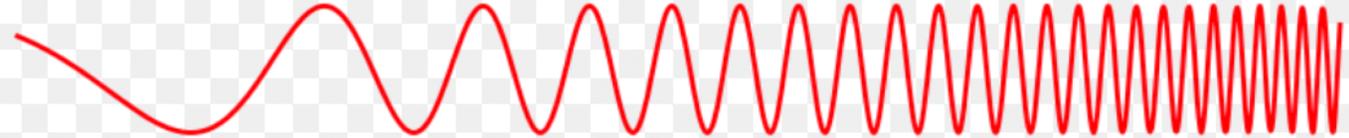


# Positron Emission Tomography

Radioactive isotope  
Positron emission  
Gamma Rays



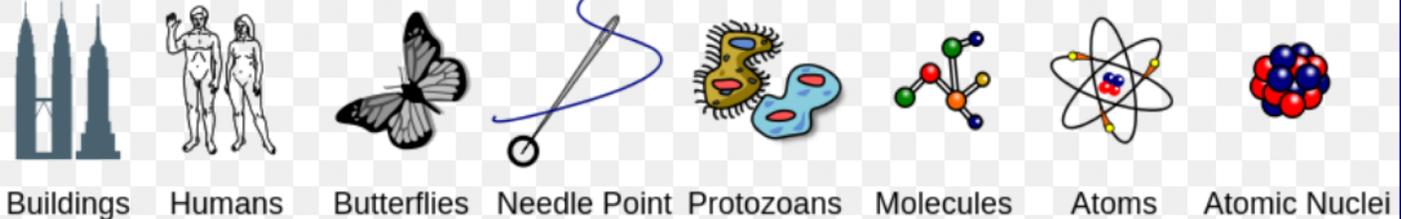
Penetrates Earth's Atmosphere?



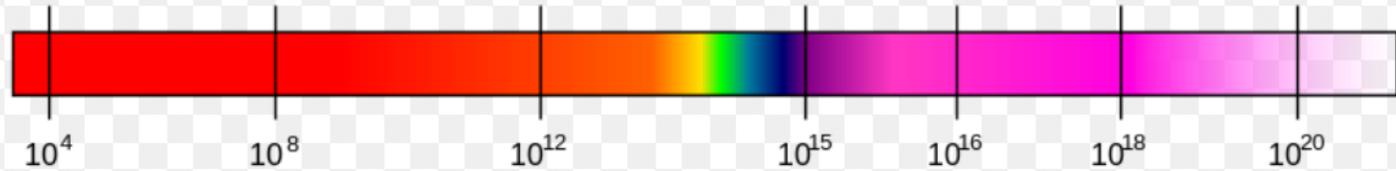
Radiation Type  
Wavelength (m)

Radiation Type	Wavelength (m)
Radio	$10^3$
Microwave	$10^{-2}$
Infrared	$10^{-5}$
Visible	$0.5 \times 10^{-6}$
Ultraviolet	$10^{-8}$
X-ray	$10^{-10}$
Gamma ray	$10^{-12}$

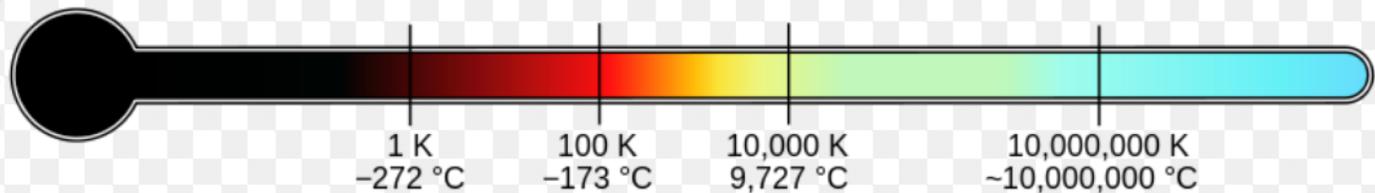
Approximate Scale of Wavelength



Frequency (Hz)



Temperature of objects at which this radiation is the most intense wavelength emitted



# Once upon a time...

1895

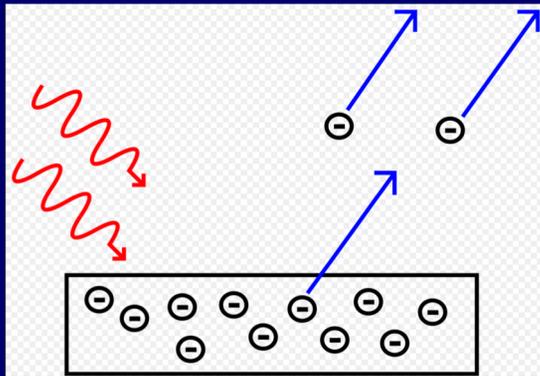


Roentgen

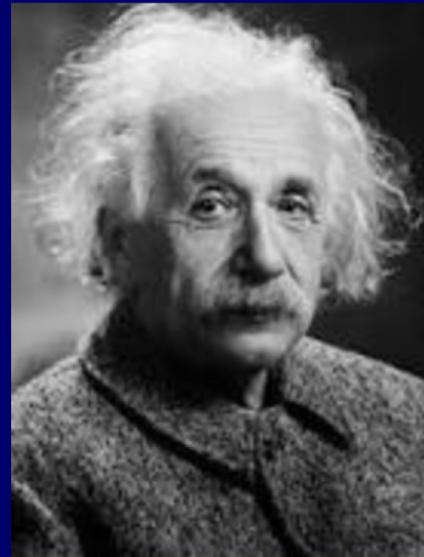
1901-Physics



# Photoelectric Effect



Photoelectric effect (1905)

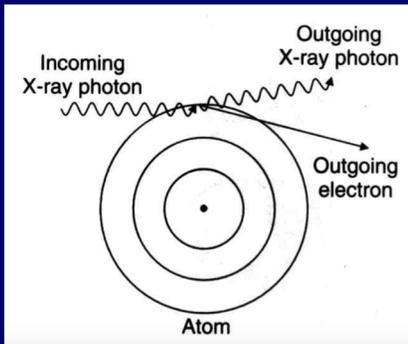


1921-Physics- ..discovery of laws of PE

# Compton Scattering (Inelastic)



Nobel Prize  
in Physics (1927)



## A QUANTUM THEORY OF THE SCATTERING OF X-RAYS BY LIGHT ELEMENTS

BY ARTHUR H. COMPTON

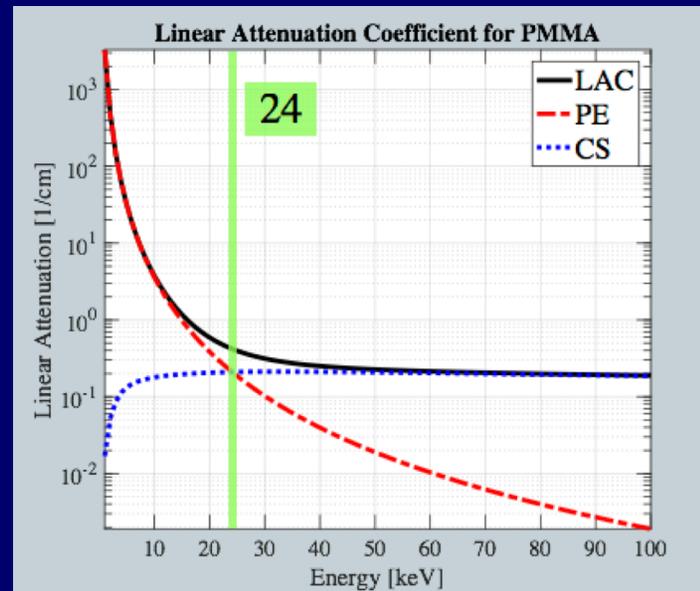
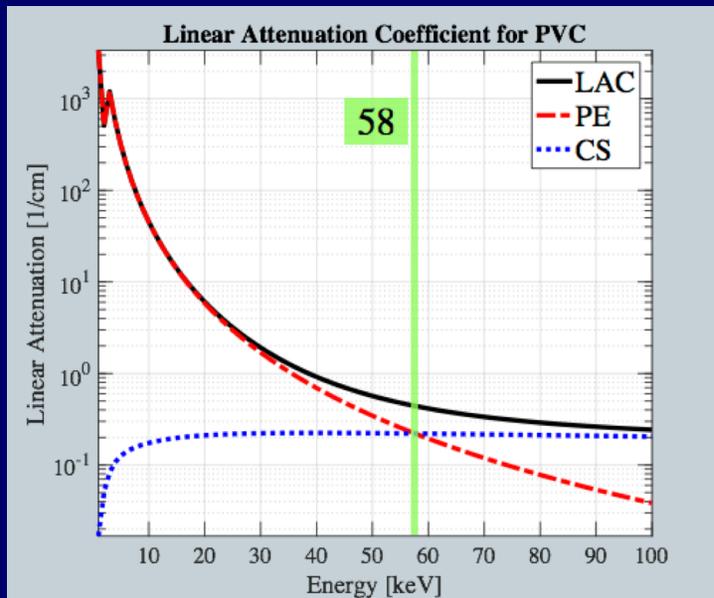
### ABSTRACT

**A quantum theory of the scattering of X-rays and  $\gamma$ -rays by light elements.**  
—The hypothesis is suggested that when an X-ray quantum is scattered it spends all of its energy and momentum upon some particular electron. This electron in turn scatters the ray in some definite direction. The change in momentum of the X-ray quantum due to the change in its direction of propagation results in a recoil of the scattering electron. The energy in the scattered quantum is thus less than the energy in the primary quantum by the kinetic energy of recoil of the scattering electron. The corresponding *increase in the wave-length of the scattered beam* is  $\lambda_{\theta} - \lambda_0 = (2h/mc) \sin^2 \frac{1}{2}\theta = 0.0484 \sin^2 \frac{1}{2}\theta$ , where  $h$  is the Planck constant,  $m$  is the mass of the scattering electron,  $c$  is the velocity of light, and  $\theta$  is the angle between the incident and the scattered

Arthur H. Compton, *The Physical Review* (May 1923)

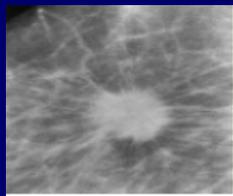
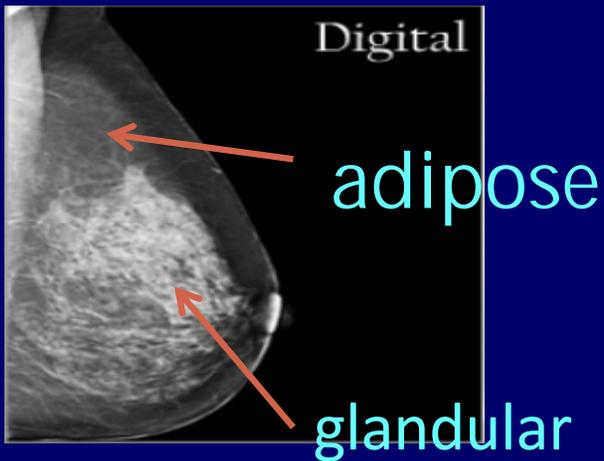
# Attenuation

$$I_m(x, y, E_n) = I_0(x, y, E_n) \exp\left(-\int \mu(\mathbf{r}, E_n) dz\right)$$



National Institute for Standards and Technology (NIST)

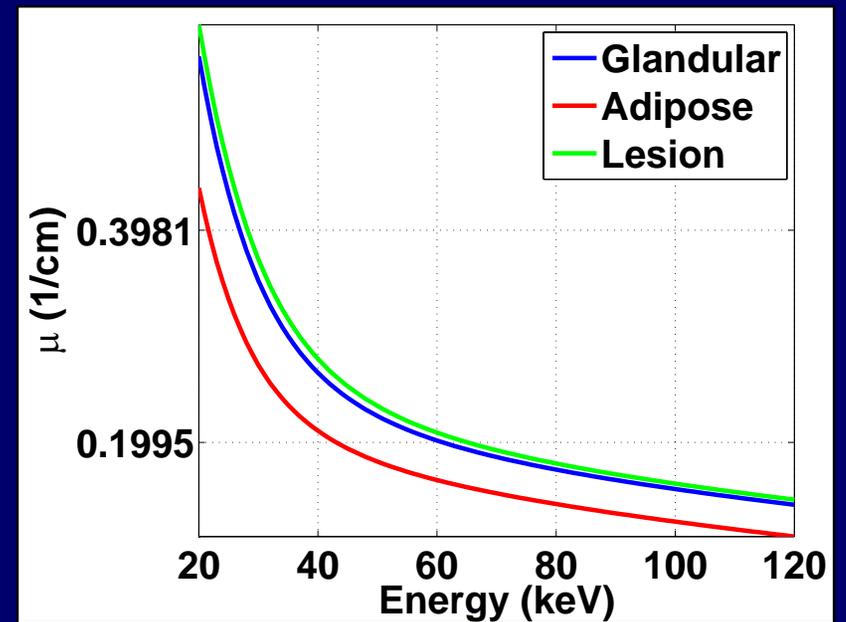
# Mammography- Low Tissue Contrast



Spiculated Mass

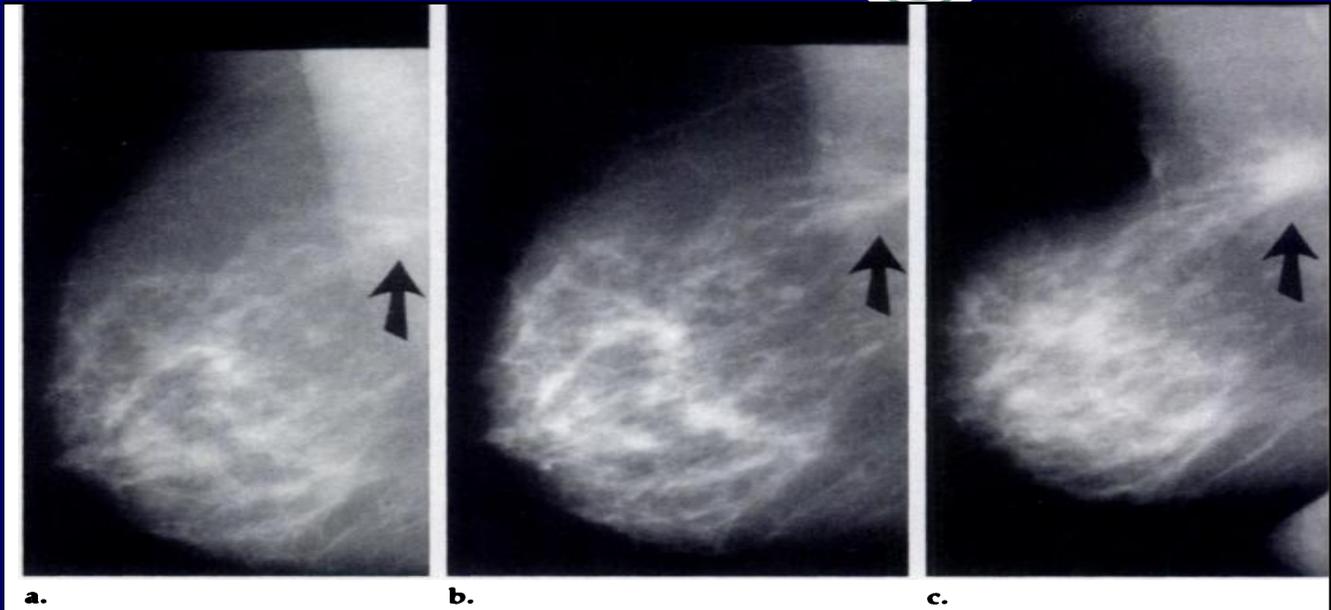


Microcalcification cluster



# Example of Missed Lesion

## Invasive Ductal Carcinoma



Years: 1985

1987

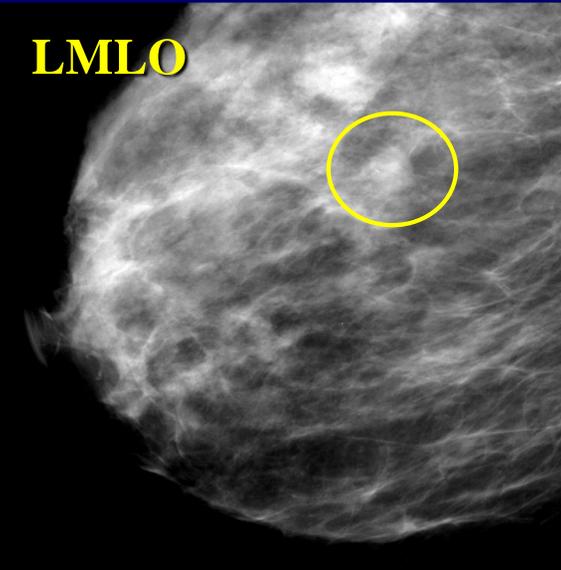
1988

Adapted from Bird et al. ,*Radiology*, 184 (3) (1992)

