

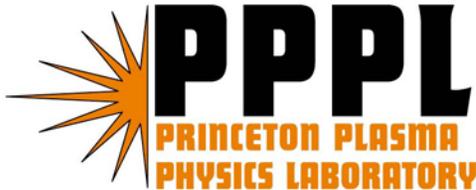
# A Step Closer to a Validation Exercise

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# Define “Validation Metric” by What You Want to Do with It

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- See [O&B 2006] for CFD perspective.
- Quantitative approach to code calibration,
- Determine where model & experiment agree well & where they don't,
  - Know where to focus future effort.
- Test hypotheses,
  - E.g., does one model match experiment better than another?
- Quantitatively characterize uncertainty in model – experiment comparison,
  - Is resulting confidence interval acceptable?
  - Estimate uncertainty in predictive simulations.

# Factors Desired in Validation Metrics

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- Experimental measurement uncertainties,
  - Including those introduced in post-processing.
- Uncertainties in code inputs,
- Code errors.
  - E.g., inadequate spatial resolution.
- Number of experiments,
- “Primacy” of variables used for comparison.

# Example Validation Metrics: [O&B 2006], [O&T 2002]

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- Simulation result:  $y(x)$ ; experimental data:  $Y_n(x)$ , mean  $\bar{Y}(x)$ ,  
 $\Rightarrow$  *estimated* error in simulation  $\tilde{E}(x) = y(x) - \bar{Y}(x)$ .
- Standard deviation of  $Y_n(x)$  over  $N$  experiments:  $s(x)$ ,
- 90% confidence interval for mean  $\bar{Y}(x)$ :  $t_{0.05, N-1} s / \sqrt{N}$ .
- O&B metric says: with 90% confidence, *true* error in simulation is in interval

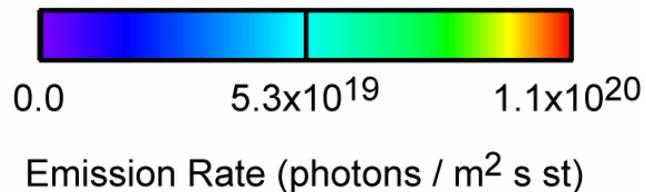
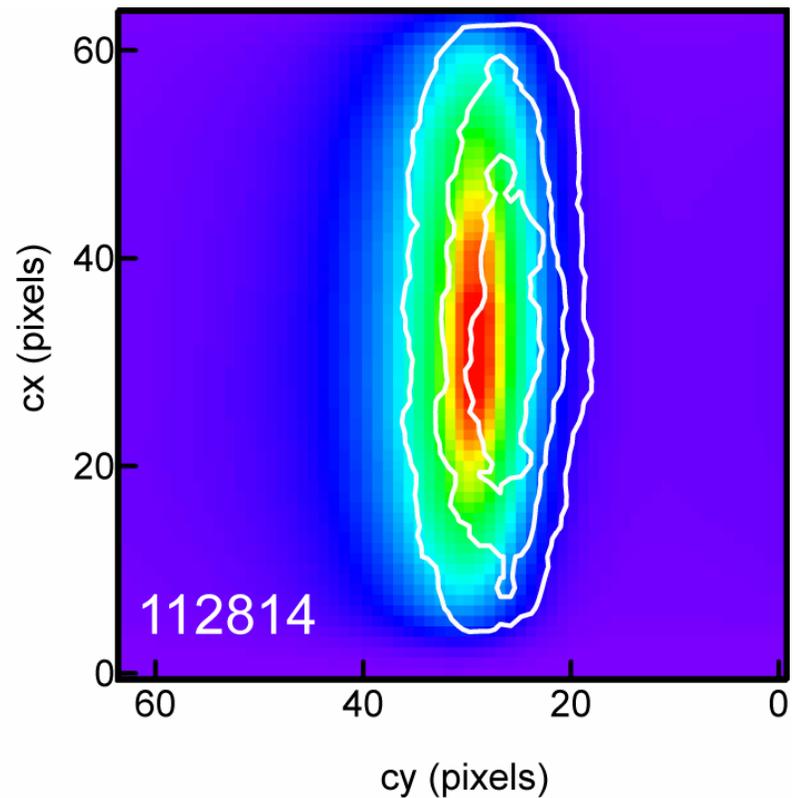
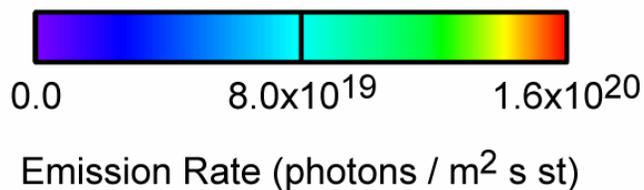
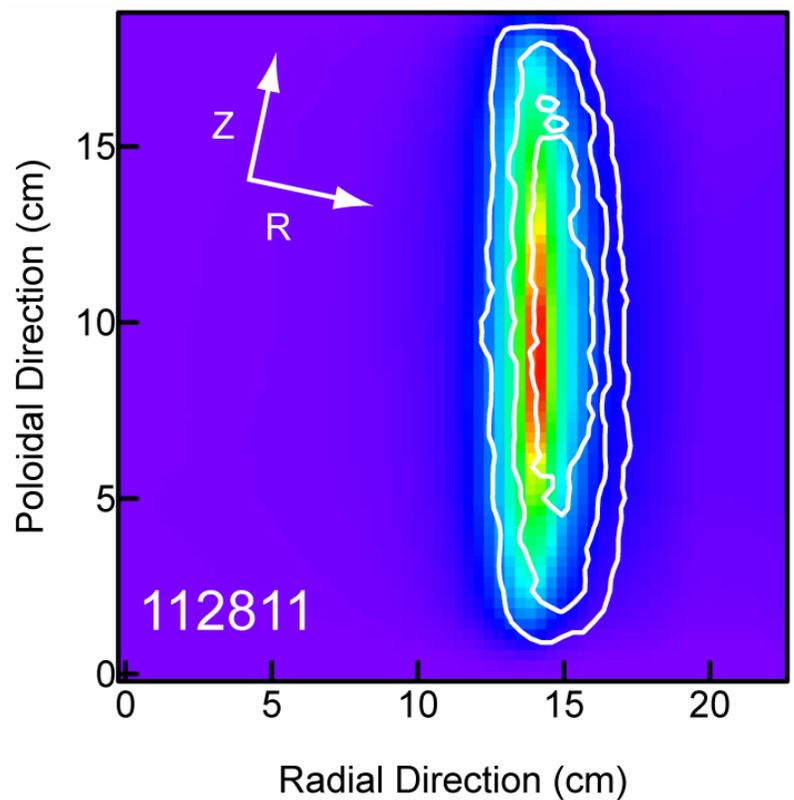
$$\left( \tilde{E}(x) - t_{0.05, N-1} \frac{s(x)}{\sqrt{N}}, \tilde{E}(x) + t_{0.05, N-1} \frac{s(x)}{\sqrt{N}} \right)$$

