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## CHALLENGES IN ANALYZING HIGH-RES SPECTRA OF WEAK SOURCES

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## MINEFIELDS AHEAD

sparsity, detectability, and background

I. (RT Cru) Weak lines in high background

II. (UV Cet AB) Disentangling overlapping lines from contaminating companions

# High-resolution spectra come with unintuitive challenges, caused by



## I. WEAK LINES IN HIGH BACKGROUND

- RT Cru is a symbiotic system at 2.5 kpc, with a high mass WD (1.3 M<sub>☉</sub>) accreting from a M5III giant
- Exhibits aperiodic flickering, with heavily absorbed hard power-law component, strong lines from Fe XXV, Fe XXVI, and FeKα, and possibly an absorbed soft thermal component





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- Observed with Chandra HRC-S/LETG in Nov 2015 for ≈79 ks explicitly to search for lines at longer wavelengths
- Where are the soft thermal lines?

counts/0.0125 A





### I. HOW WELL DO YOU KNOW YOUR BACKGROUND? Algeri 2020, PhysRevD, 101, 015003; Zhang et al. 2023, MNRAS, 521, 969

- Suppose you have a model for the background,  $g(\lambda)$ , but the actual background is  $f(\lambda)$
- Trivially,  $f(\lambda) = g(\lambda) \cdot [f(\lambda)/g(\lambda)]$
- the ratio of densities can be expressed in quantile form, a comparison density

 $d(u; F,G) = f(G^{-1}(u))/g(G^{-1}(u)), u:=G(λ) ∈ [0,1]$ 

- the skew-G density model, a non-parametrically designed parametric modeling of d(u), with orthonormal basis functions, e.g., shifted Legendre polynomials
- number of terms set via a model comparison statistic like BIC





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Why do it this way?

I. data-driven measure of complexity in background

2. increase power by discarding information about normalization, work with cumulative distributions

3. easily transferable from background to source data4. general detection method for arbitrary features



## RT CRU UPPER LIMITS VIA PO





ct/bin

ct/bin

bin



Zhang et al. 2023, MNRAS

Some of the expected strong lines from thermal emission.

Locations of lines are marked by vertical lines and line spreads by yellow shades.

Fe lines, IrM edge, and unidentified line at 16.93 Å are detected.

The rest require upper limits to be set.



### RT CRU UPPER LIMITS VIA POWER Zhang et al. 2023, MNRAS







 $W_3$ 

 $W_4$ 

 $W_5$ 

 $W_6$ 

 $W_7$ 

 $W_8$ 

 $W_9$ 



18.6





18.8 19.0 19.2 19.4 Wovelength [Å]

Regions f interest $(W_r)$	т	Bonferroni (Sidak)	K (Sidak)	N (Si
<i>V</i> <sub>1</sub>	3	0.0001 (0.0011)	0.0071 (0.0397)	0.0045
$V_2$	3	1.0816e-18	2.7907e-15	3.33
		(1.0817e-17)	(2.9976e-14)	(2.49)
<i>V</i> <sub>3</sub>	0	1.0000 (1.0000)	1.0000 (1.0000)	1.0000
$V_4$	0	1.0000 (1.0000)	1.0000 (1.0000)	1.0000
V <sub>5</sub>	0	1.0000 (1.0000)	1.0000 (1.0000)	1.0000
$V_6$	0	1.0000 (1.0000)	1.0000 (1.0000)	1.0000
V <sub>7</sub>	0	1.0000 (1.0000)	1.0000 (1.0000)	1.0000
$V_8$	0	1.0000 (1.0000)	1.0000 (1.0000)	1.0000
V9	0	1.0000 (1.0000)	1.0000 (1.0000)	1.0000

### Testing for difference from background

#### Testing for lines at nominal locations Regions Local Sidak's of interest $(W_r)$ p-values correction 0.4810 0.9899 0.1143 0.5724 0.3247 0.9359 0.0385 0.2402

0.2612	0.87
0.5000	0.99
0.5000	0.99

#### Setting upper limits to lines

	Regions $(W_r)$	50% upper Local	limits via LRT Sidak adjusted	90% uppe Local	er limits via Sidak adju
	$\overline{W_3}$	29.93	39.42	48.91	53.29
	$W_4$	20.00	26.43	32.36	39.52
	$W_5$	24.02	30.14	35.32	43.80
	$W_6$	22.62	28.08	34.71	39.39
	$W_7$	17.90	24.17	29.71	35.98
	$W_8$	17.84	24.80	30.30	36.25
0	W9	37.83	21.87	63.57	76.83







## II. DISAMBIGUATE OVERLAP OF UV CET A & B



### UV Cet AB = GJ 65 AB

Flaring active dM binary M5.5V+M6V ≈2.7 pc

Observed for 75 ks in Nov 2001 with HRC-S/ LETG

Massive >100× flare on UV Cet B



## IL FBASCS ON OTH ORDER



 $L_{\text{Xpeak}} \approx 2 \cdot 10^{29} \text{ erg s}^{-1} \approx \text{X1000}$  $L_{\rm Xmin} \approx 10^{27} \text{ erg s}^{-1} \approx 200 \times \text{ increase}$ (Audard et al. 2003)

EBASCS (Jones et al. 2015, Meyer et al. 2023) works on photon events lists {x,y,t,E} (whichever is available)

Finite Mixture model where each event is assumed to arise from one of several sources with the mixture weights representing proportion of photons from that source.

Each event is assigned a probability of belonging to each source and sifted, and the the sources are probabilistically separated.



## II. EBASCS ON OTH ORDER



## II. DISAMBIGUATE OVERLAP OF UV CET A & B O VII TRIPLET



Model the OVII triplet

Propagate the relative positions of A & B from O<sup>th</sup> order to expected locations of dispersed O VII triplet

Fit weights relative to OVIIr B



## II. EBASCS ON DISPERSED OVII TRIPLE



#### UV Cet B: 0VII21804/0VII22101



## SUMMARY

I. Weak lines in high background



 New method to discern deviations in background model and detect presence of weak source features, accounting for multiple tests



♦ Applied to look for soft lines in RT Cru — none of the usual suspects are detectable with current instrumentation, set upper limits on line fluxes



- ♦ What is that line at 16.93 Å?
- II. Disentangling overlapping lines from contaminating companions
  - + Probabilistically sift photons in overlapping sources using spatial, spectral, and temporal differences
  - Applied to UV Cet OVII density sensitive lines, demonstrates rapid increase of density during flare
  - Developed for grating spectroscopy, will also work for calorimeter detectors

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## [DIGRESSION] UPPER LIMITS: A RANT

I. An Upper Limit is not the upper bound of the uncertainty interval of a flux estimate

- a. An uncertainty interval is not unique a 68% uncertainty interval on flux can be anything between  $[0,q_{68}]$  to  $[q_{32},\infty]$ , even  $[q_{16},q_{84}]$
- 2. An upper limit is how bright a source could be before it will be definitely detected, or how faint should it be for it to be definitely not detected (Kashyap et al. 2010, ApJ 719, 900)
- 3. You set an upper limit based on the process of detection, not based on how many counts are observed for the source, because then you have an estimate of the flux
- 4. It requires a measure of the False Negative, or Statistical Power
- 5. See (1)