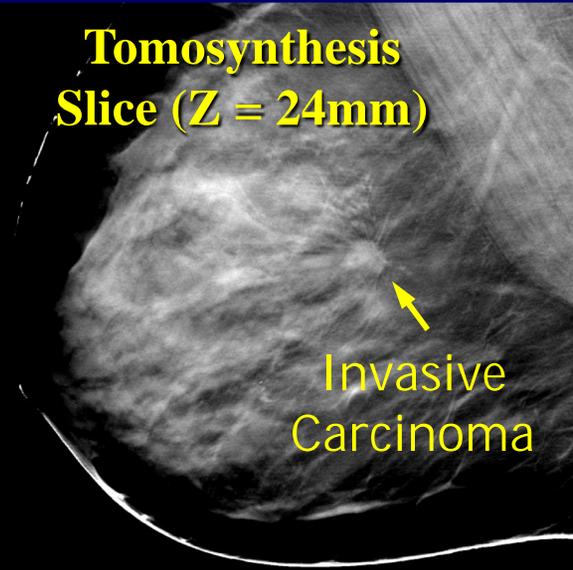
# Digital Breast Tomosynthesis

Potential to Reduce False-Negative Diagnosis

**LMLO**



**Tomosynthesis  
Slice (Z = 24mm)**



**Invasive  
Carcinoma**

D. B. Kopans, MGH



# Computed Tomography (CT)

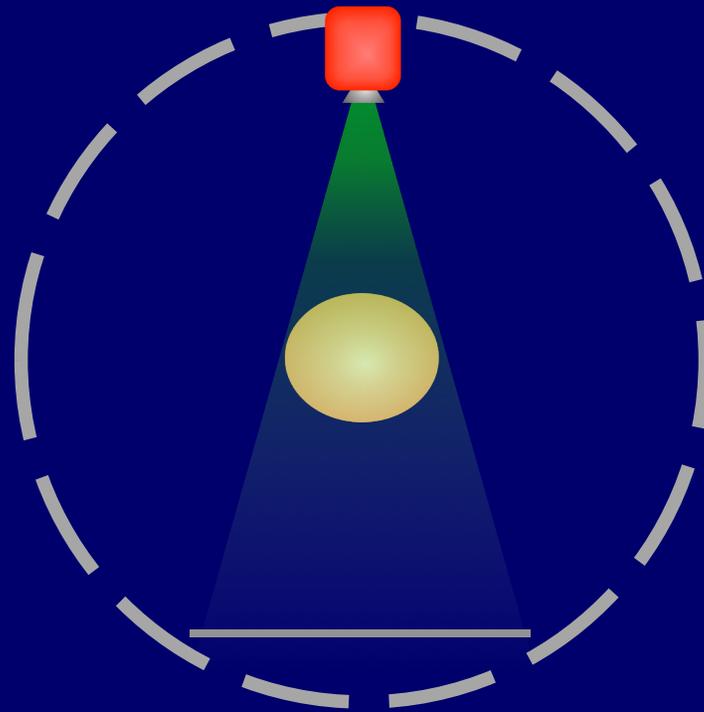


Radon Transform

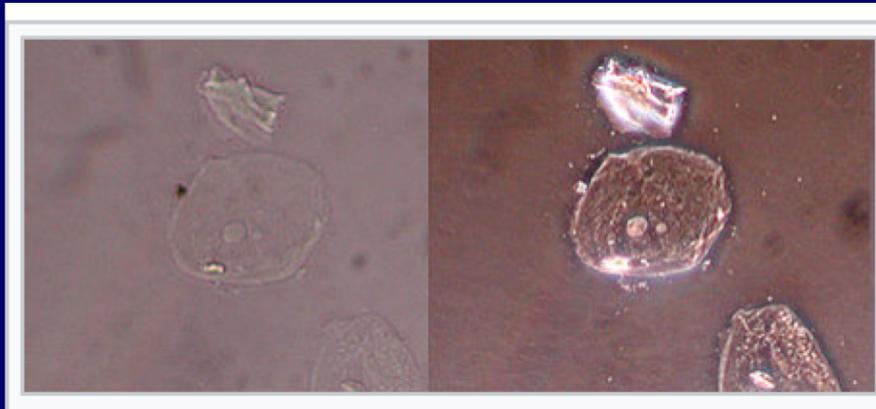
Inverse Radon

Image Reconstruction

Filtered Back Projection



# Zernike

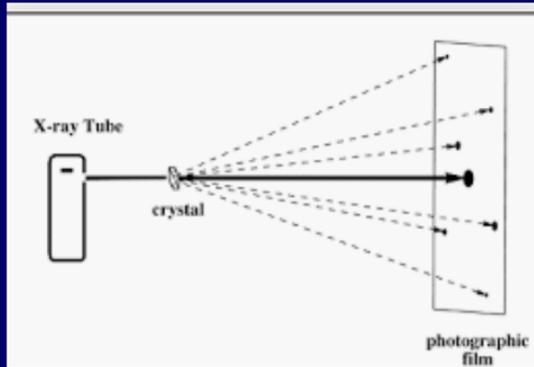


Frits Zernike  
Physics Nobel Prize 1953  
Phase contrast optical microscope

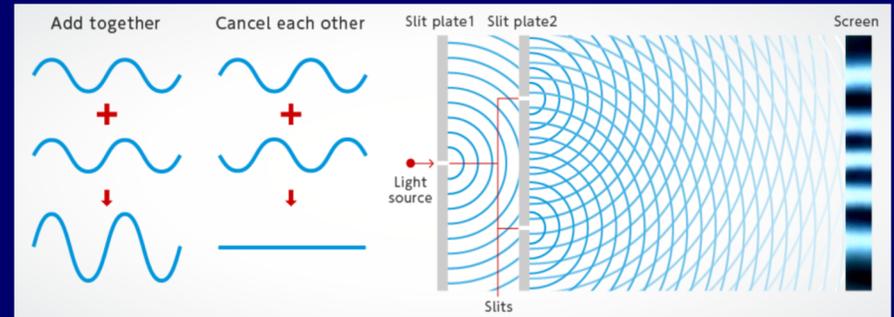
# Wave Nature of X-Rays



Max Von Laue  
Physics- 1914



## Interference



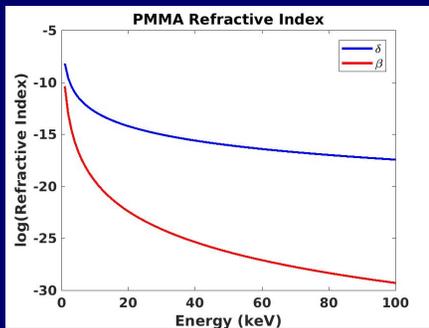
# X-Ray Phase-Contrast Imaging (PCI)

Phase changes (or refractive properties) – contrast mechanism

$$n(E) = 1 - \delta(E) - i\beta(E)$$

Phase      Absorption

$$\delta(E) \gg \beta(E)$$

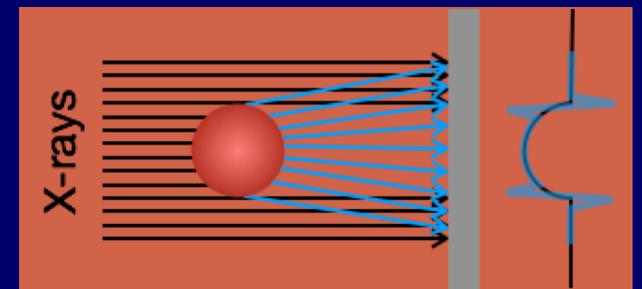


$$\mu = -\frac{4\pi}{\lambda} \int \beta(z) dz$$

Effective atomic number

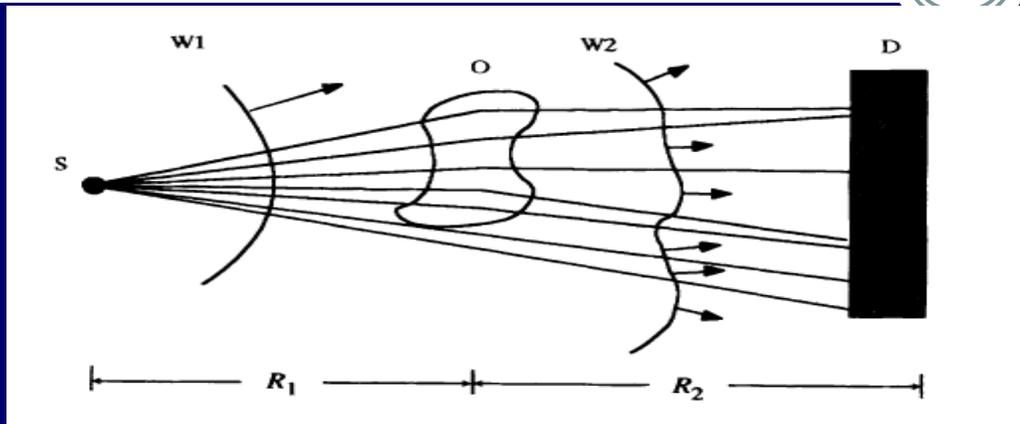
$$\phi = -\frac{2\pi}{\lambda} \int \delta(z) dz$$

Electron density

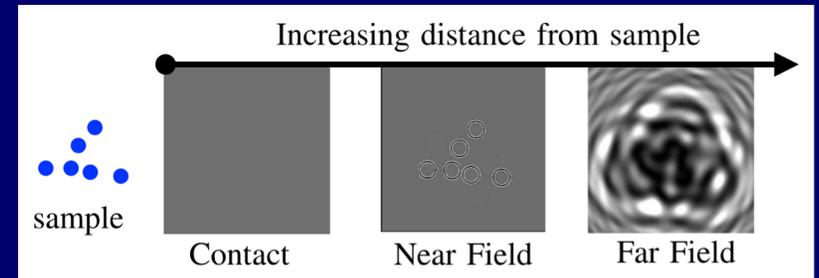


Potential to image at high energy (low dose)

# In-Line Propagation PCI



*Wilkins, Nature (1996)*

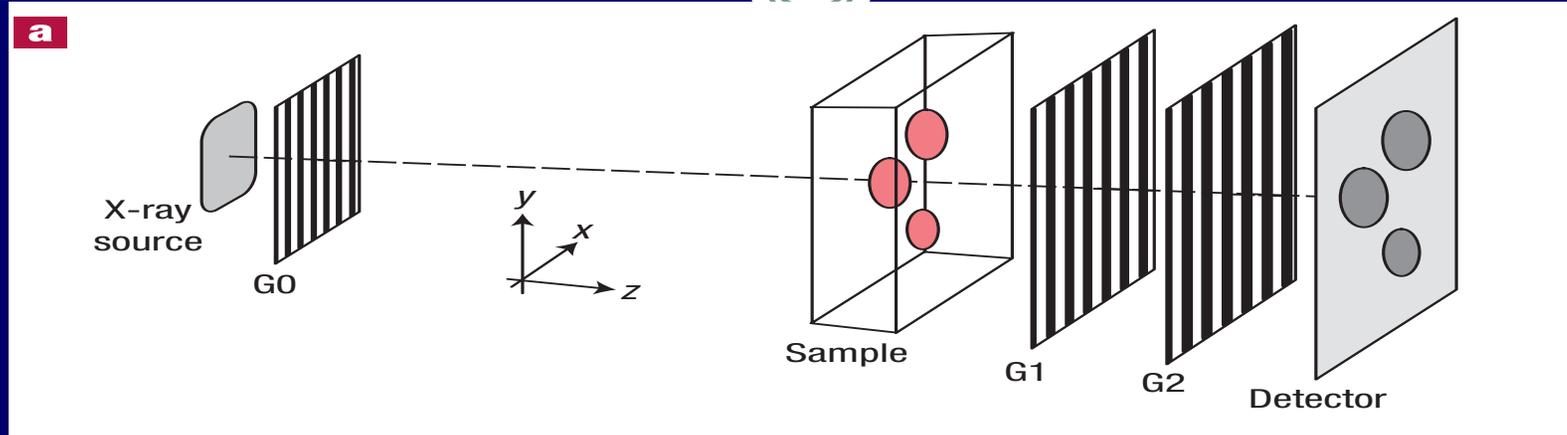


Wave-front distortions due to the object leads to intensity modulations

Requires: High coherence x-ray source,  
High resolution detectors (tens of  $\mu\text{m}$ )



