

# Compressive sensing for spatial and spectral flame diagnostics

Compressive sensing for spatial and spectral flame diagnostics

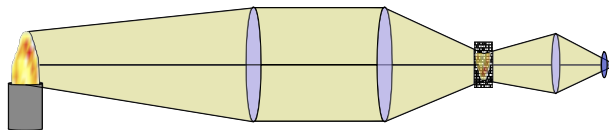
Flame Diagnostics

Compressive Sensing

Spatial imaging

Species and temperature measurement

Results



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How can modern low light level imaging techniques be used  
for flame diagnostics?

- ▶ Flames Diagnostics
- ▶ Compressive sensing (review)
- ▶ Spatial imaging (chemiluminescence)
- ▶ Species and temperature measurement

Flame Diagnostics

Compressive Sensing

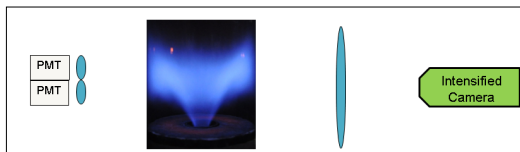
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Emissions, efficiency and safety are the primary concerns in combustion research.

However, flame diagnostics often require low-intensity optical measurements.



- ▶ Photomultiplier tubes used for single point data
- ▶ Intensified CCDs used for spatially resolved data

Flame Diagnostics

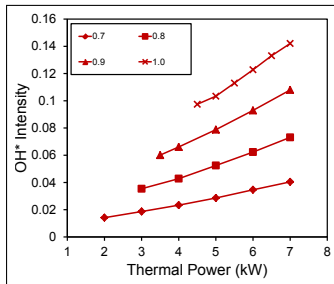
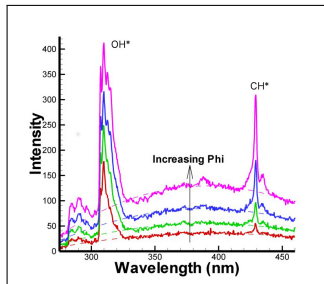
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Hydrocarbons produce well known spectra with features associated with different species.



- ▶ Excited radical emission correlates to thermal power
- ▶ Used to detect spatial heat release rate

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Compressive sensing is an acquisition method that takes advantage of the sparsity of the signal.

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Consider a seemingly complex signal:



But, in the fourier domain... (inverted for clarity)

Compressive sensing utilizes the sparsity of an image  $\mathbf{u}$  to find a solutions to a simple linear algebra problem:

$$\min_{\mathbf{u}} \sum |\mathbf{u}| \quad \text{s.t.} \quad \underset{(M \times 1)}{\mathbf{f}} = \underset{(M \times N)(N \times 1)}{\mathcal{A}} \mathbf{u} \quad (1)$$

- ▶  $\mathbf{f}$  is a vector of  $M$  measurement results
- ▶  $\mathcal{A}$  is an incoherent  $M \times N$  measurement matrix

For images, minimizing the total variation is better:

$$\min_u \sum_i ||D_i u|| \quad \text{s.t.} \quad \mathbf{f} = \mathcal{A} \mathbf{u} \quad (2)$$

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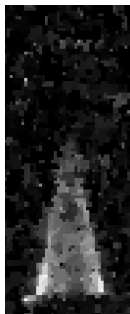
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An incoherent sampling can reproduce the image  $\mathbf{u}$  with  
 $M \ll N$ .



Original  
 $N = 4664$



Reconstruction  
 $M = 933$   
12% Error



Reconstruction  
 $M = 2332$   
6.4% Error

(this ignores the fluctuations in the image)

Flame Diagnostics

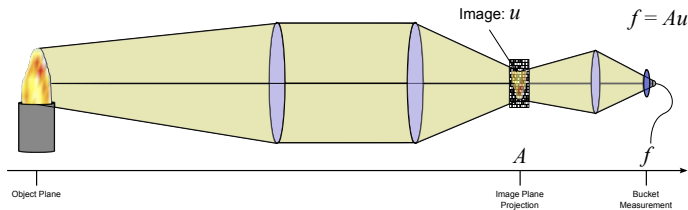
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We image a propane ( $C_3H_8$ ) flame onto a DMD array:



The collection optics include steering mirrors, lenses, spectral filtering and a multimode fiber with a  $50\ \mu\text{m}$  core.

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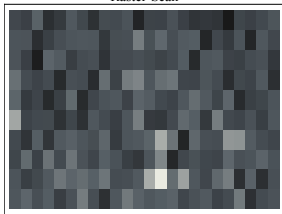
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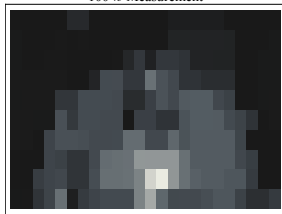


Flame size	1 cm $\times$ 1.5 cm
Image size	300 $\mu\text{m}$ $\times$ 450 $\mu\text{m}$
Photon Flux (434 nm)	6,000 counts/s
Dimensions $N$	24 $\times$ 28
Measurements $M$ (max)	672
Time per measurement	1 s

Raster Scan



100 % Measurement



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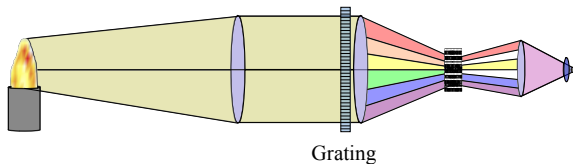
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# Species and temperature measurement

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To measure the spectrum of the flame with limited signal,  
we can again use CS.



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# Species and temperature measurement

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Bin Width (spectral)	0.361 nm
Dimensions $N$	2047
Measurements $M$	409 (20%)
Relative Error	12%

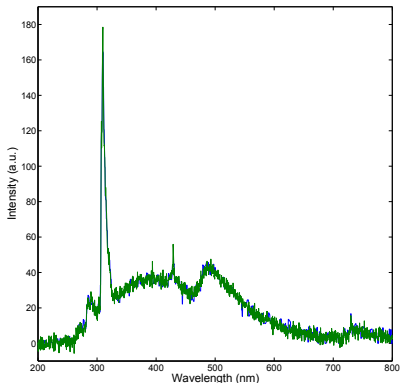
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# Species and temperature measurement

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Flame Diagnostics

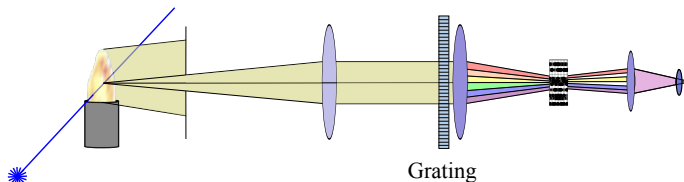
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For Raman scattering, a “weak” CW beam can be used due to the increased sensitivity.



For dim flames, compressive sensing can:

- (a) improve SNR or reduce integration (cf. raster scan);
- (b) reduce cost of imaging systems (cf. intensified CCDs);
- (c) allow for Raman spectroscopy with a CW pump;

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