### Extending Optical Pyrometry Temperature Measurements to below 5000 K





## A statistical model is being developed to infer temperature from low signal-tonoise ratio (SNR) Streaked Optical Pyrometer (SOP) data.

 Measuring temperature of dynamically compressed materials over nanosecond timescale, especially ramp compressed materials, is a grand challenge in High Energy Density Physics (HEDP).

- SOP is often used to infer sample temperature from self-emission of optical photons.
- Samples below 5000 K have low SNR data, because so few photons are emitted over nanosecond timescales.
- We are developing a statistical method to infer temperature from low SNR data, extending temperature measurements to the few thousand Kelvin regime.





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## SOP is often used to measure brightness temperature of an emitting surface for T>5000 K with nanosecond resolution.





### There is a simple relation between brightness temperature and SOP intensity.

10  $T_0$  $R A_0 X$ Brightness temperature (eV) In 8 **Derived from Planck's** radiation law 6 4 *R* is the target reflectance; 2  $T_0, A_0, X, \eta$  depend on diagnostic design and setup. 0 *I* is "background subtracted" SOP intensity. 0.2 0.4 0.6 0.8 1.00.0 SOP intensity ( $\times 10^4$  ADU)

E25153J1

ROCHESTER

ADU is a unit converting CCD electrons to analog signals.



### There is a simple relation between brightness temperature and SOP intensity.



$$T = \frac{T_0}{\ln\left(1 + \frac{(1-R)A_0X}{\eta I}\right)}$$
 Derived from Planck's radiation law

*R* is the target reflectance;

 $T_0$ ,  $A_0$ , X,  $\eta$  depend on diagnostic design and setup.

*I* is "background subtracted" SOP intensity.

E25153J1

1 eV ~ 11600 K

ADU is a unit converting CCD electrons to analog signals.

## Current SOP model works for high temperatures (T>~5000 K). At low temperatures, the histogram deviates from Gaussian, and a new model is necessary.





## We use the maximum likelihood estimation to infer *T* from SOP image



$$f(T|\{N\}) = \frac{f(\{N\}|T)f(T)}{f(N)} \propto f(\{N\}|T)f(T)$$

Having obtained data {*N*}, how likely is *T*?

Given *T*, how likely to obtain data  $\{N\}$ ?







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Given *T*, how likely to obtain data  $\{N\}$ ?

Two challenges:

1) The histogram is not Gaussian.

2) There are correlations between neighboring pixels.

Address these one at a time (but not simultaneously).







## 1) The histogram is not Gaussian.

#### We developed a model to describe how the non-Gaussian histogram depends on temperature.



ROCHESTER simulated sample over 100x10 pixels

## 2) There are correlations between neighboring pixels.



In the streak camera, when a single photoelectron deposit itself on phosphor screen to generate photons, energy spreads its energy among neighboring pixels.



Start with the simpler case of Gaussian distribution. The likelihood function is therefore a multivariate Gaussian distribution.



## The temperature is given in the form of posterior distribution.





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- Measure streak camera parameters of the OMEGA EP SOP (already collected data);
- Incorporate systematic uncertainties of streak camera parameters, SOP parameters, etc., possibly in a full Bayesian scheme.



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## Thanks for your attention.

## Any questions are welcome.