# Grating Interferometry PCI



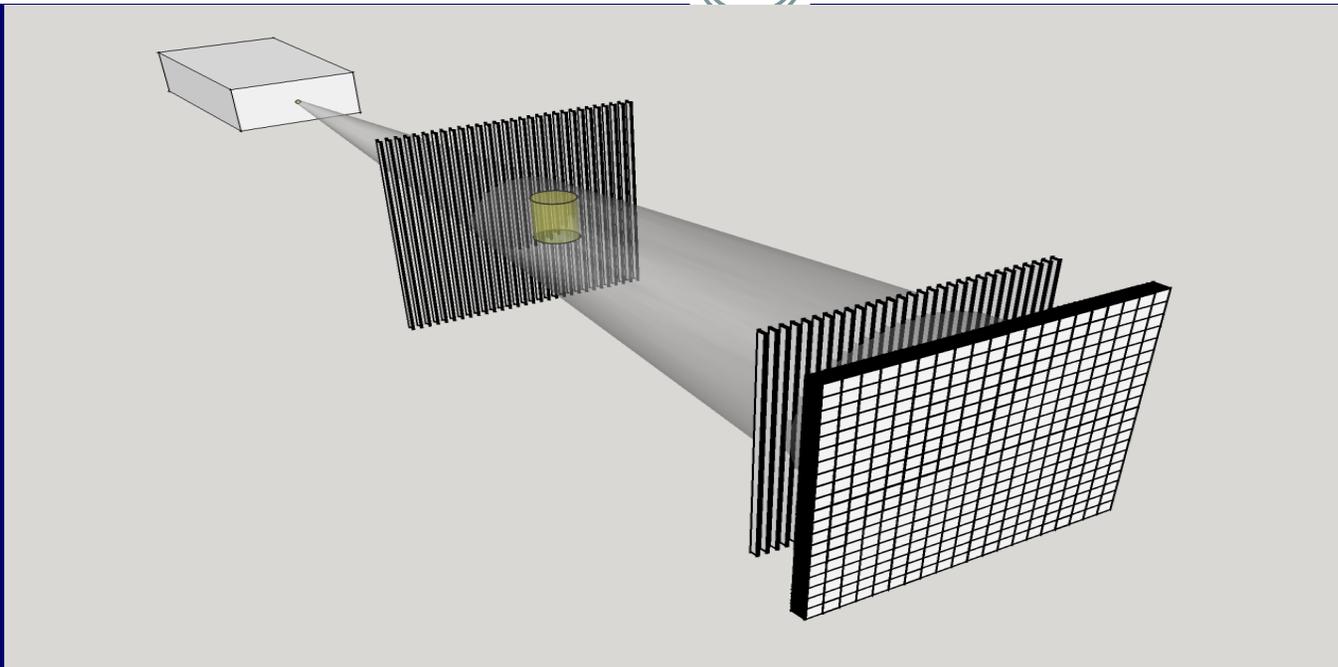
Talbot-Lau interferometer

Multiple highly precise measurements required

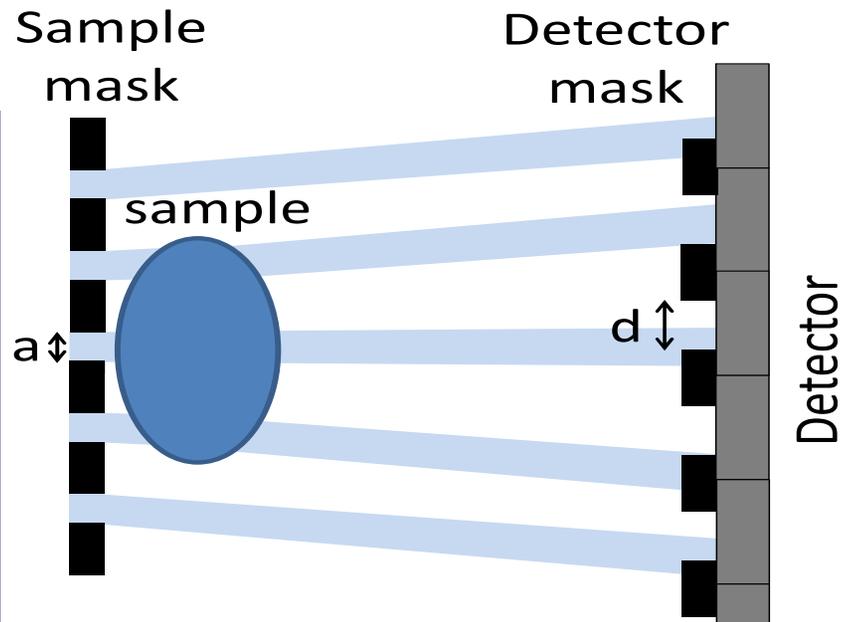
Requires gratings of very small period  $< 5\mu\text{m}$

*Pfeiffer et al, Nature (2006)*

# Coded-Aperture (CA) PCI

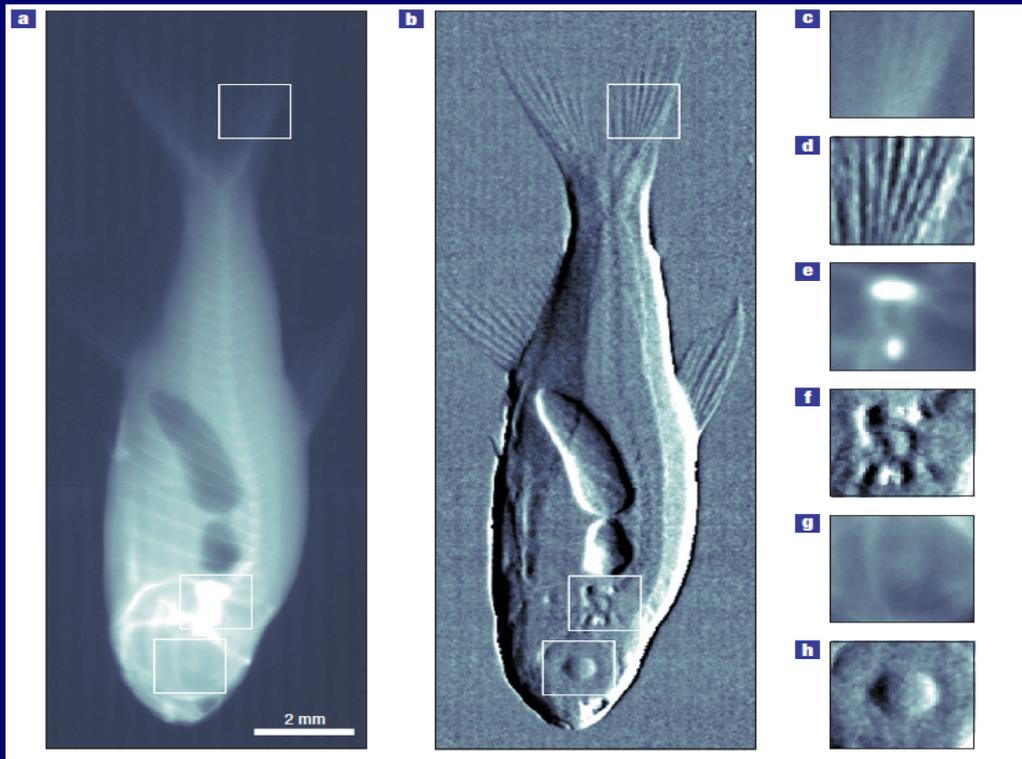


A. Olivo, UC London



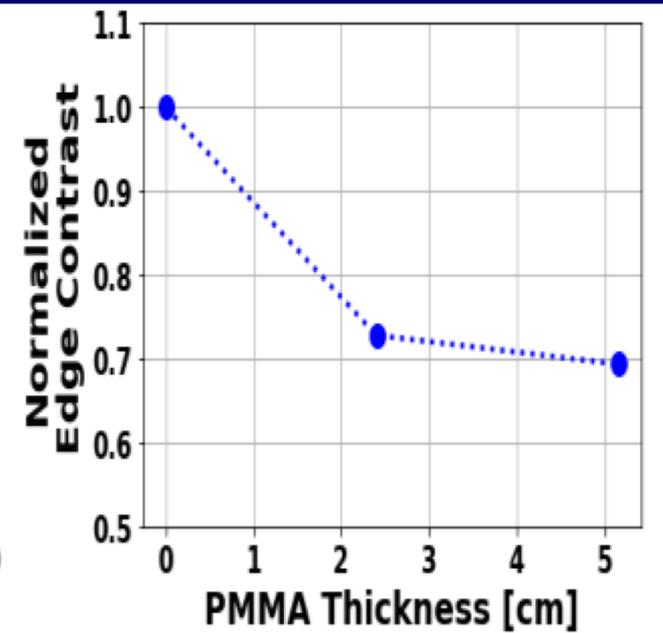
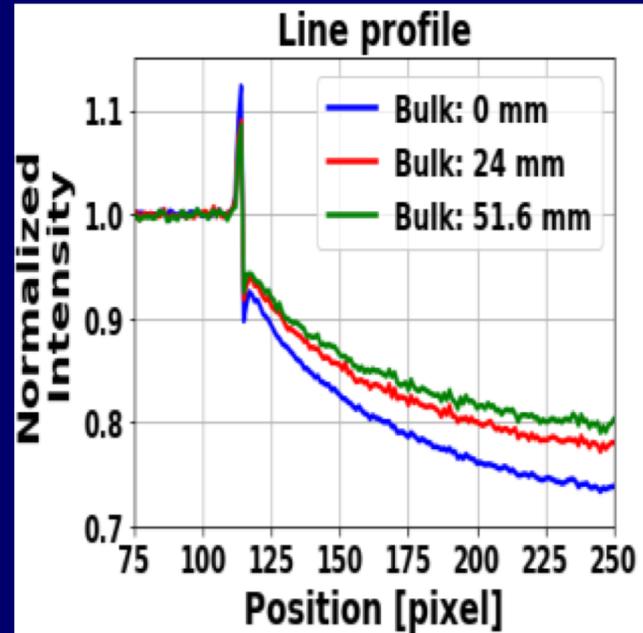
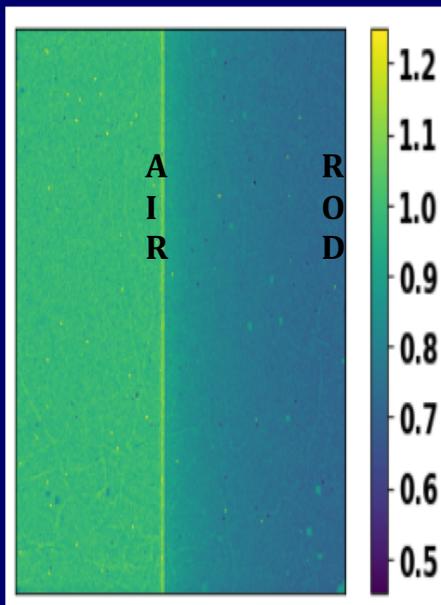
An edge-illumination effect is created using a pair of mutually displaced masks  
- Refraction effect ; not Interference

# PCI Image

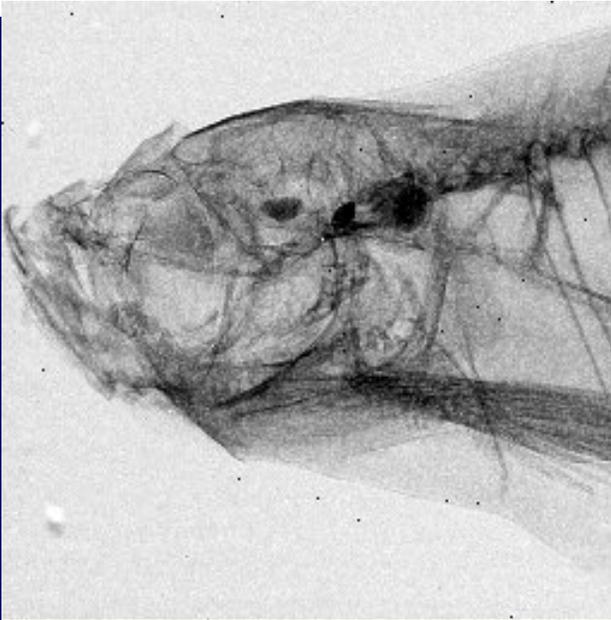


*Pfeiffer et al, Nature (2006)*

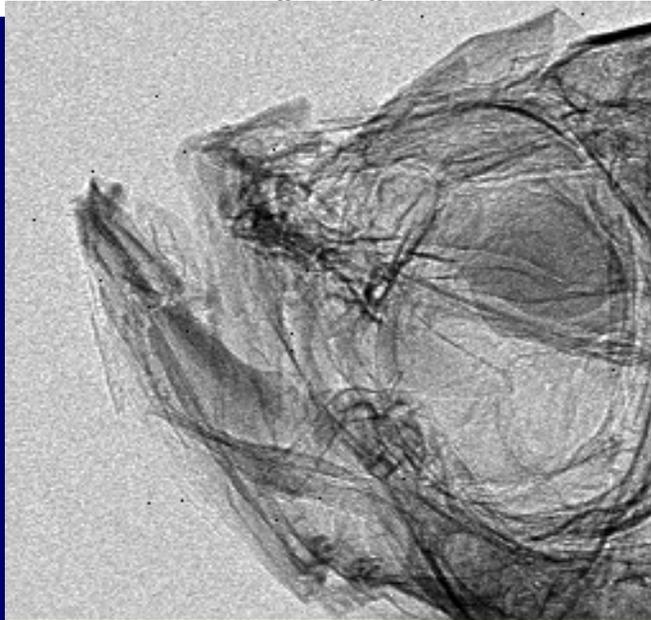
# Effect of Object Thickness on PCI Signal



