



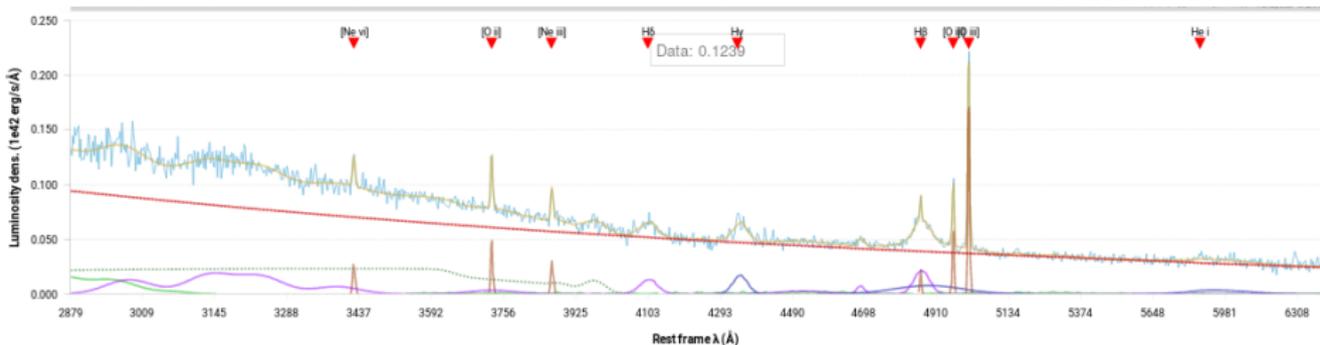
# Automatic analysis of optical AGN spectra

Giorgio Calderone<sup>1</sup>

in collaboration with:  
Luciano Nicastro<sup>2</sup>, Gabriele Ghisellini<sup>3</sup>, Massimo Dotti<sup>4</sup>,  
Tullia Sbarrato<sup>4</sup>, Francesco Shankar<sup>5</sup>, Monica Colpi<sup>4</sup>

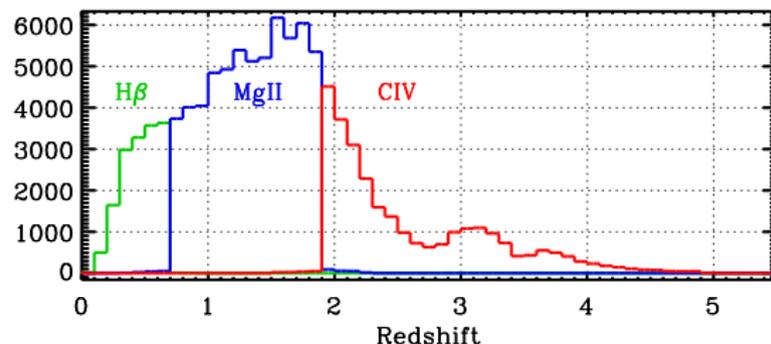
<sup>1</sup> INAF – Osservatorio Astronomico di Trieste, <sup>2</sup> INAF – Istituto di Astrofisica Spaziale e Fisica Cosmica,

<sup>3</sup> INAF – Osservatorio Astronomico di Brera, <sup>4</sup> Università degli studi di Milano–Bicocca, <sup>5</sup> University of Southampton (UK)