- O&T use similar analysis to get single scalar metric,  $0 < V < 1$ :

$$V = 1 - \frac{1}{L} \int_0^L \tanh \left[ \left| \frac{y(x) - \bar{Y}(x)}{\bar{Y}(x)} \right| + \int_{-\infty}^{\infty} \frac{s(x)}{\sqrt{N}} \left| \frac{z}{\bar{Y}} \right| f(z) dz \right] dx.$$

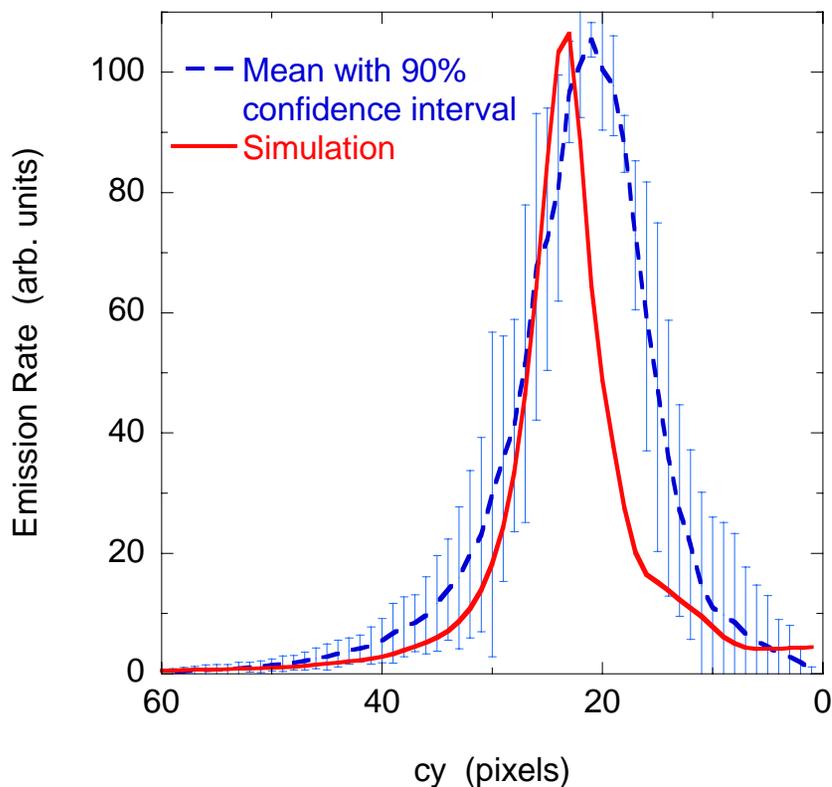
- $f(z)$  = PDF of student's  $t$ -distribution for  $N - 1$  degrees of freedom.

# DEGAS 2 Simulations of NSTX Gas Puff Imaging Experiments Yield “Good Agreement”

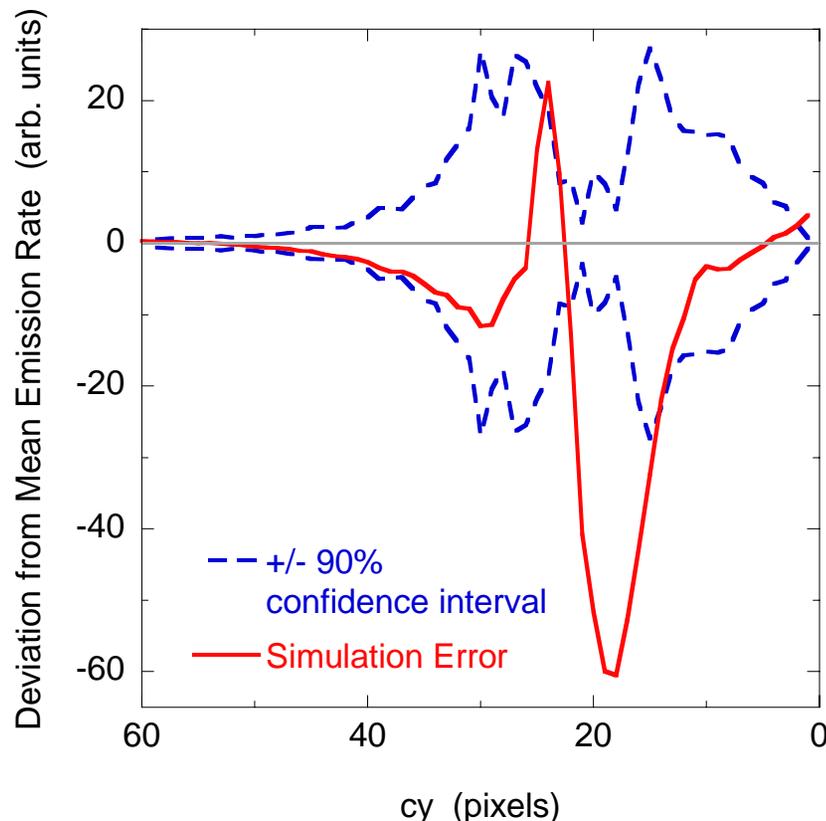


# Evaluate O&B, O&T Metrics with GPI Data from 3 Shots - *DEMONSTRATION ONLY!*

Radial Profile at  $cx = 32$



Radial Profile of Error at  $cx = 32$



- Global O&B “average relative error” =  $62\% \pm 84\%$
- O&T metric  $V = 0.34$

# Are Other Metrics More Well Suited to Our Needs?

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- [McFarland 2005] uses Bayesian Belief Networks:
  - Incorporates uncertainties in measurements & model inputs,
  - Their example utilizes a “too simple” model.
  - Hypothesis testing: does model agree with data?
  - Does not require multiple experiments.
  - Does require complex math  $\Rightarrow$  enlist help of math colleagues in developing VM's.