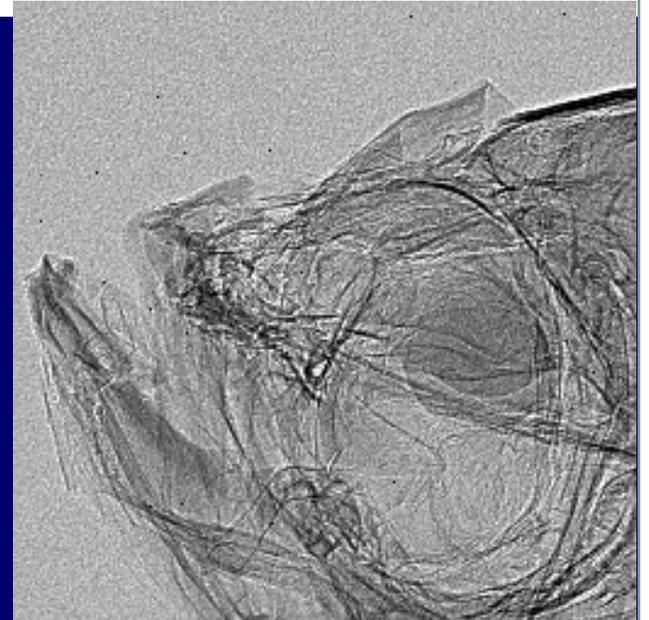
# Zebra Fish- Spectral PCI



Non-Phase Contrast



Phase Contrast  
~25keV



Phase Contrast  
30-100keV

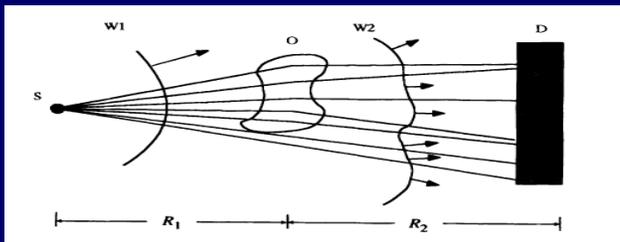
# Spectral Phase Retrieval

- Absorption and phase change due to propagation creates intensity variations

$$\frac{2\pi}{\lambda} \frac{\partial I}{\partial z} = -\nabla \cdot (I \nabla \phi)$$

$$I(R_2, E) = I(R_1, E) \left( 1 - \frac{R_2 \nabla^2 \phi}{k} \right)$$

$$I(R_1, E) = I_0(R_1, E) \exp\left(-\int \mu(E) dz\right)$$



Gursoy, Das (2013)

$$\mu(E) = NK \frac{Z^5}{e^3(E)} + NZ\sigma_{KN}(E)$$

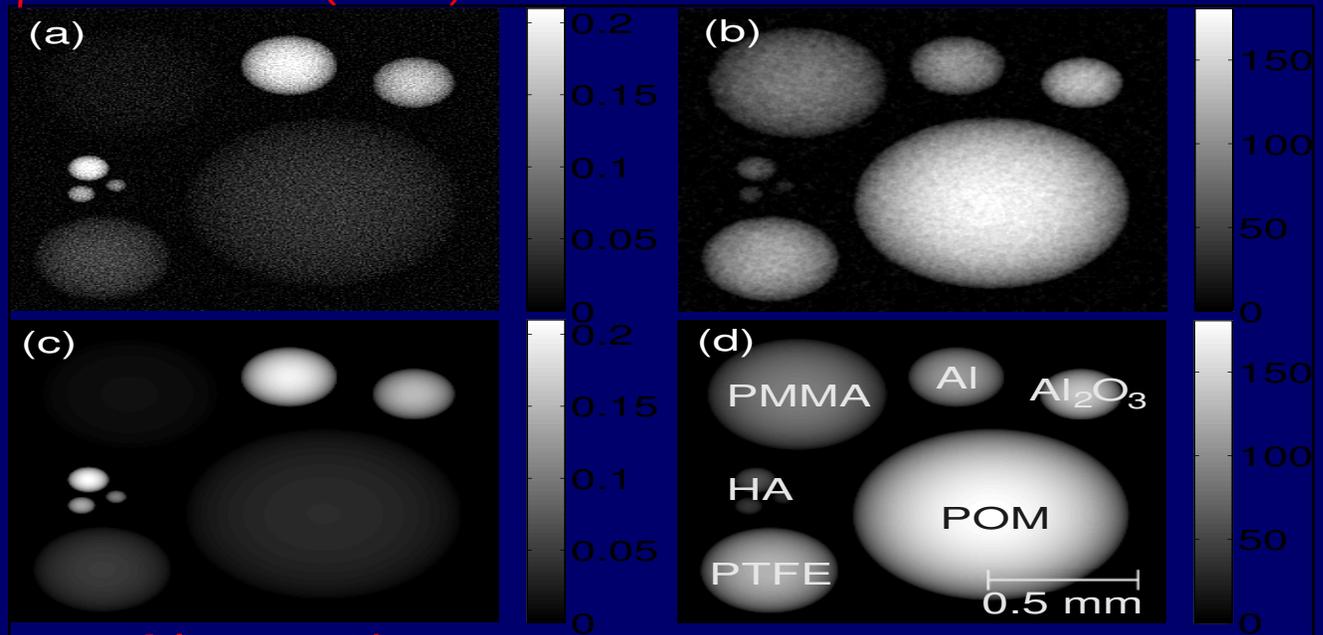
↓  
Photoelectric

↓  
Compton Scatter

# Single-Step Spectral PCI

Gursoy and Das, *Optics Letters* (2013)

Estimated



Ground Truth

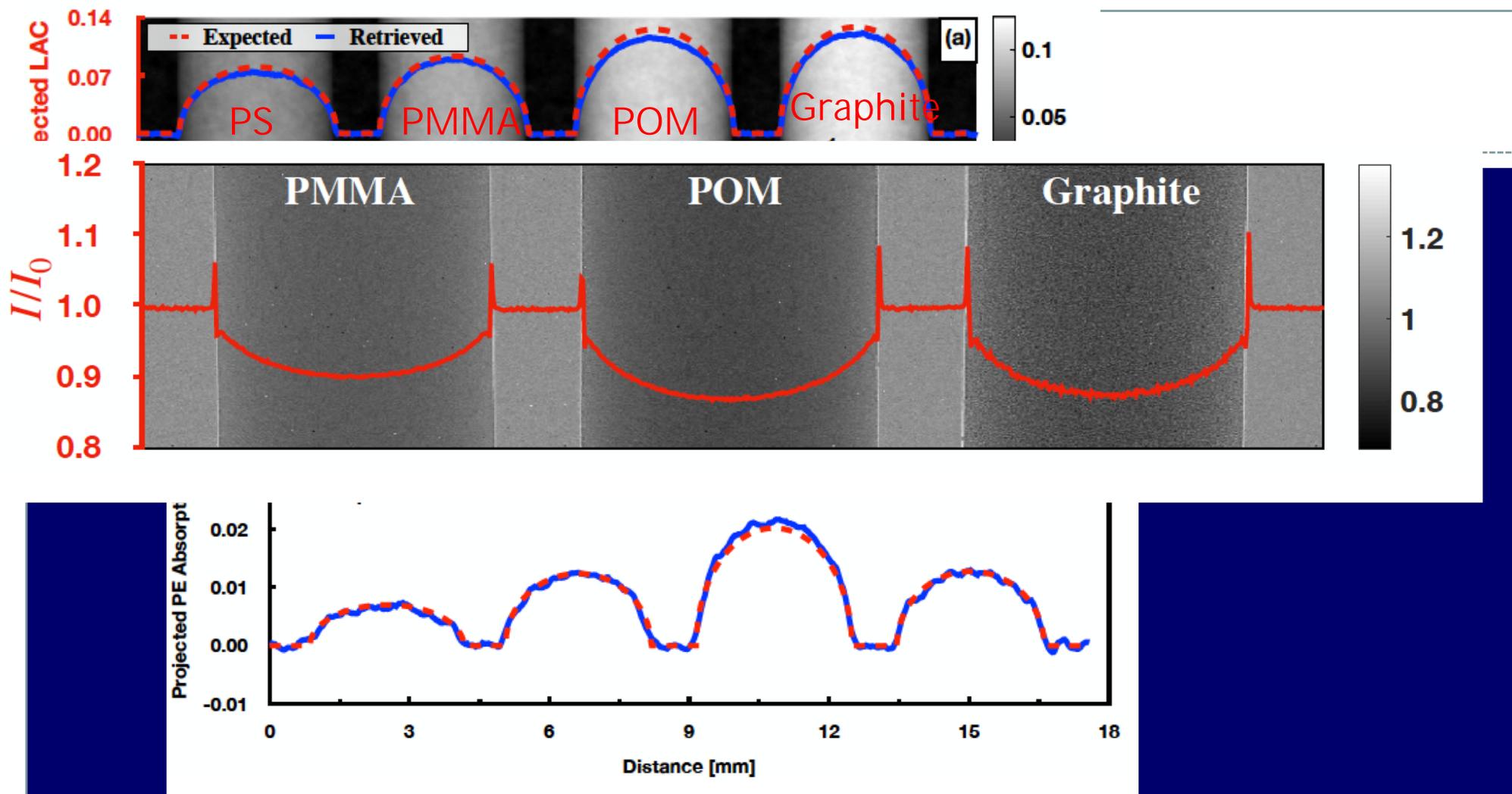
Absorption

Phase

~ Effective Atomic Number

~ Electron Density



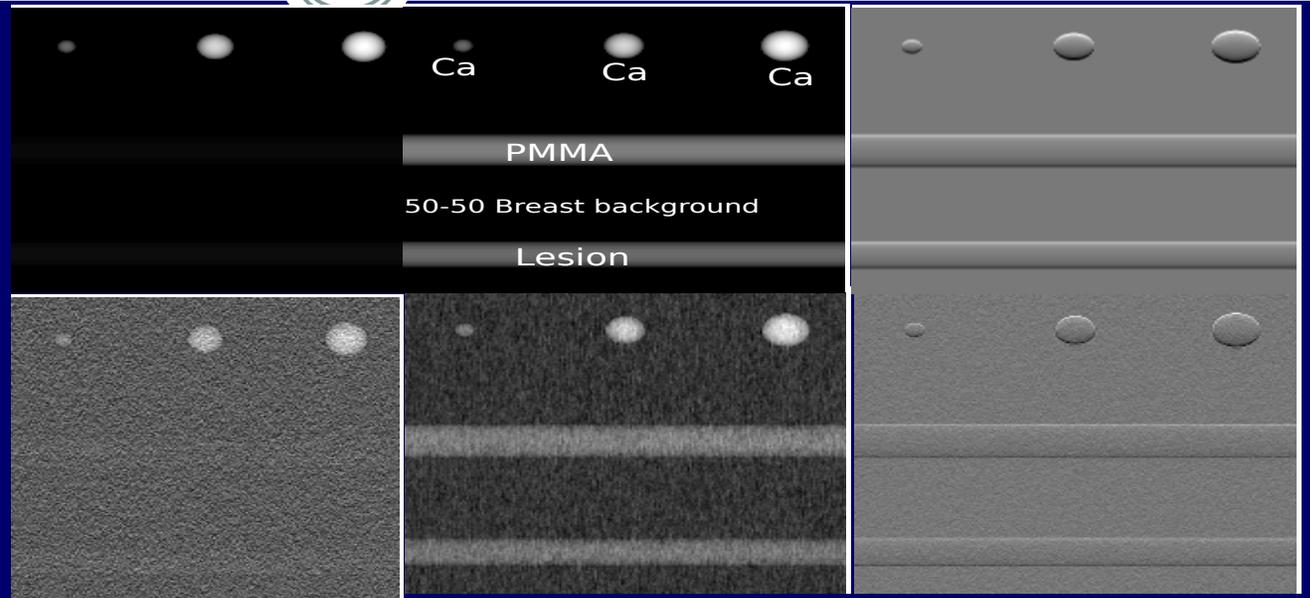


# Single-Step Retrieval of Absorption, Phase and Differential Phase (*Projection Image*)

True

Signals in 5cm  
thick breast-like  
soft tissue

Retrieved



Absorption

Phase

Differential Phase

Mini Das and Zhihua Liang vol. 39, 21, Optics Letters, 2014

Mini Das, Cancer Education (Houston), 2019

# Spectral x-ray phase contrast imaging for single-shot retrieval of absorption, phase, and differential-phase imagery

Mini Das<sup>1,\*</sup> and Zhihua Liang<sup>2</sup>

<sup>1</sup>*Department of Physics, University of Houston, Houston, Texas 77004, USA*

<sup>2</sup>*Department of Biomedical Engineering, University of Houston, Houston, Texas 77004, USA*

*\*Corresponding author: mdas@uh.edu*

Received August 27, 2014; revised September 25, 2014; accepted September 28, 2014;  
posted September 30, 2014 (Doc. ID 221791); published October 31, 2014

In this Letter, we propose the first single-shot, noninterferometric x-ray imaging method for simultaneous retrieval

# Approximated transport-of-intensity equation for coded-aperture x-ray phase-contrast imaging

Mini Das\* and Zhihua Liang

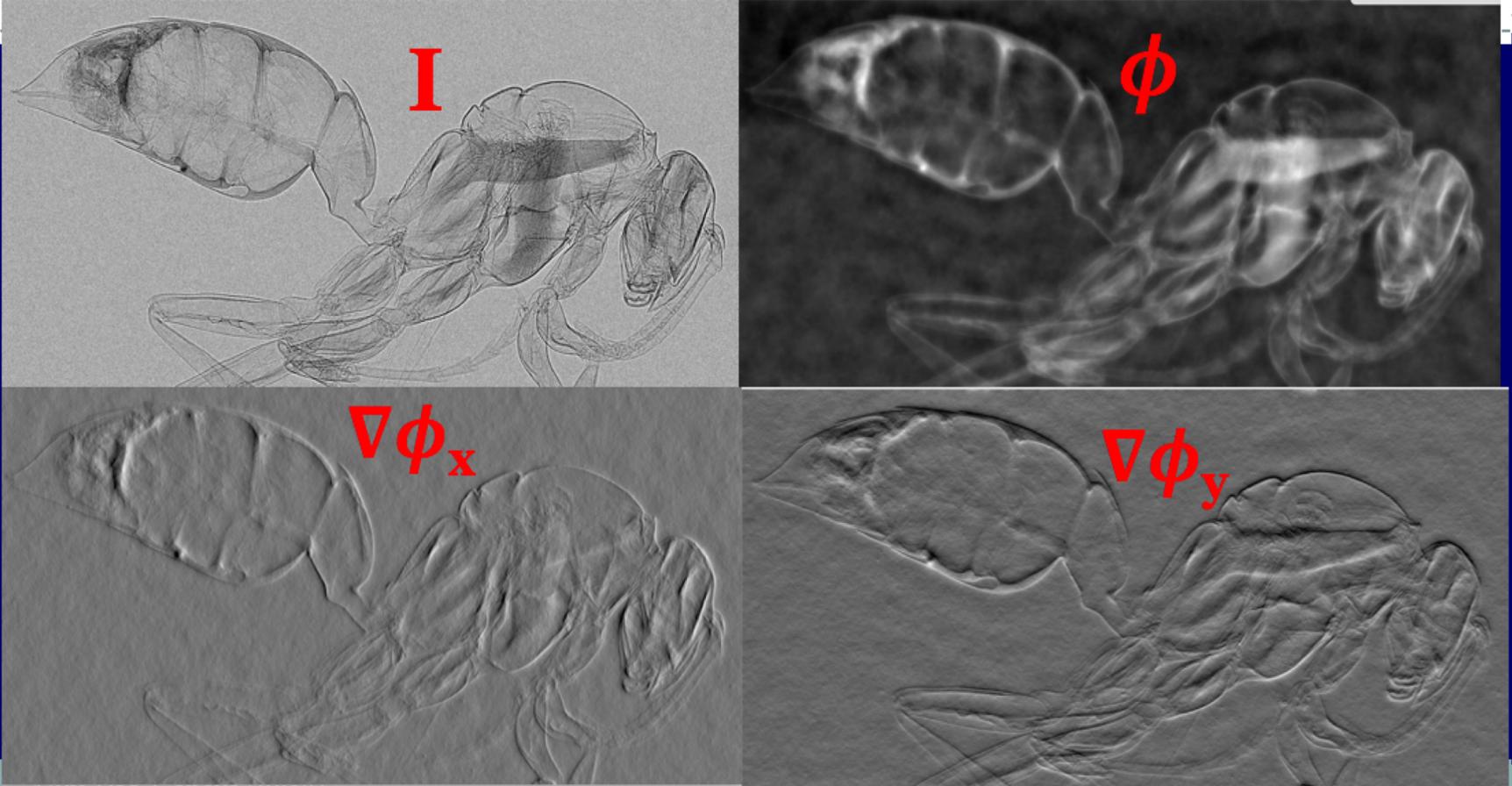
*Department of Physics, University of Houston, Houston, Texas 77204, USA*