## Shen et al. 2011 (S11) catalog

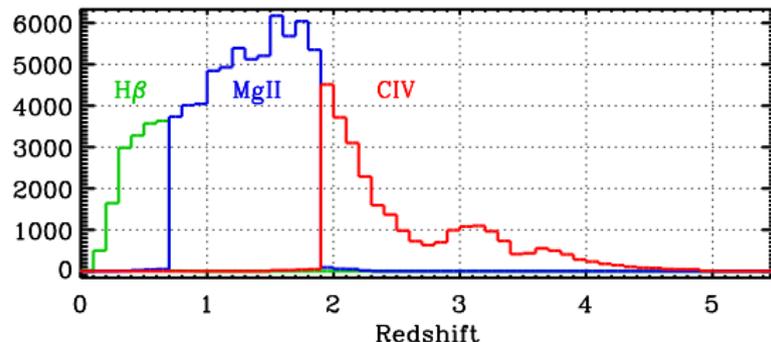
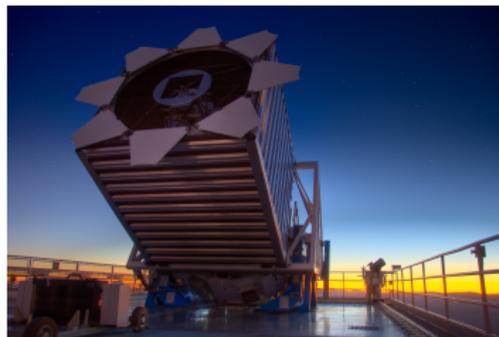
- Sample of 105,783 Type 1 AGNs:
  - $M_i$  brighter than  $-22$ ;
  - at least one line broader than  $1000 \text{ km s}^{-1}$ ;
- Spectra from SDSS/DR7 ( $\sim 3800\text{--}9000\text{\AA}$ )
- Catalog of spectroscopic properties, e.g.
  - Cont. luminosity  $\lambda L_\lambda$  @  $5100\text{\AA}$ ,  $3000\text{\AA}$  and  $1350\text{\AA}$
  - FWHM of  $H\beta$ ,  $Mg\text{ II}$  and  $C\text{ IV}$  (and other) lines



- Catalog released as FITS file;
- $> 600$  citations;