# [Chen 2004] also Focuses on Uncertainty Propagation

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- “Response Surface Methodologies”:  
metamodel used to determine impact of  
input uncertainty on uncertainty in results,
- Considers non-normal distributions,
  - Shows how to transform to variables with  
near-normal distributions  $\Rightarrow$  standard  
methods apply.
- Techniques can be used with any VM.
- Again, mathematically involved.

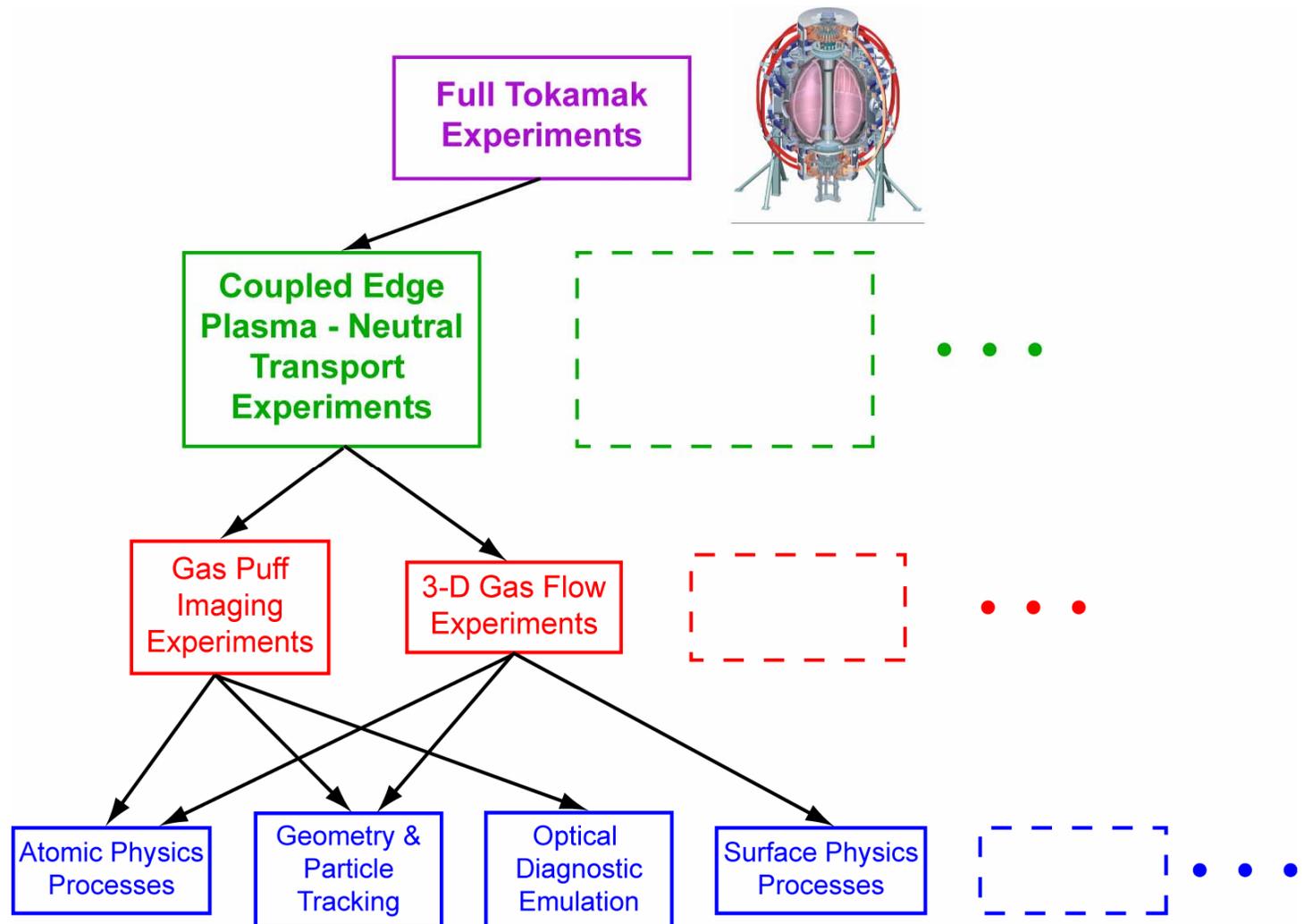