*\*Corresponding author: mdas@uh.edu*

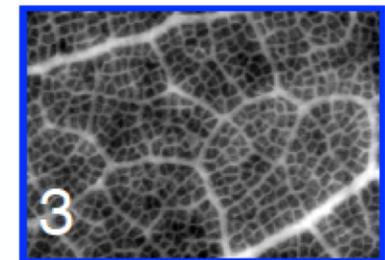
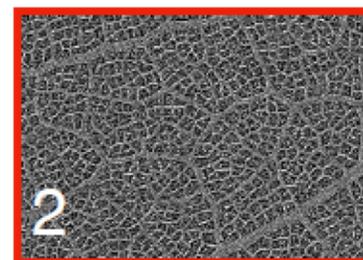
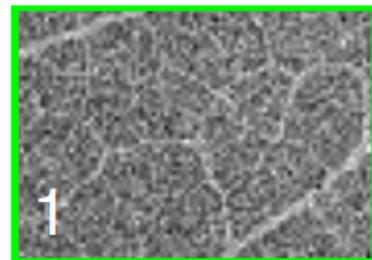
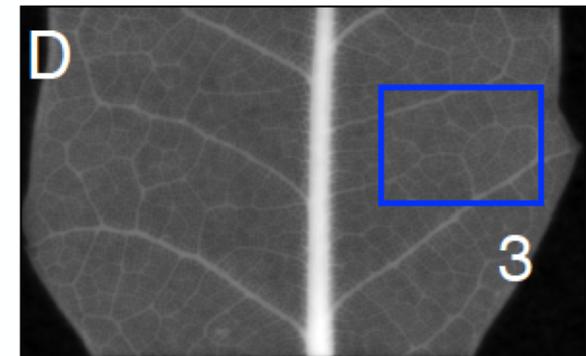
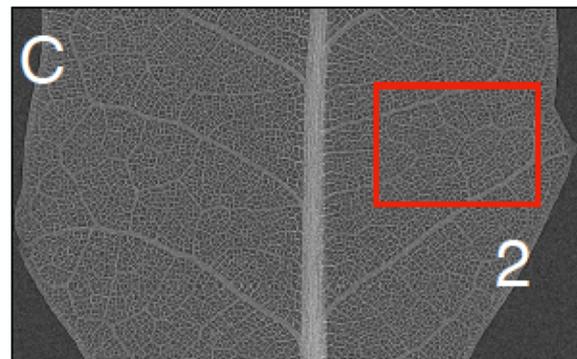
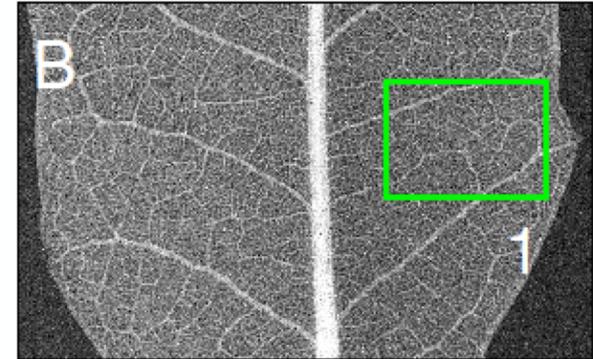
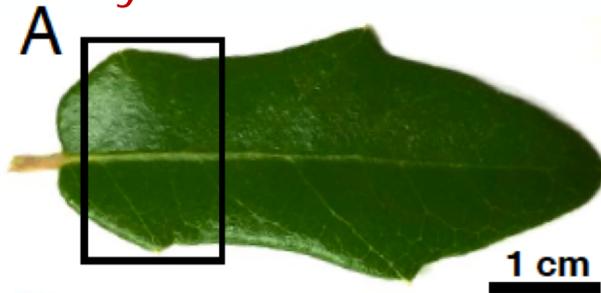
Received June 16, 2014; revised July 30, 2014; accepted July 30, 2014;  
posted August 4, 2014 (Doc. ID 214101); published September 12, 2014

Transport-of-intensity equations (TIEs) allow better understanding of image formation and assist in simplifying the

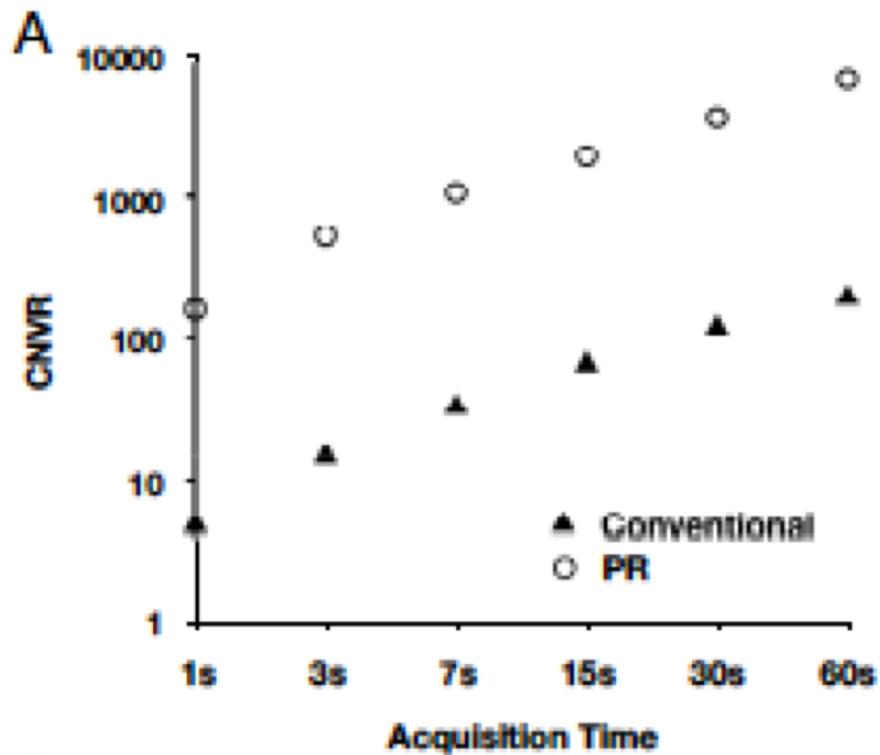
# Propagation PCI – Additional Signatures



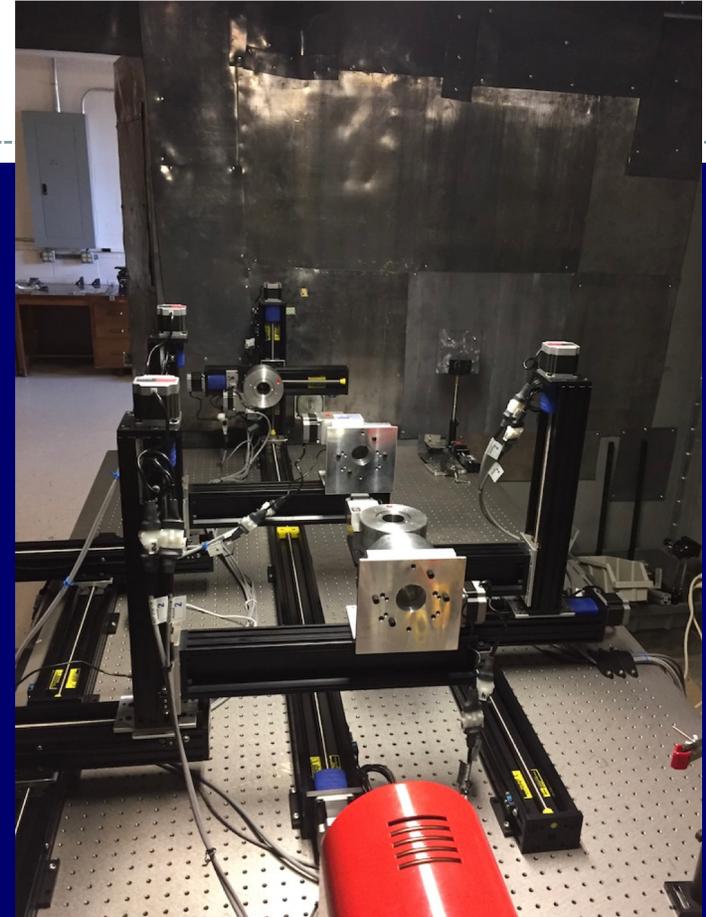
# Quercus Emoryi/Emory Oak



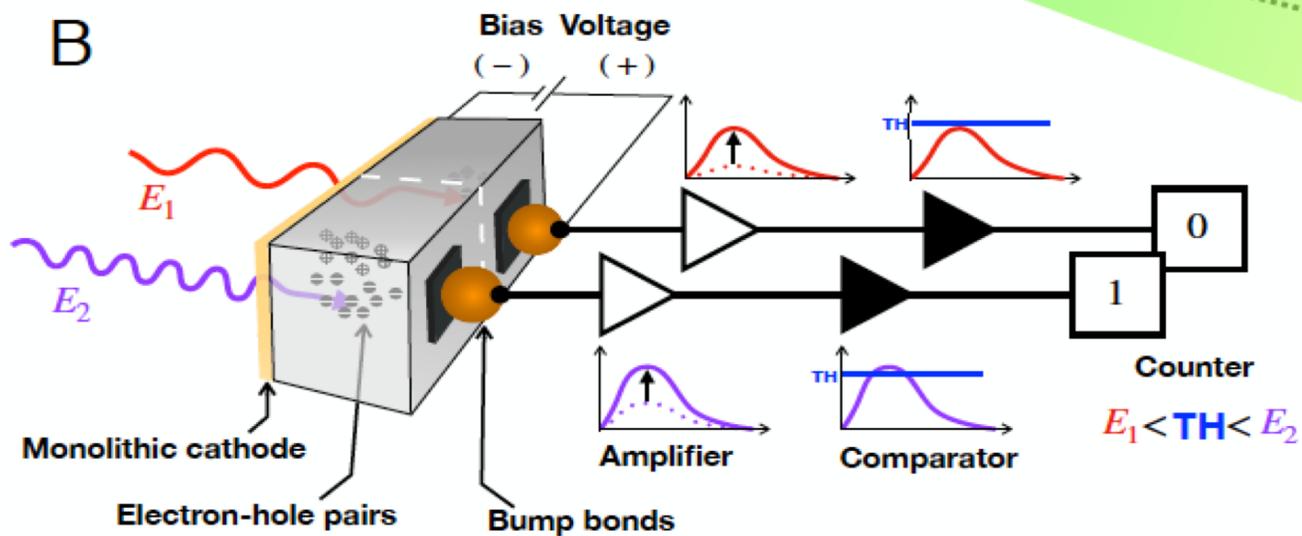
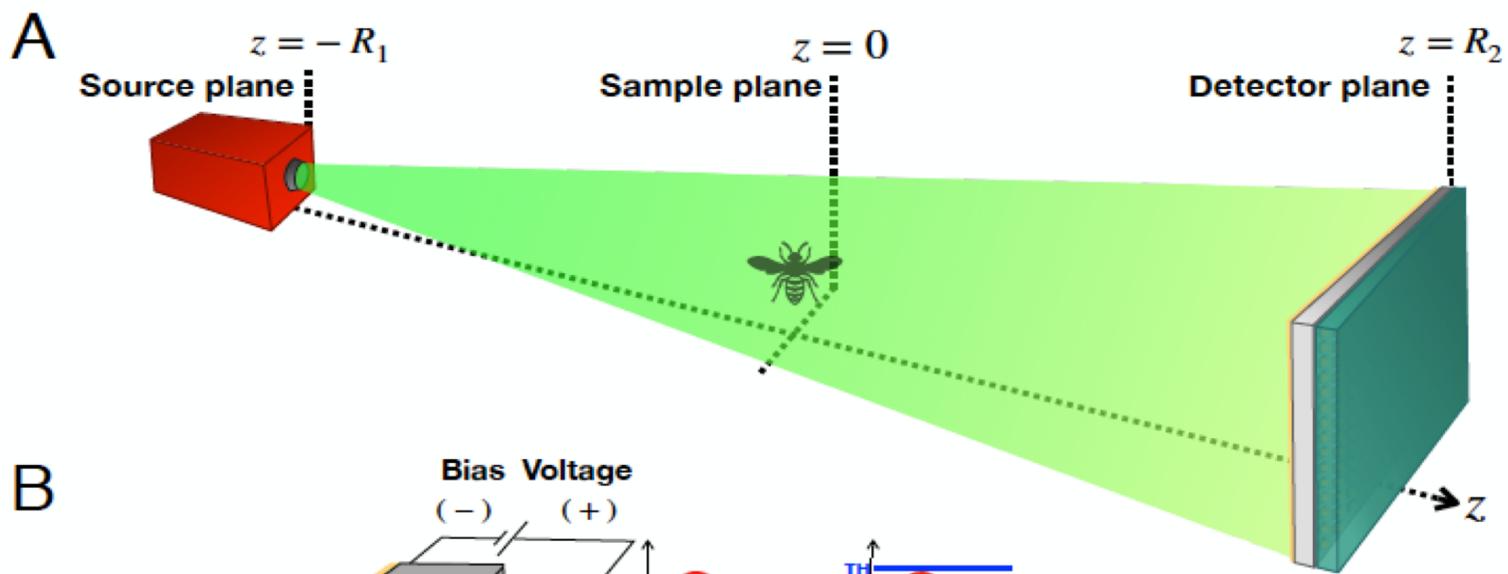
# Low-Photon Count Phase Retrieval