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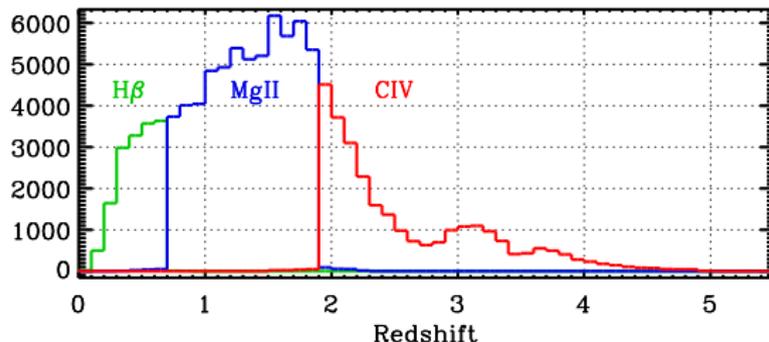
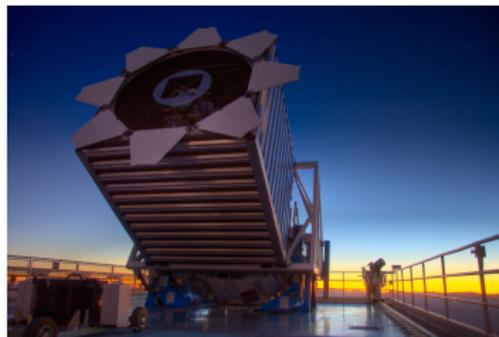
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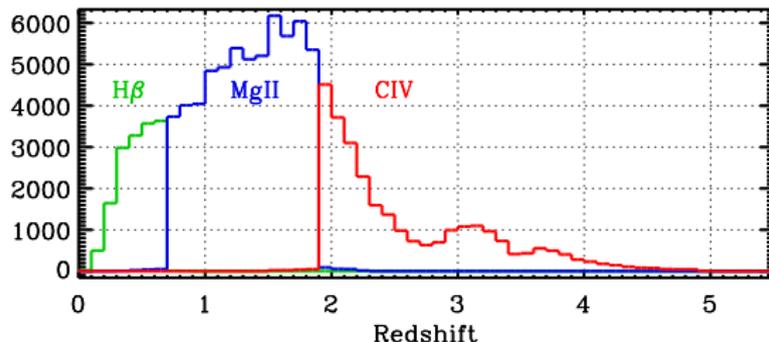
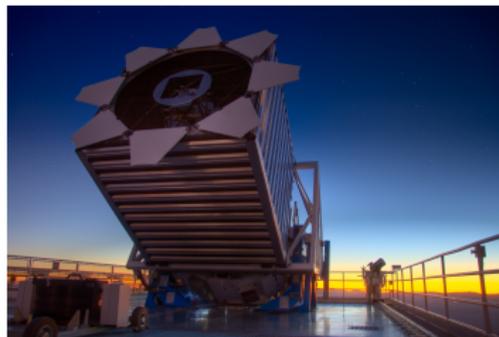
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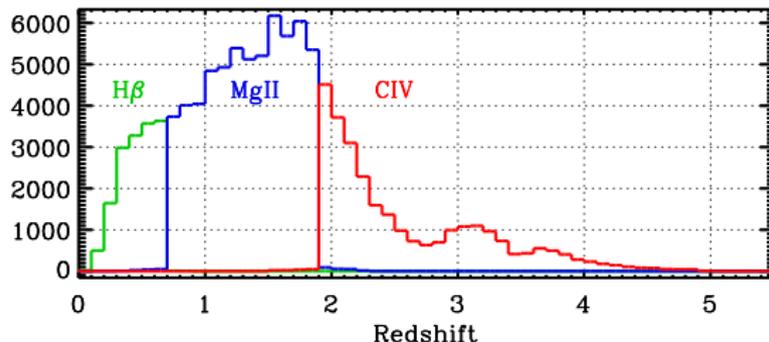
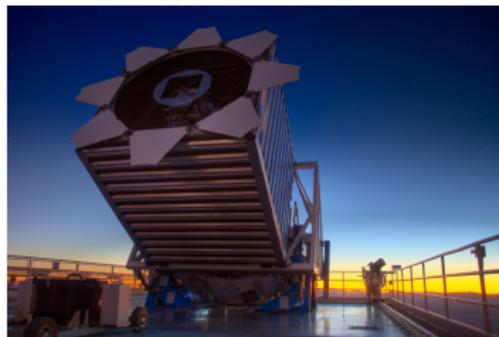
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- **do not accounts** for host galaxy contribution;
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- the continuum is constrained **locally**, in the neighborhood of an emission line;
- the data analysis is **hardly reproducible** (source code has not been released);

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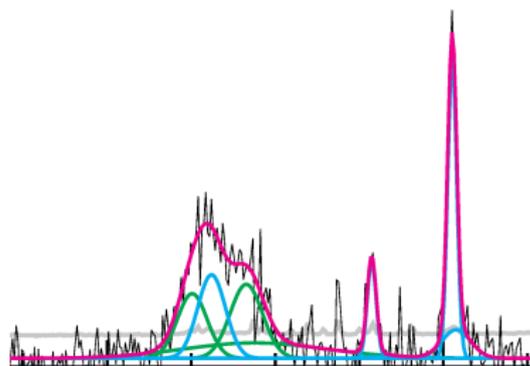
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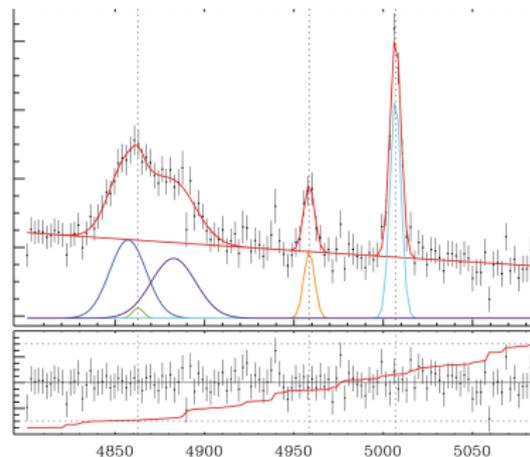
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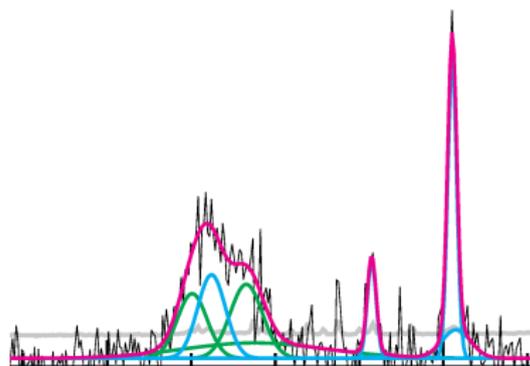