# References

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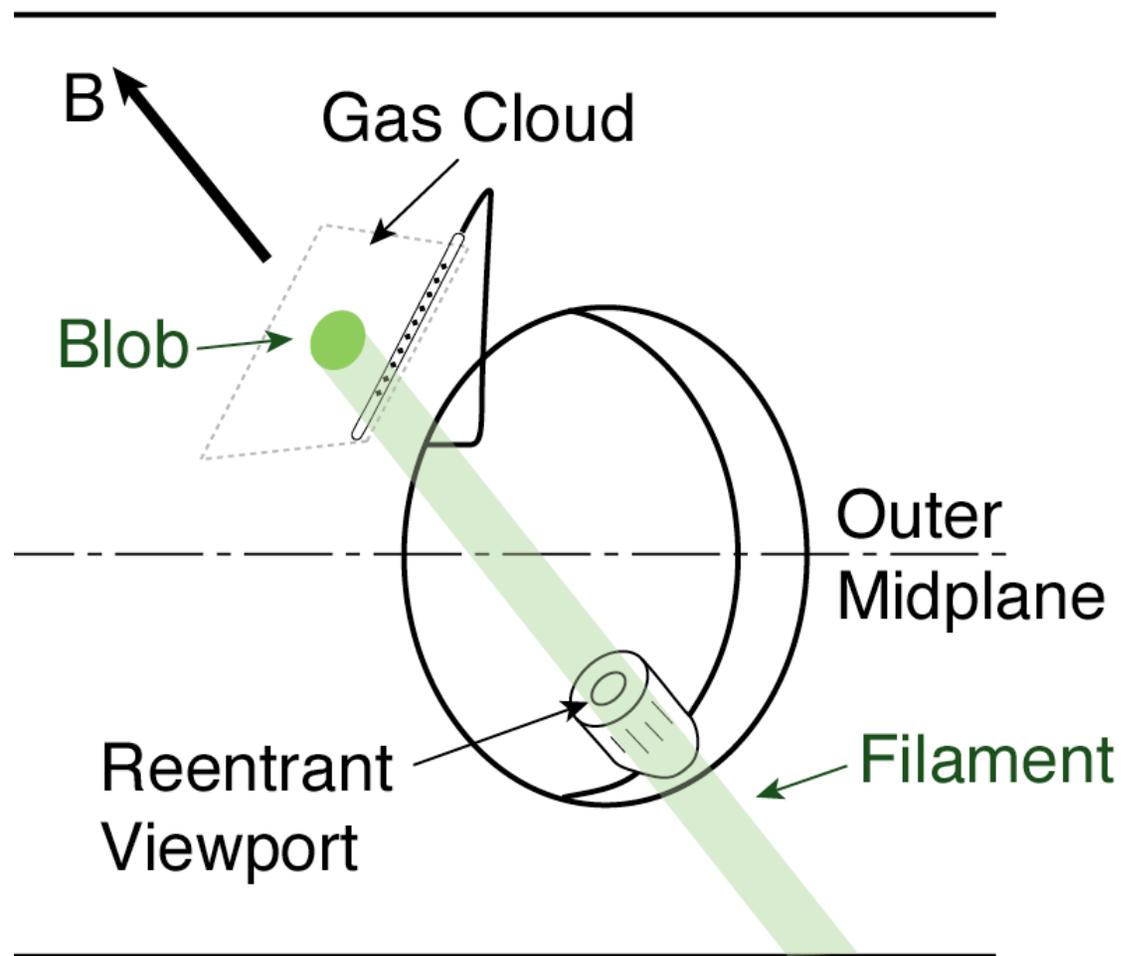
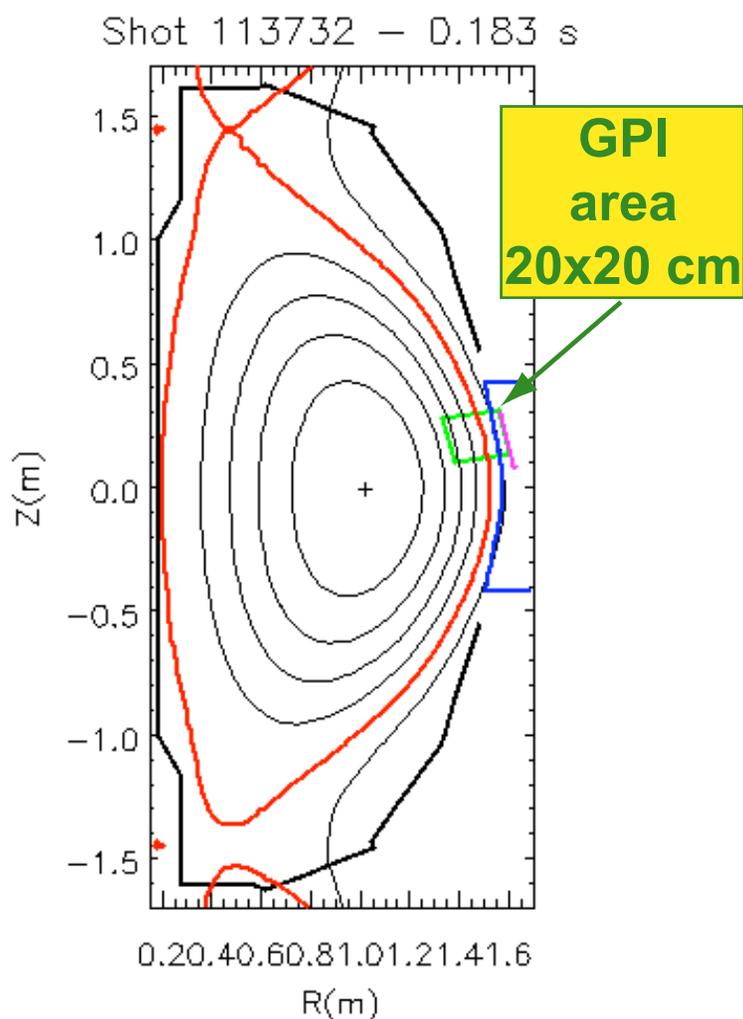
- [O&B 2006] W. L. Oberkampf and M. F. Barone, J. Comp. Phys. 217, 5 (2006).
- [O&T 2007] W. L. Oberkampf and T. G. Trucano, Prog. Aero. Sci. 38, 209 (2002).
- [McFarland 2005] J. M. McFarland and L. P. Swiler, Sandia National Laboratories Report SAND2005-5980 (Nov. 2005).
- [Chen 2004] W. Chen et al., AIAA Journal 42, 1406 (2004).
- [Stotler 2007] D. P. Stotler et al., J. Nucl. Mater. (in press) (2007).