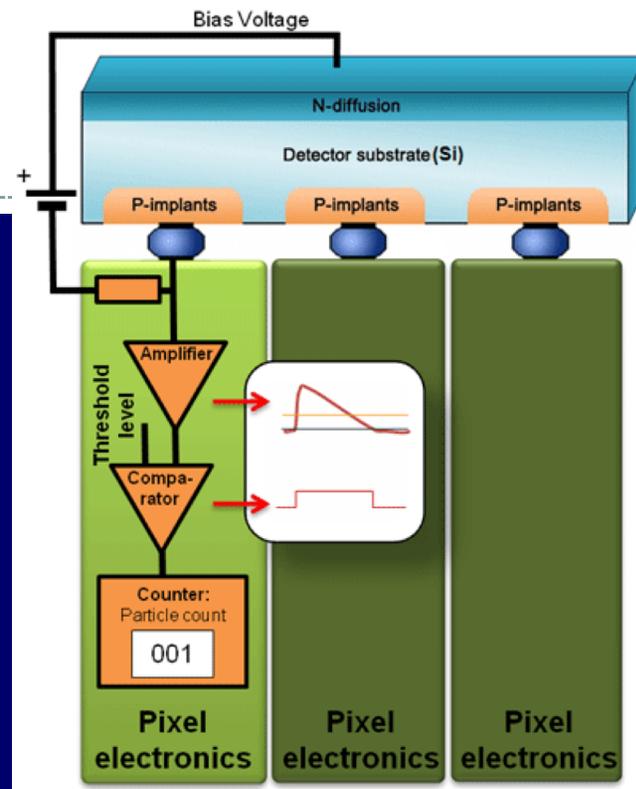
SPIE Medical Imaging 2020  
Houston, TX



Mini Das, Cancer Education (Houston), 2019

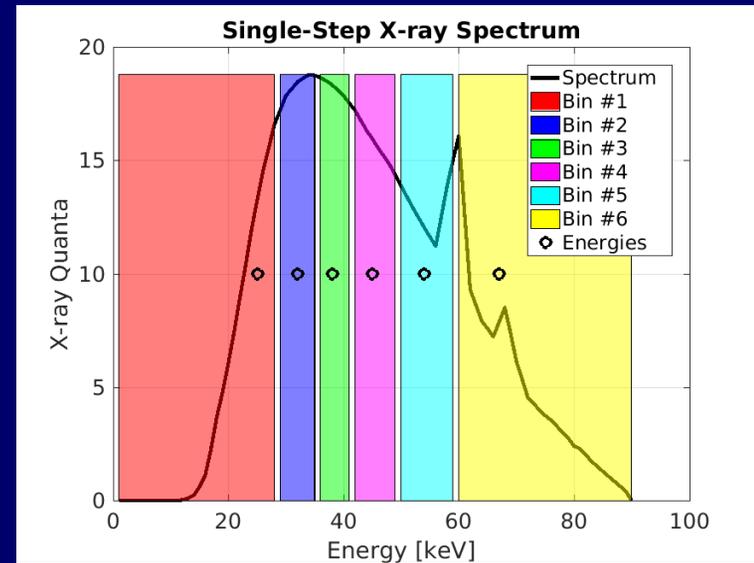
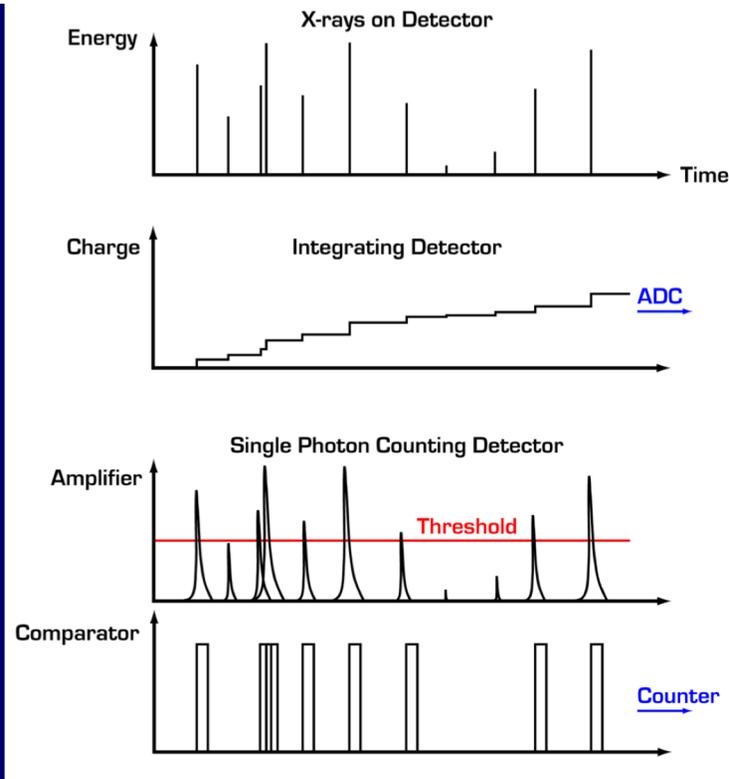


# Photon Counting Spectral Detectors



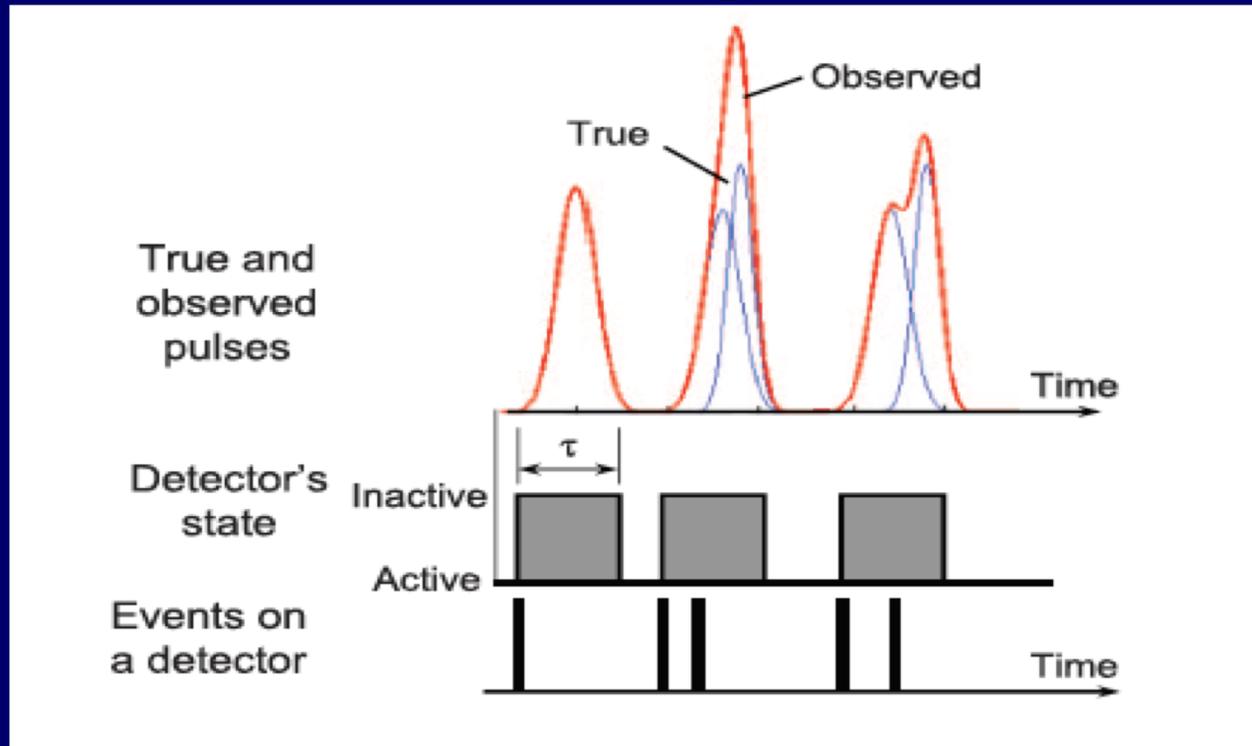
Images:  
<http://aladdin.utef.cvut.cz/>

# Spectral detection

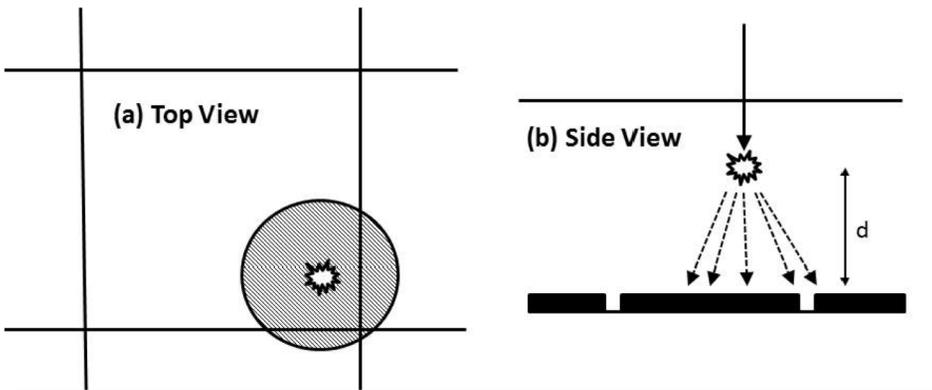


Vespucci, Das (2019) IEEE Transactions of Medical Imaging

# Pulse Pile-up

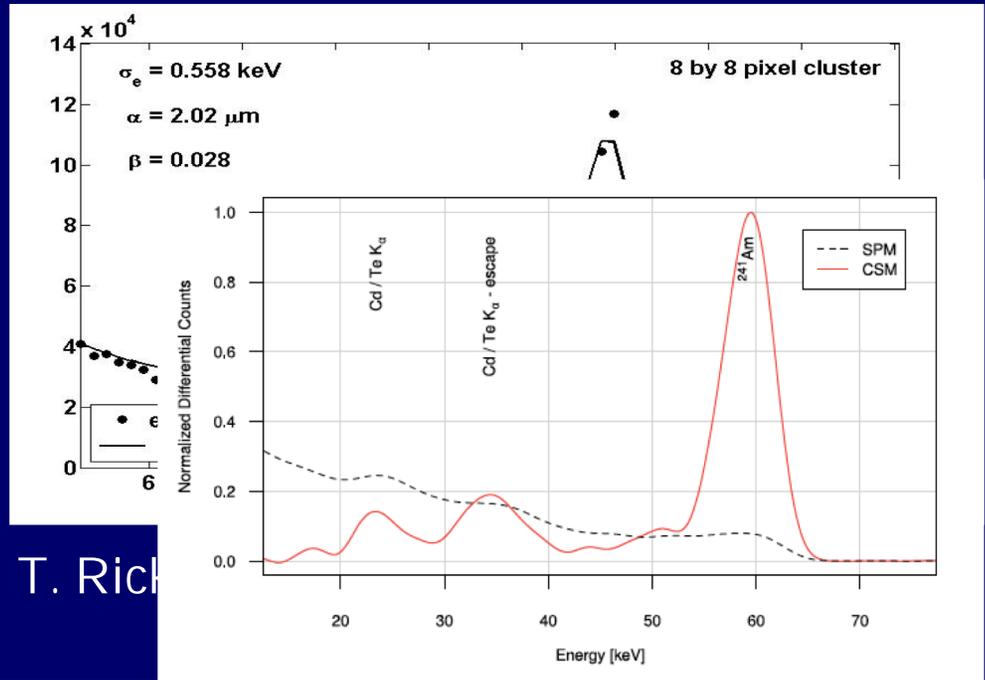


# Charge Sharing



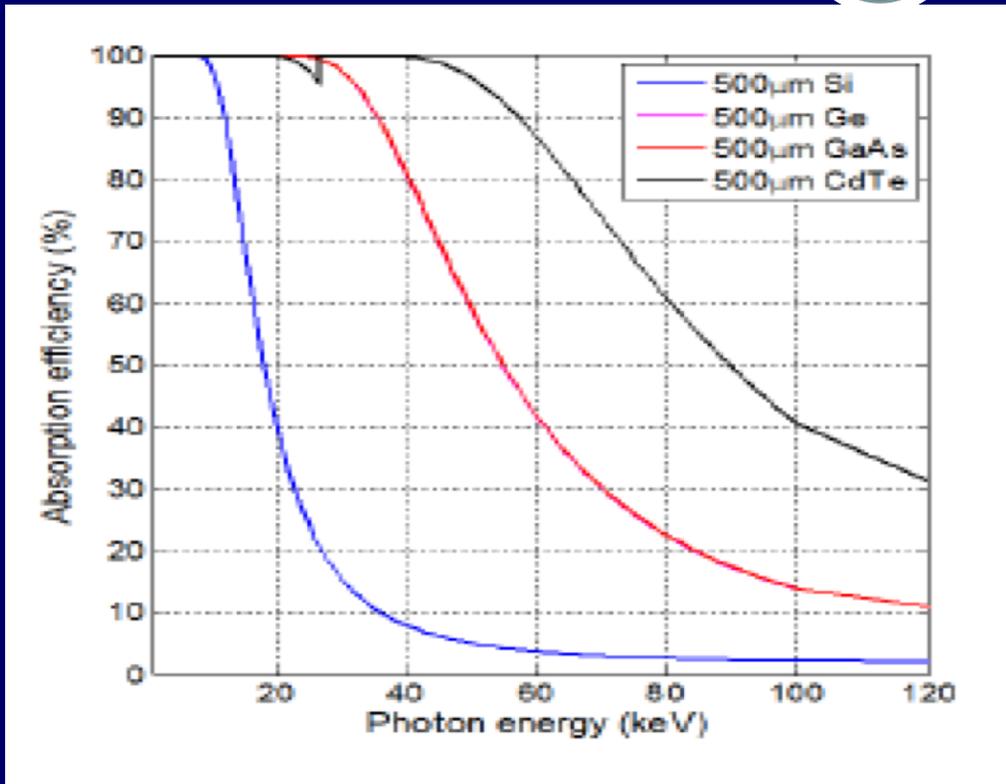
Charge Summing Mode

## X-Ray fluorescence - Zr



T. Rich

# Sensor Material



CdTe Sensor

Crystal defects

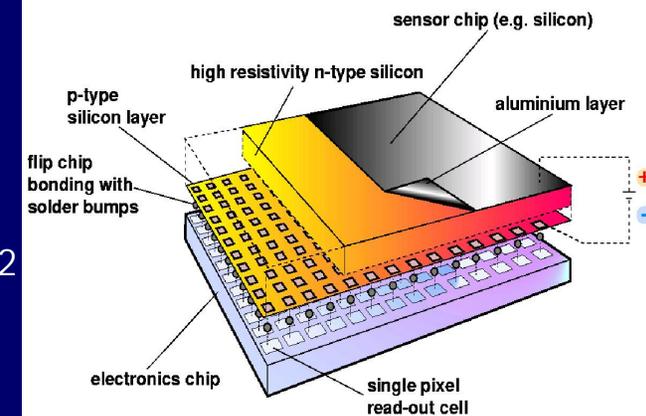
Temporal instability

Thermal instability

# Single Quantum Processing

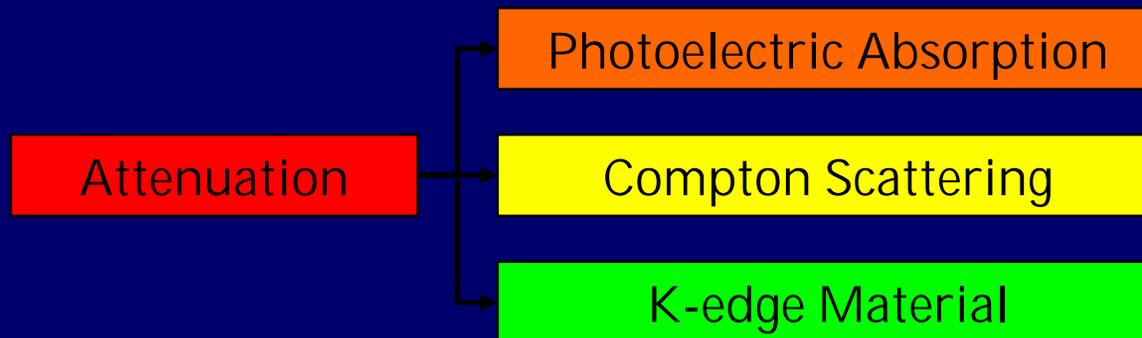
- ➔ Medipix Collaboration (CERN , Geneva)
- ➔ Medipix3RX – Current version
  - Flux tolerance ~ 70 million photons/second/mm<sup>2</sup>
  - Includes charge sharing correction hardware
  - 2 – 8 energy bins at once
- ➔ Timepix – Time of arrival of detected photons