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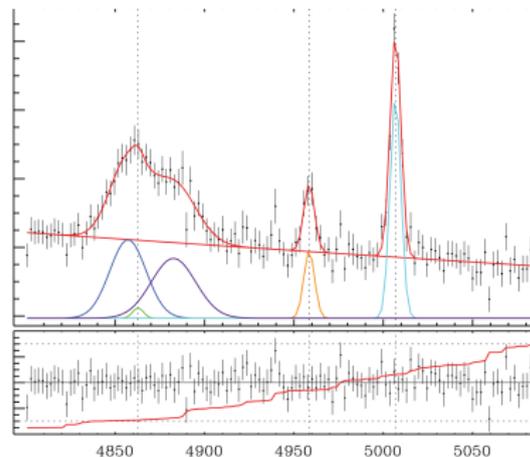
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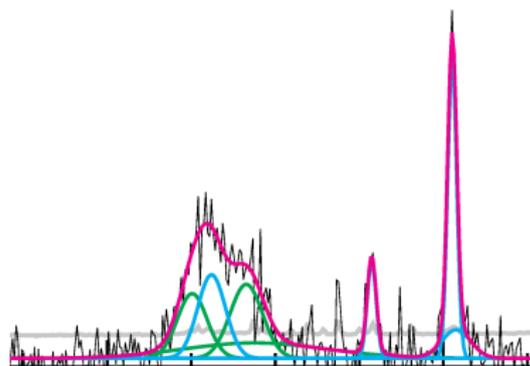


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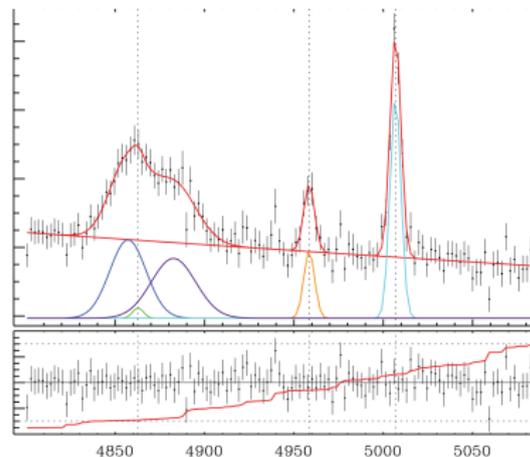
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## Motivations:

- estimate AGN spectral quantities (luminosities, slopes, emission line properties, etc...);
- do it **quickly** and **automatically** on large samples;
- Goal: generate a catalog of spectral quantities.

- analyze AGN spectra in a **simple, replicable and shareable** way using standardized recipes;
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- 1 Several model “components”:
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  - emission line profile
  - host galaxy
  - Iron and Balmer templates
- 2 An environment *programmatically* to manipulate such components and their parameters:
  - arbitrary combination;
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## QSFit *recipe*:

- 1 Fit continuum (PL), host galaxy contribution and Balmer continuum and pseudo-continuum;
- 2 Subtract continuum offset: negative residuals: 50%  $\rightarrow$  10%;
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Polletta+2007
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[Ne VI]	3426.85	N	H $\alpha$	6564.61	B
[O II]	3729.875	N			N
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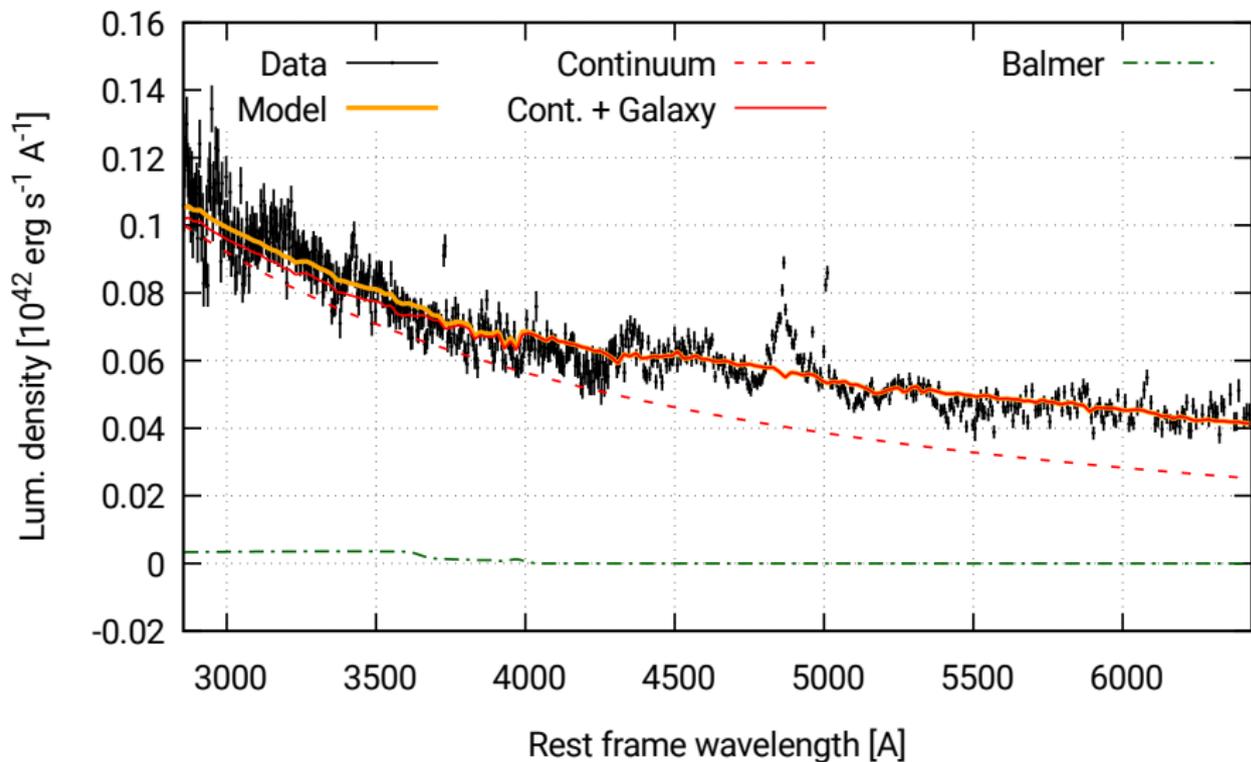