# Validation Experiments Lower on Hierarchy Have Greater Likelihood of Success

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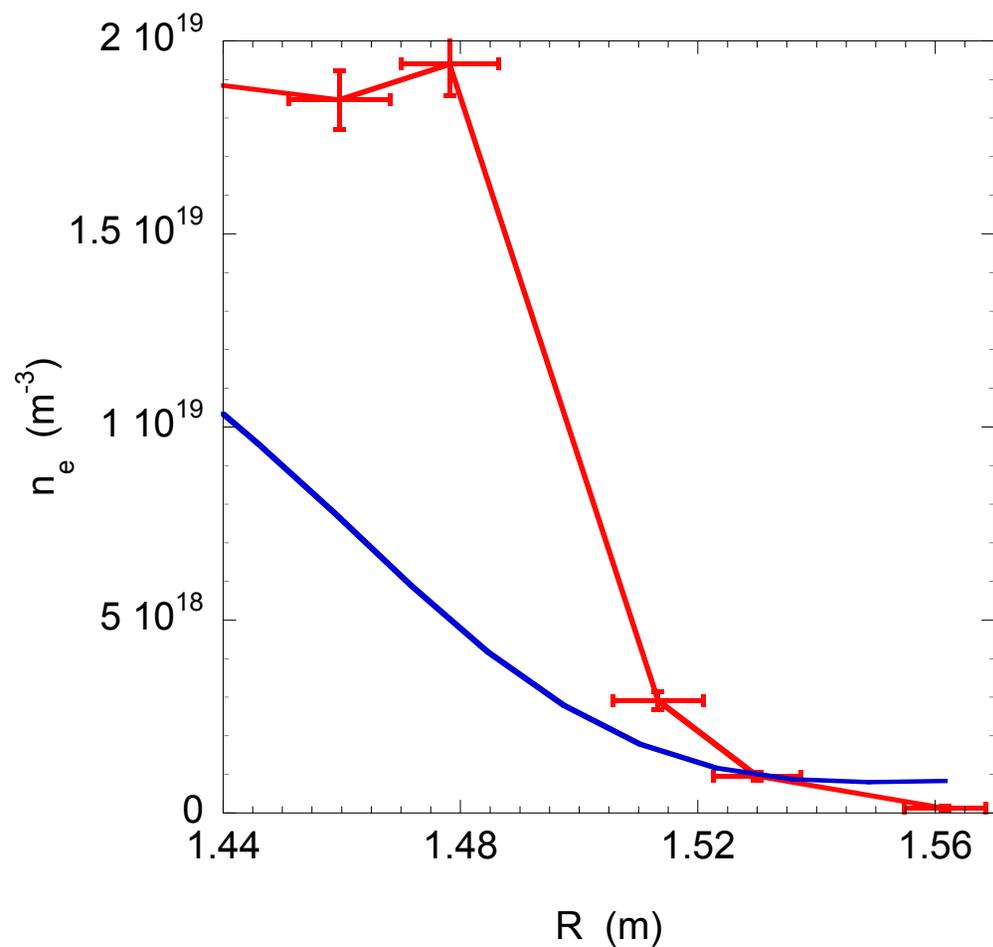
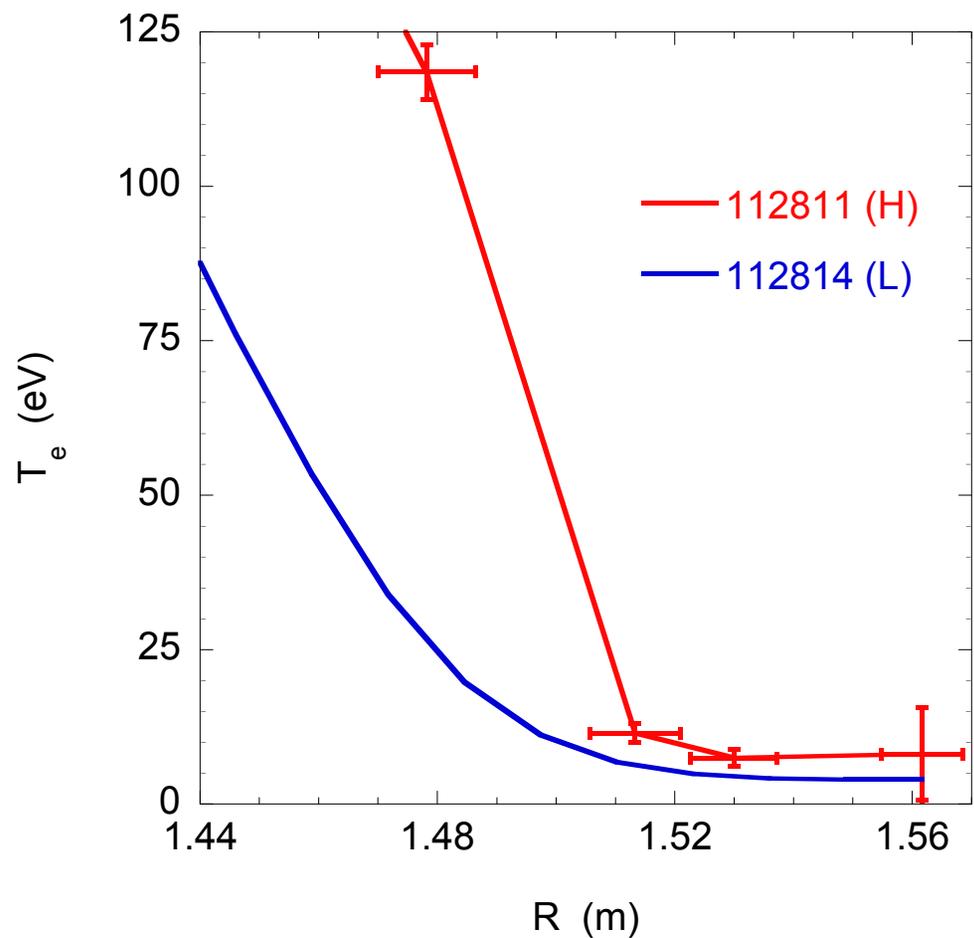


# Gas Puff Imaging Hardware Configuration in NSTX



# Edge Thomson Scattering Midplane Profiles for H- & L-Mode Shots

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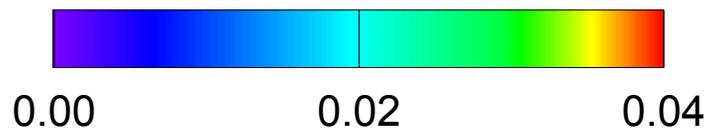
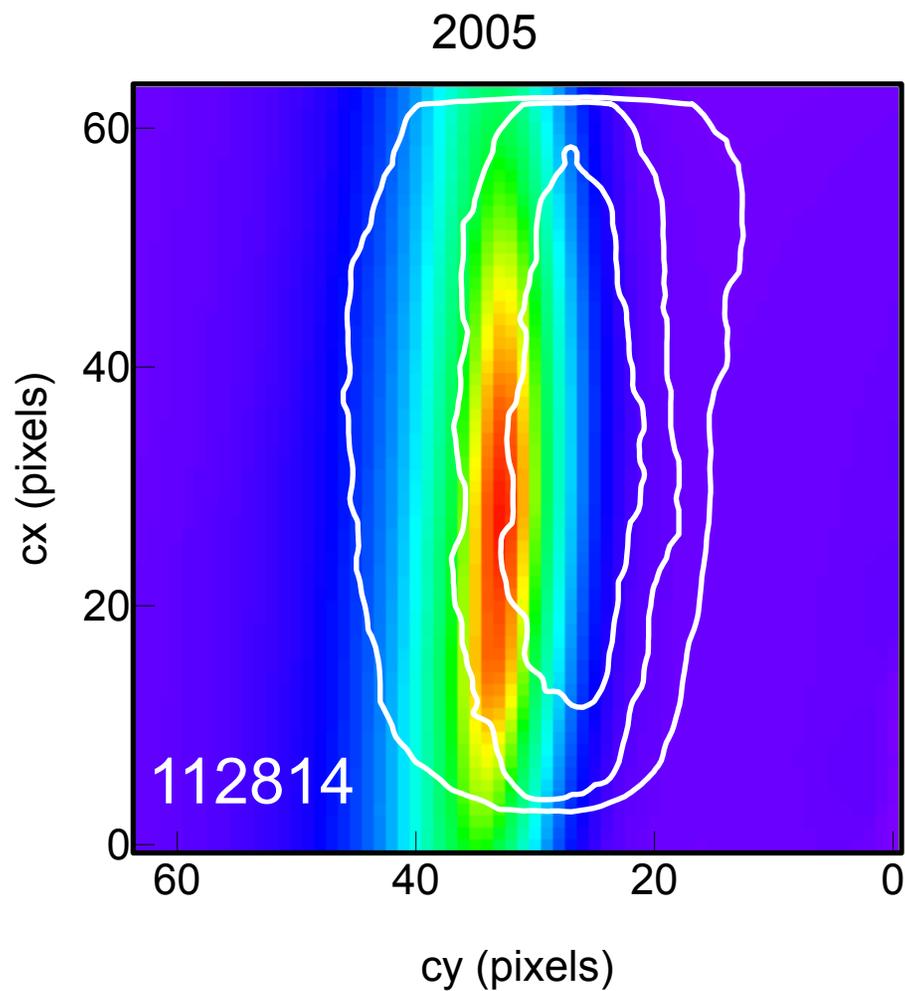