Time over Threshold (TOT Operation)



# Physical Basis Functions

$$\mu(E, \vec{r}) = f_{ph}(E)\alpha_{ph}(\vec{r}) + f_C(E)\alpha_C(\vec{r}) + f_K(E)\alpha_K(\vec{r})$$



# Image Domain Material Decomposition



$$\mu(E, \vec{r}) = \mu_1(E) f_1(\vec{r}) + \mu_2(E) f_2(\vec{r}) + \mu_3(E) f_3(\vec{r}) + \dots$$

$\mu(E, \vec{r})$ : Linear attenuation coefficient [1 / cm]

$\mu_M(E, \vec{r})$ : Mass attenuation coefficient [g / cc]

$f(\vec{r})$ : Volume fraction [0 - 1]

Attenuation

Volume Fraction Material #1

Volume Fraction Material #2

Volume Fraction Material #3

$$\mu(E, \vec{r}) = \mu_{M1}(E) \rho_1 f_1(\vec{r}) + \mu_{M2}(E) \rho_2 f_2(\vec{r}) + \mu_{M3}(E) \rho_3 f_3(\vec{r}) + \dots$$

# Single-Step Decomposition

$I(E_1, x, y)$

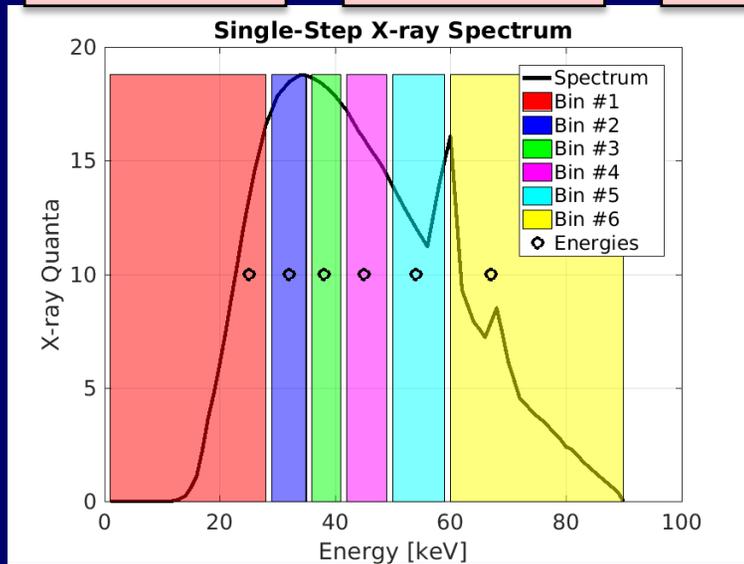
$I(E_2, x, y)$

$I(E_3, x, y)$

$I(E_4, x, y)$

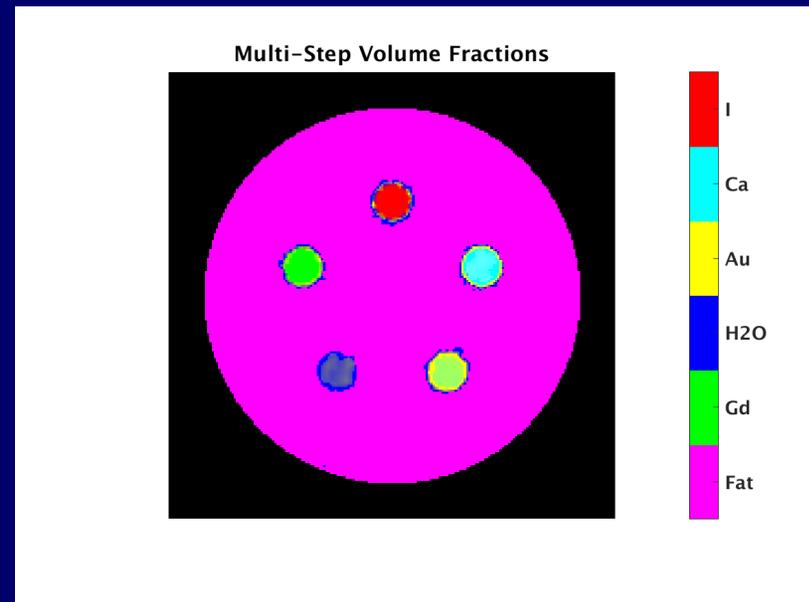
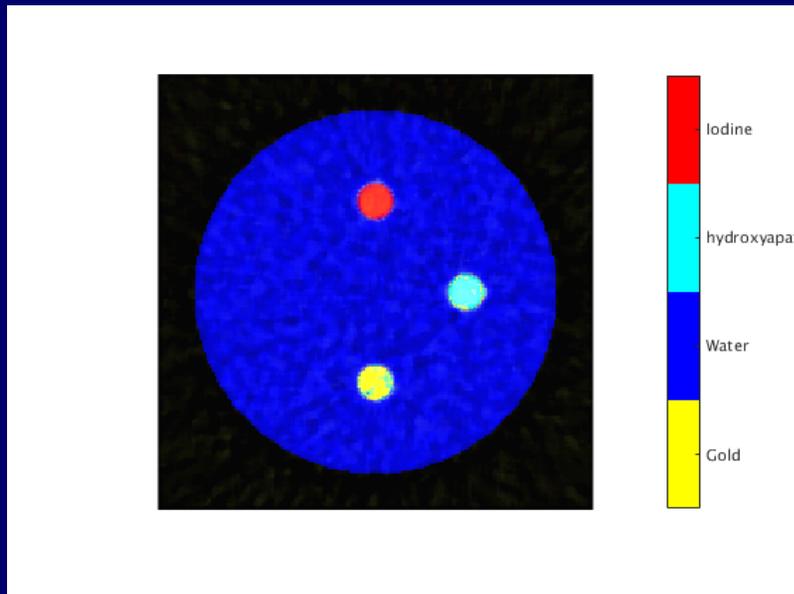
$I(E_5, x, y)$

$I(E_6, x, y)$



$$\mu(E, \vec{r}) = \mu_1(E) f_1(\vec{r}) + \mu_2(E) f_2(\vec{r}) + \mu_3(E) f_3(\vec{r}) + \dots$$

# Multi-Material Decomposition in Single Step



Nate Fredette et al. , SPIE (2017), PMB (2019)

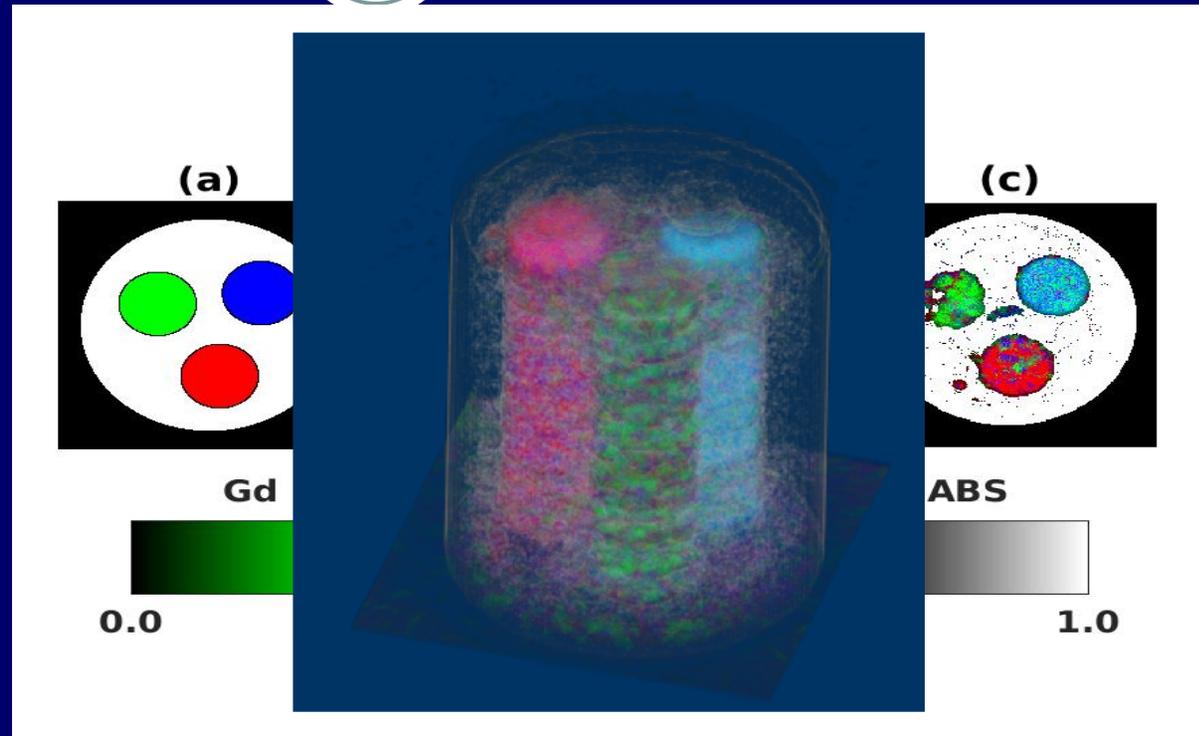
# Experimental Results

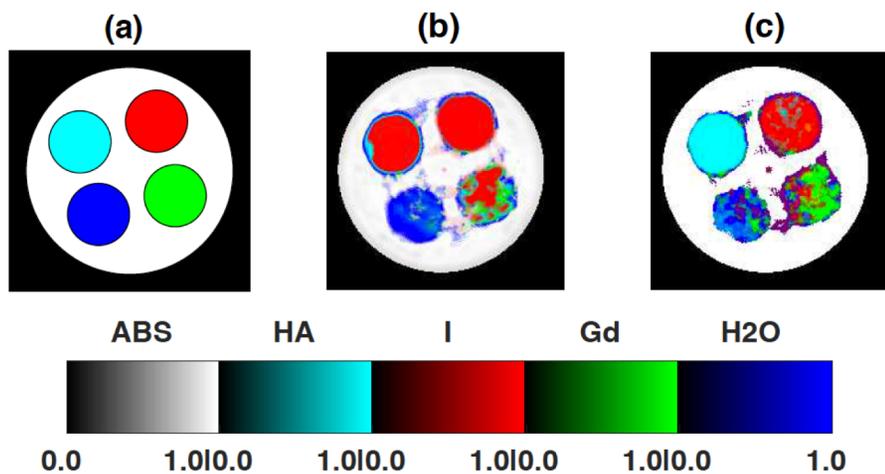
## Multi-step Material Decomposition:

Fredette, Kavuri, Das  
(2017)(2019)

## Applications:

Targeted drug delivery,  
Multi-contrast imaging  
Chemical imaging

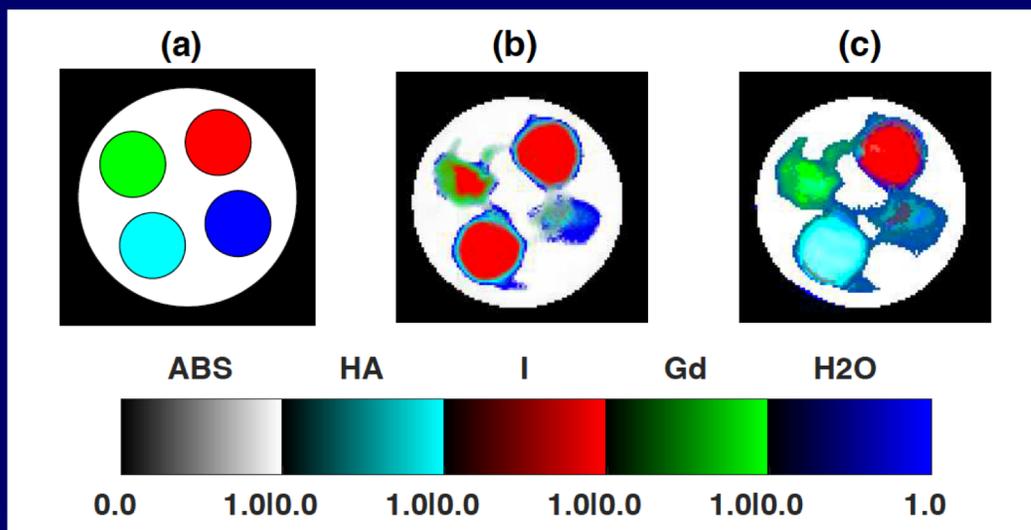


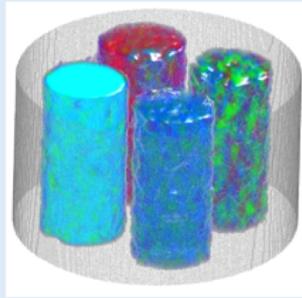
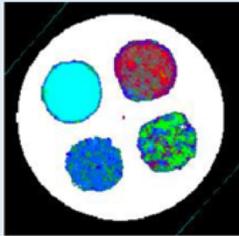
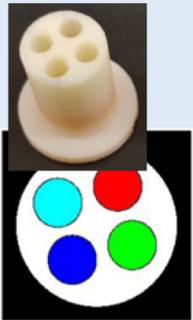