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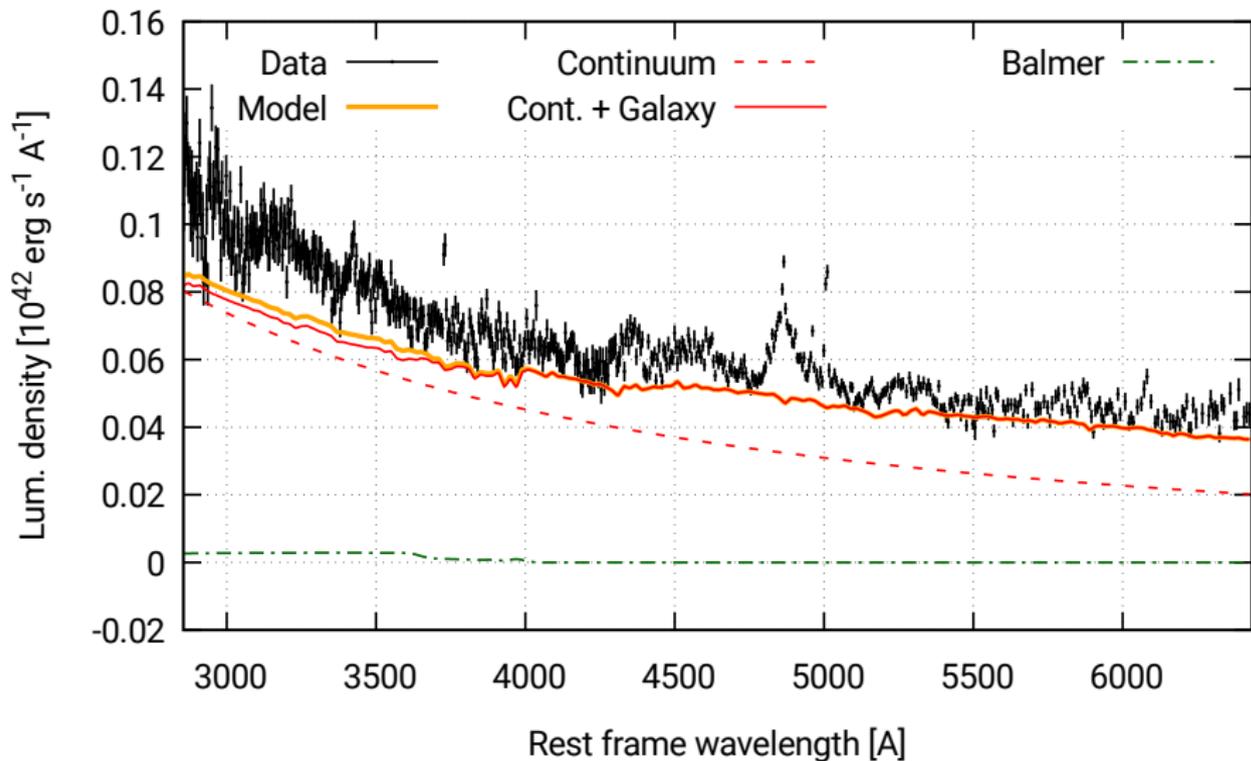
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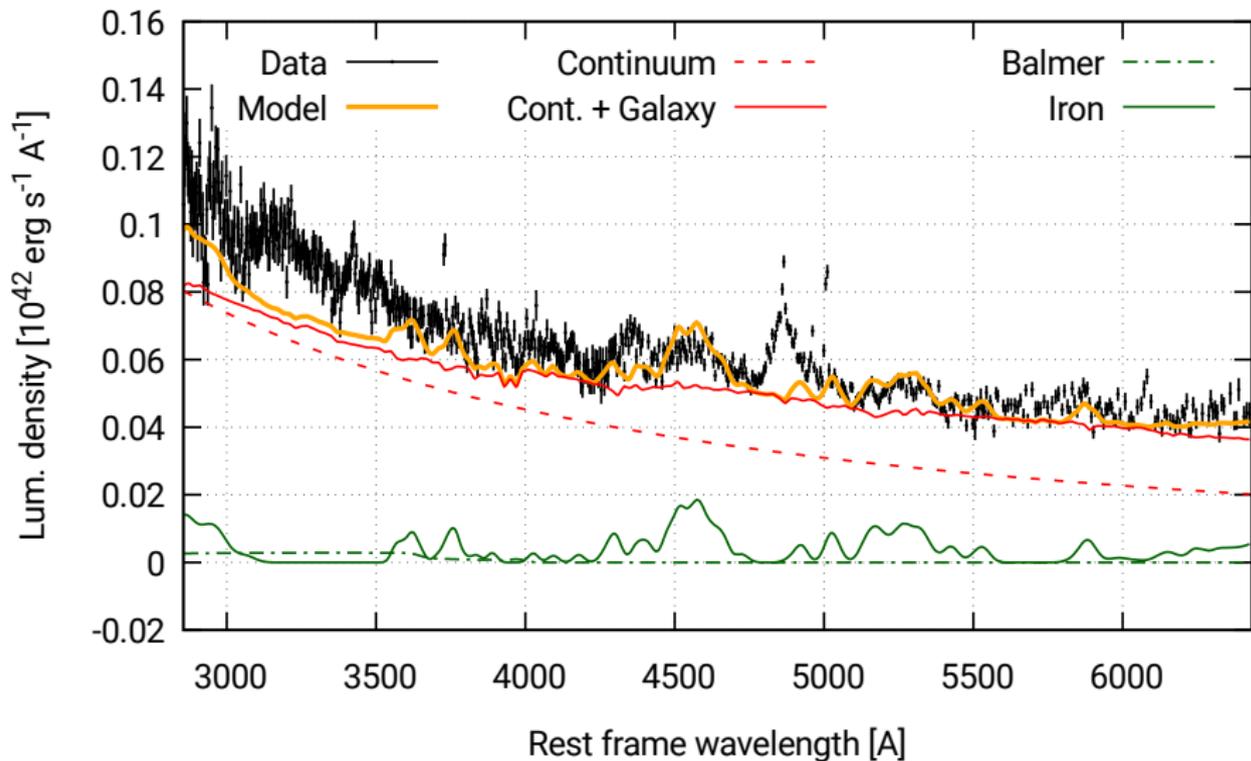