# Three-Dimensional DEGAS 2 Simulations of NSTX GPI Experiments

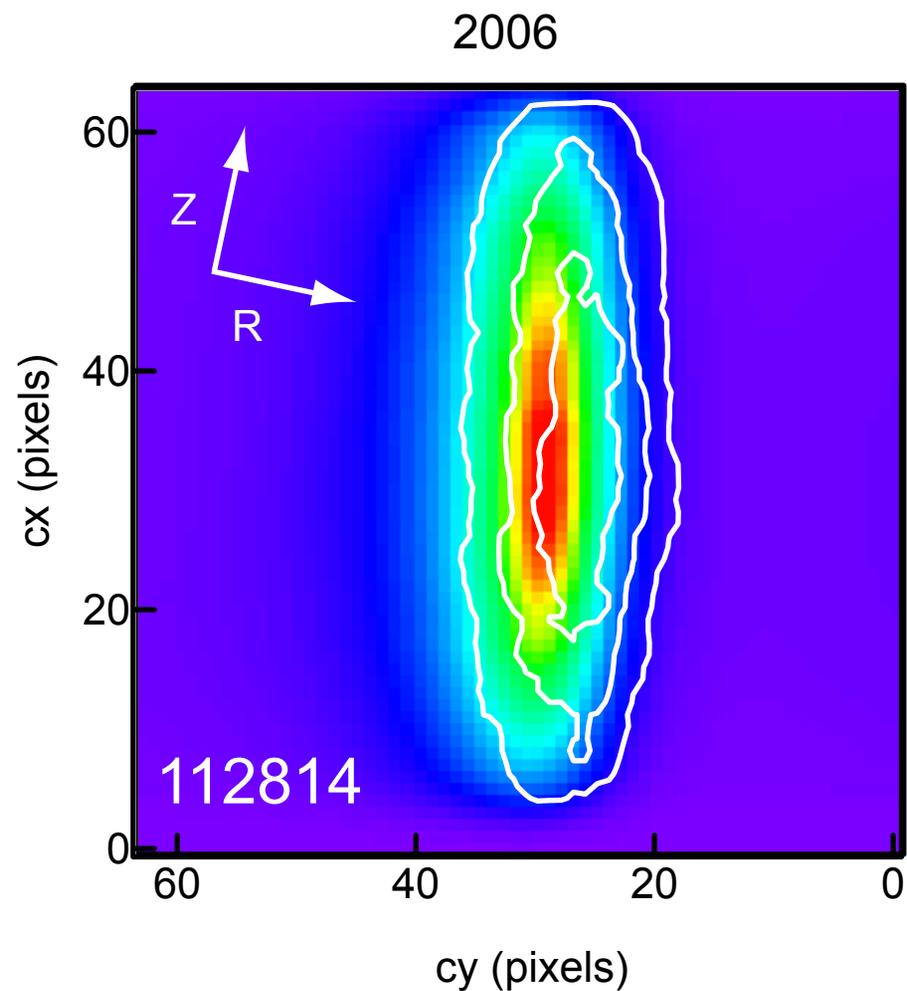
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- Take from experiment:
  - EFIT equilibrium at time of interest,
  - Electron density & temperature profiles vs.  $R_{\text{mid}}$ .
- Direct simulation of 64x64 pixel view of GPI camera.
- Primary complication:
  - Steady state simulation with plasma parameters constant on flux surface,
  - But, real plasma 3-D & varying in time.
  - Justification: interested mostly in 3-D neutral density.
  - Only get Thomson scattering data at one or two time points.