Silicon detector, 55 micrometer pitch

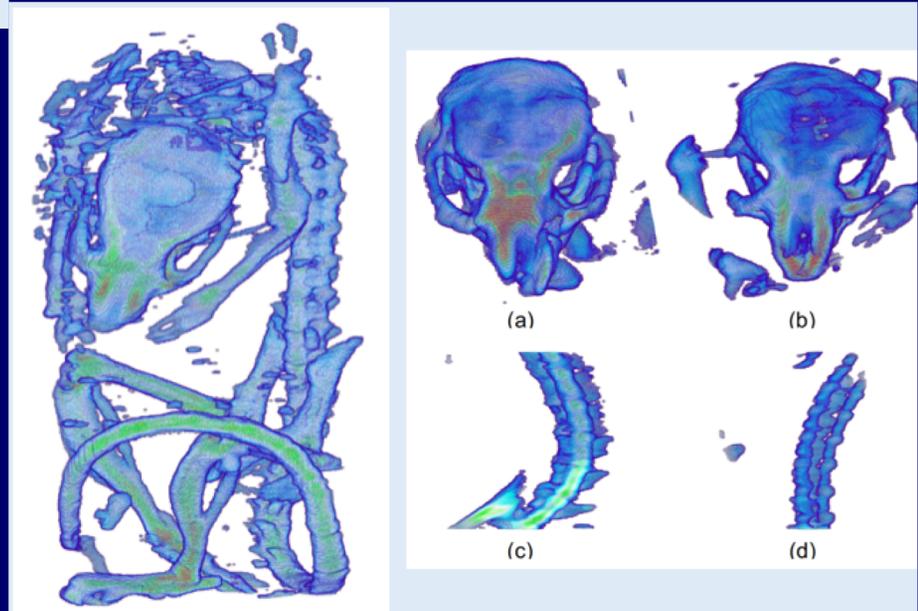
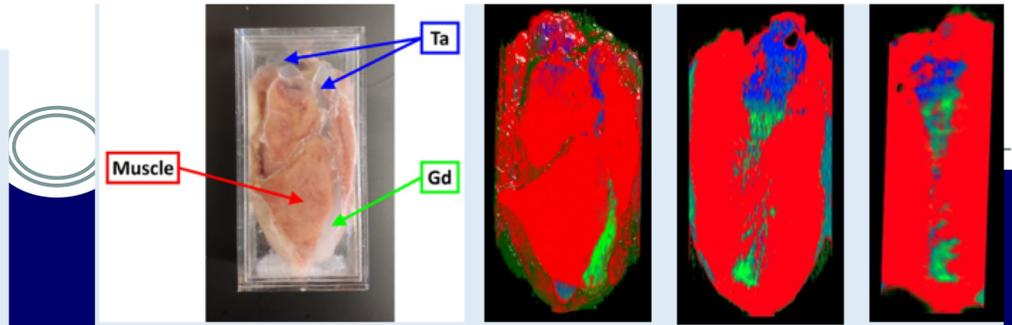
CdTe, 110 micrometer

Highlighted in  
Feature Article "X-Ray Images  
in Full Color  
Nature Reviews Physics (2019)





Iodine, Gd, water, Ca in plastic



# Psychophysics



- Will lesion detectability improve with these emerging modalities?
- Task-based assessments
- **Virtual clinical trials**  
-**Machine learning**

# DBT- Image Acquisition and Reconstruction

- Three different densities of phantoms
  - 25%, 50%, 75%
- Projections acquired over four different arc spans
  - 30°, 45°, 60°, 75°
- For each arc span, we considered a number of projections ranging from 3 to 51

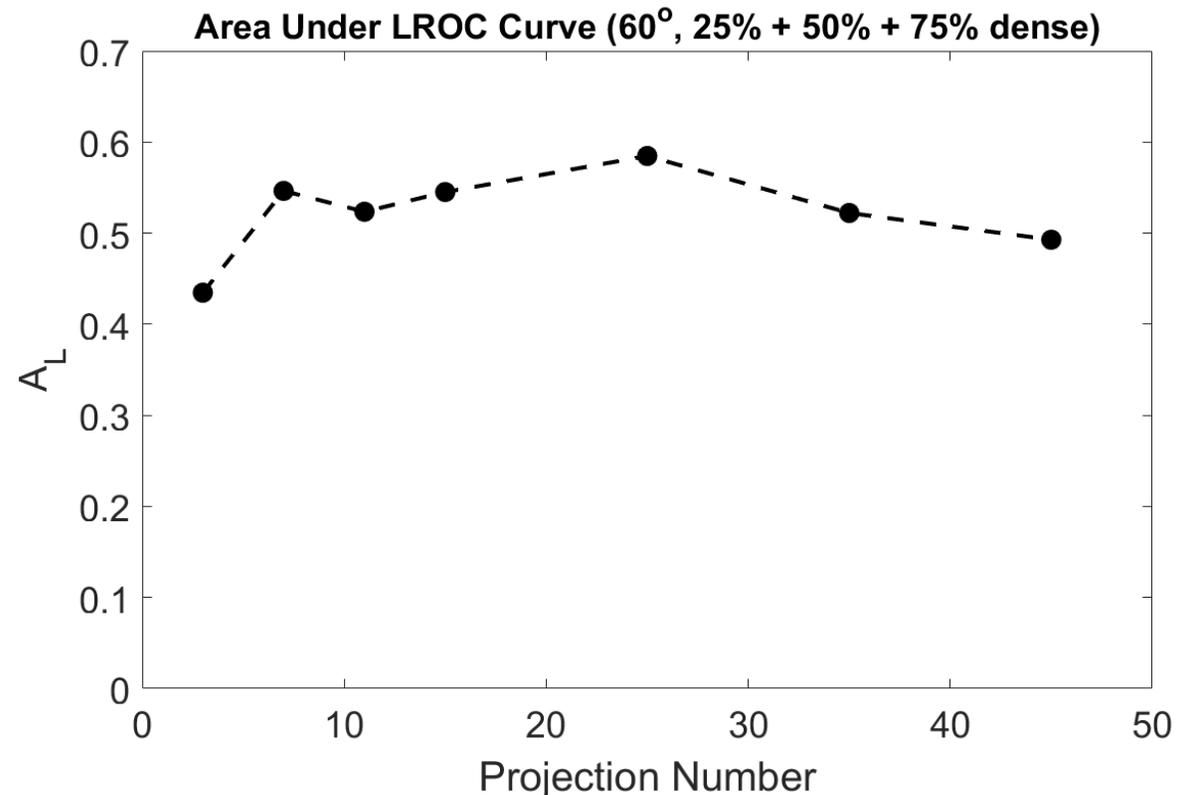


Phantoms created by P. Bakic, University of Pennsylvania

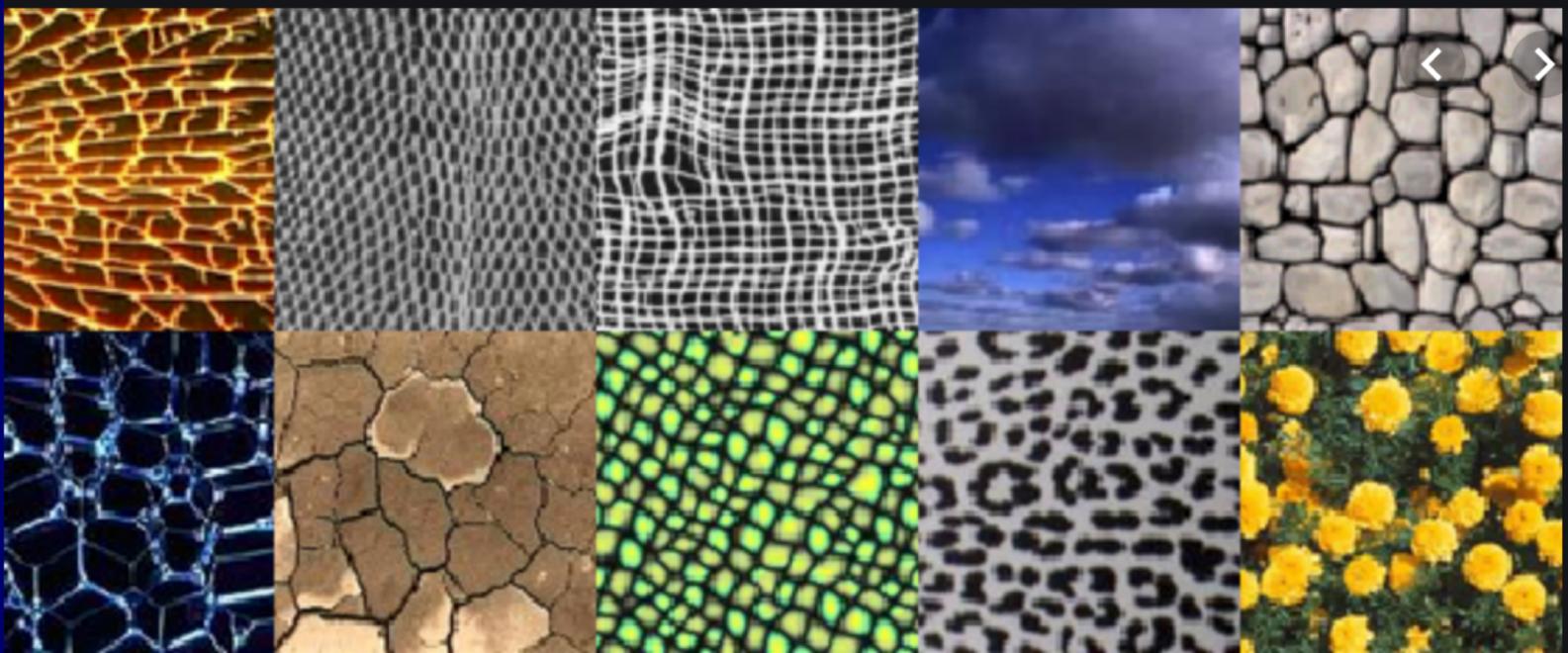
# Localization Receiver Operating Characteristic

LROC curve describes how well a human observer is able to detect a signal

Das, Gifford (2016)



# Image Texture



# Texture Assessment

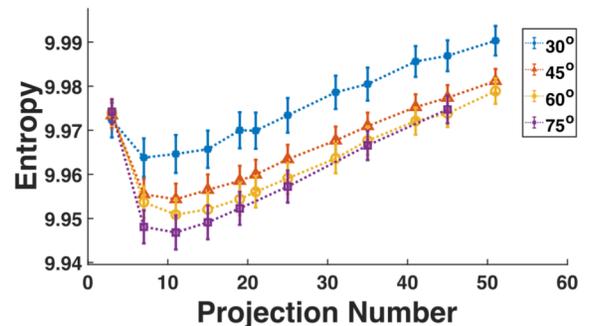
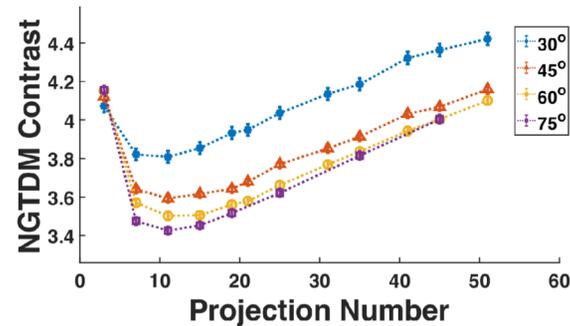
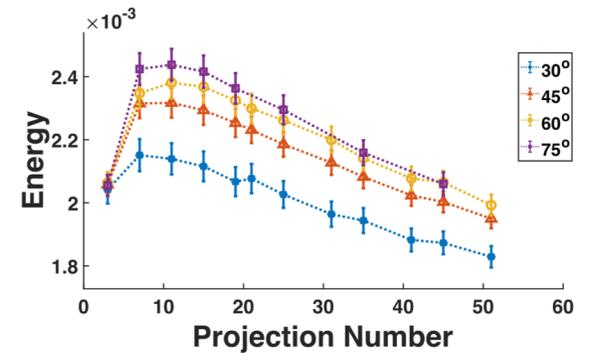
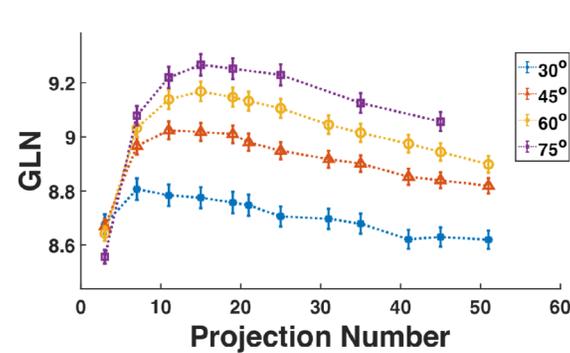


# Texture and Perception?



Statistical features  
computed in the Image

Nisbett, Das (2018)



# Observer Surrogates?



- Mathematical observer models (Gifford)
- Texture features. (Nisbett, Das (2017), (2018))
- Power spectral parameters (beta- anatomic noise)
- Physics of imaging - building blocks of machine learning tools

# Summary

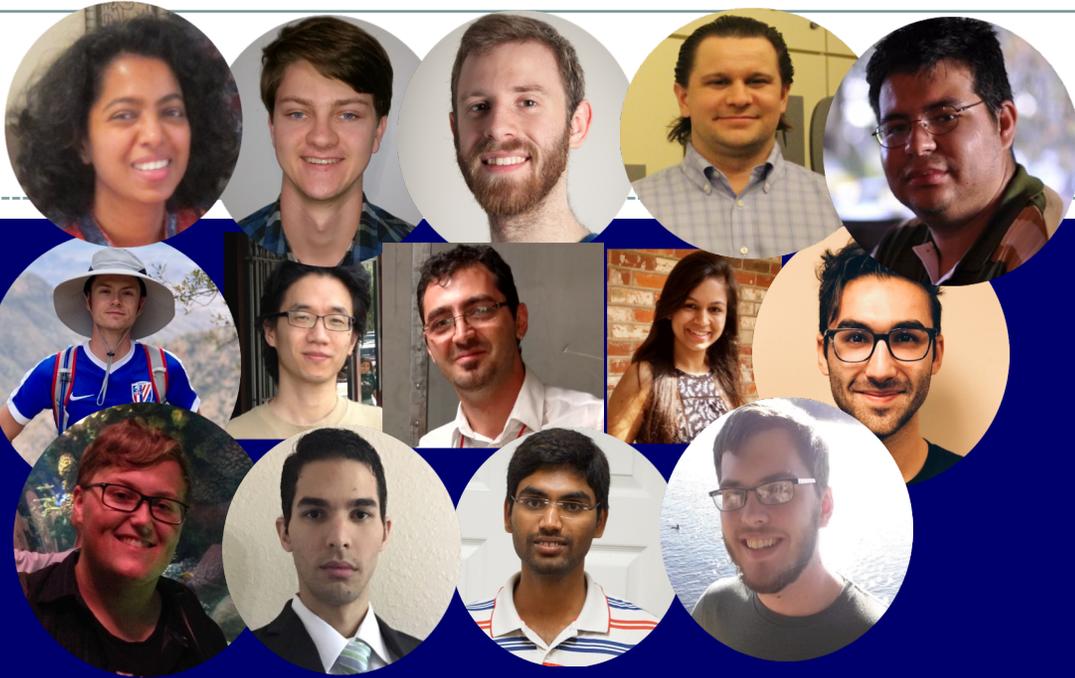


- Quantitative phase contrast imaging
- Spectral detectors
- Perception and image science will play an integral role in future device and algorithmic developments
- Towards x-ray microscopy with Timepix
- Color X-Ray

# Research Opportunities



- Physics and engineering – experiments, models
- Computer Science – Image reconstruction, ML  
- Breast Images, Pathology ...
- Biochemistry- Contrast Enhanced Imaging
- Mathematics- Inverse Problems



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