# Improved Agreement Result of Close Interaction Between Modeler & Experimentalist



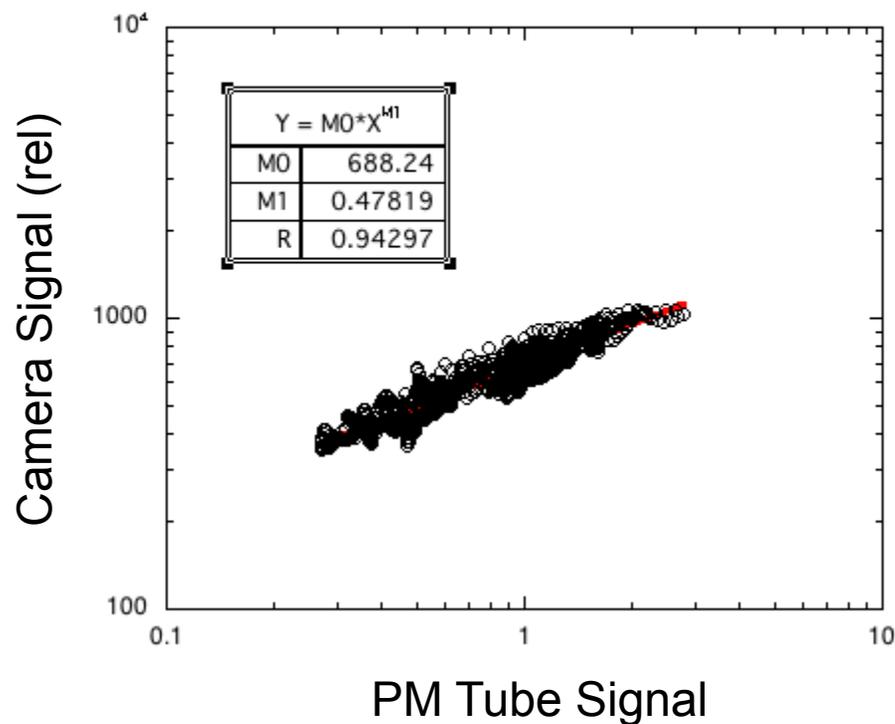
Emission Rate



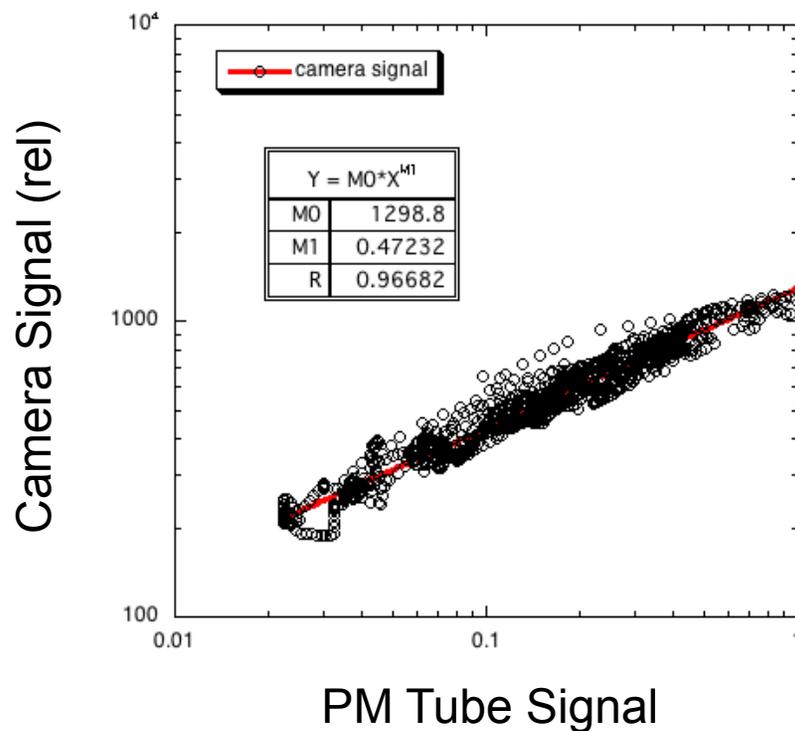
Emission Rate (photons /  $\text{m}^2$  s st)

# Calibrate PSI-5 Camera Nonlinear Response Against Photomultiplier Tube

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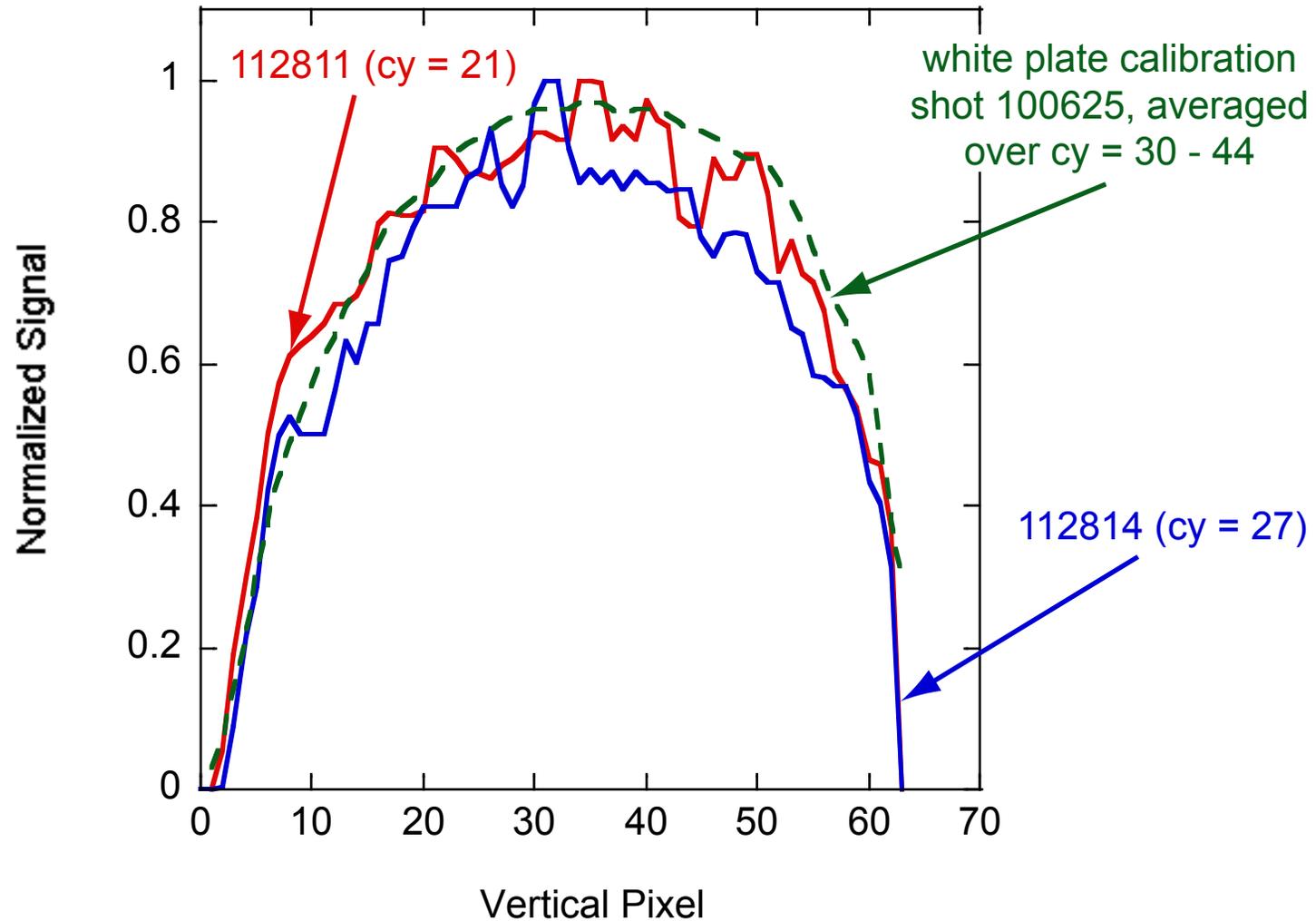


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- Apply *inverse* to GPI data to get something  $\propto$  photons / (m<sup>2</sup> s st).

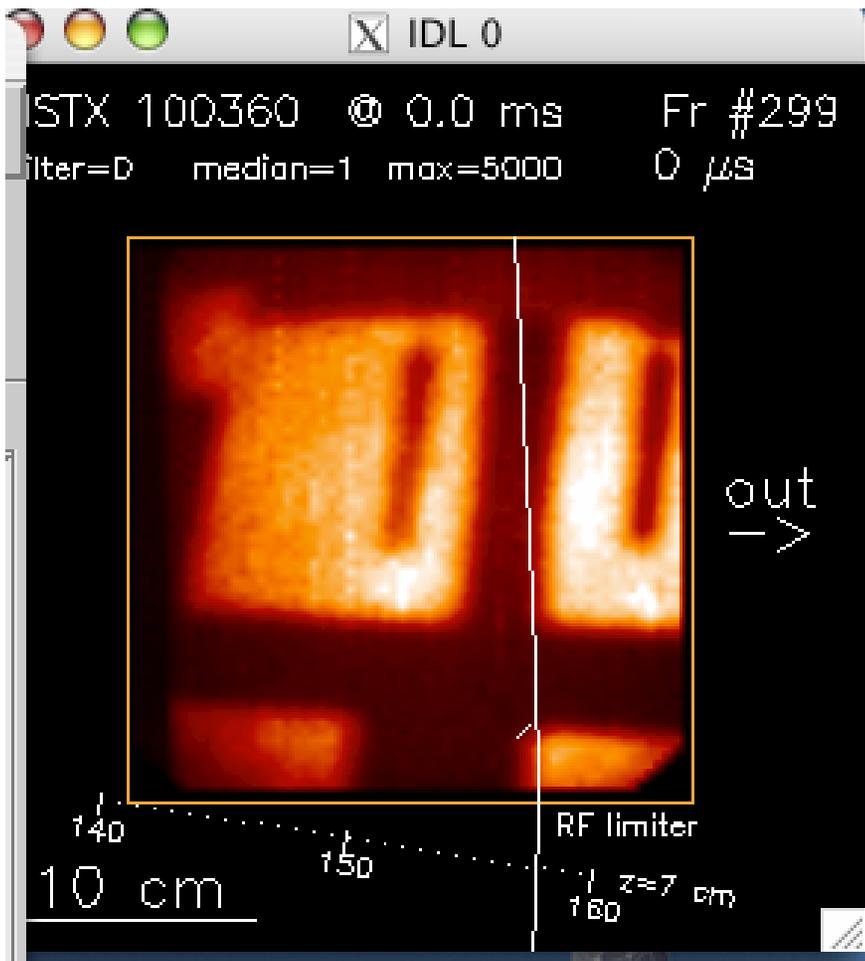
# Vertical Variation Dominated by Vignetting in Optical System



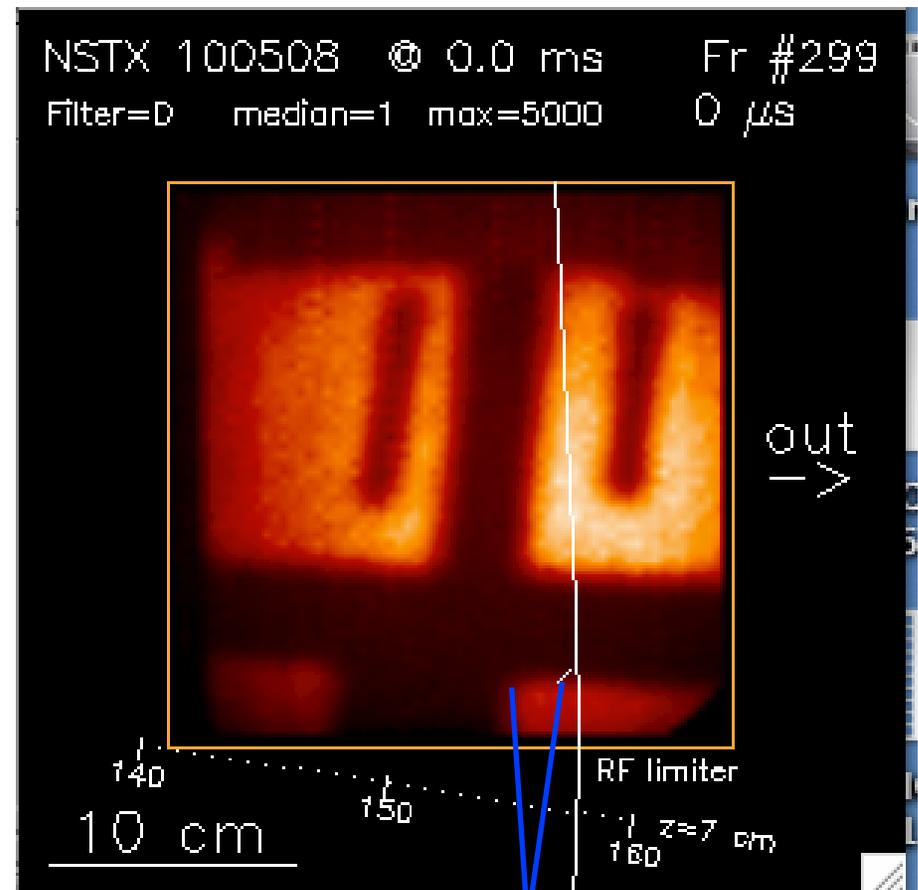
- Vertical variation of “white plate” calibration similar to that of GPI experiments,
- Use to define filter function & apply to simulated camera image.

# Relative Calibration of GPI Camera Geometry

Before



After



6 pixel shift