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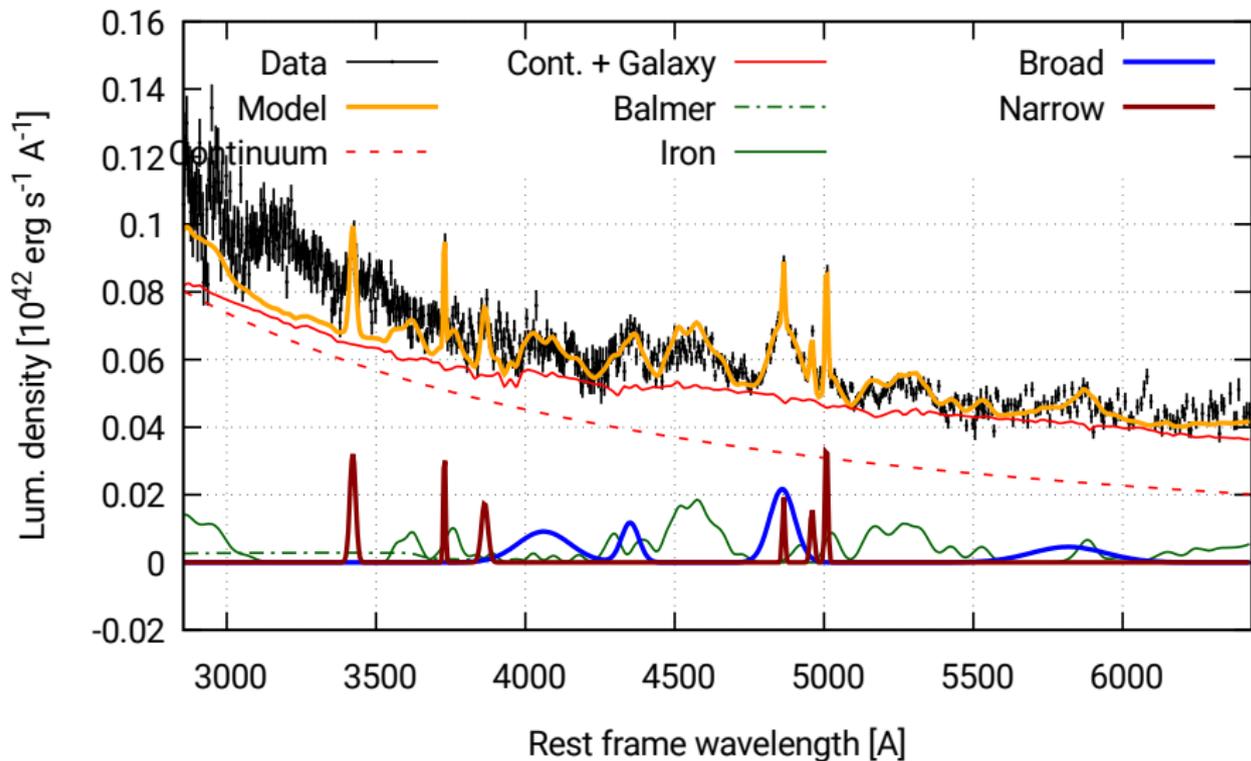
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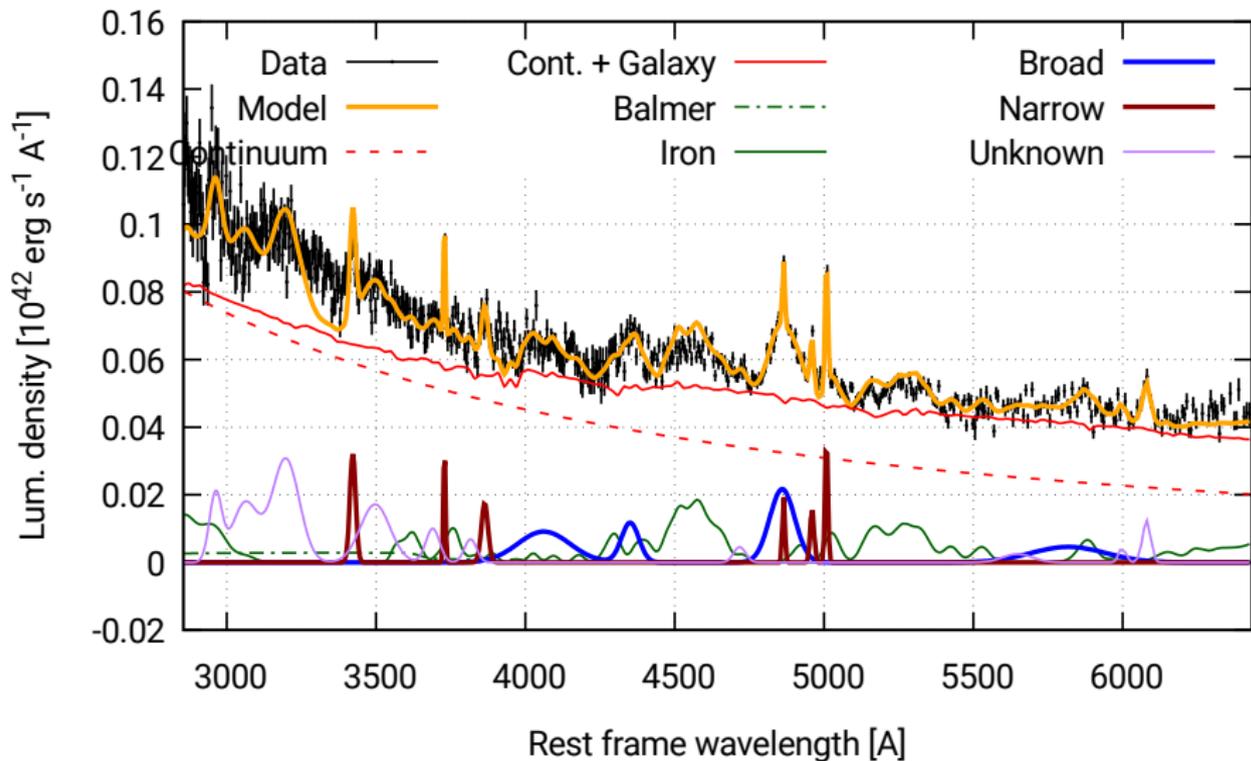
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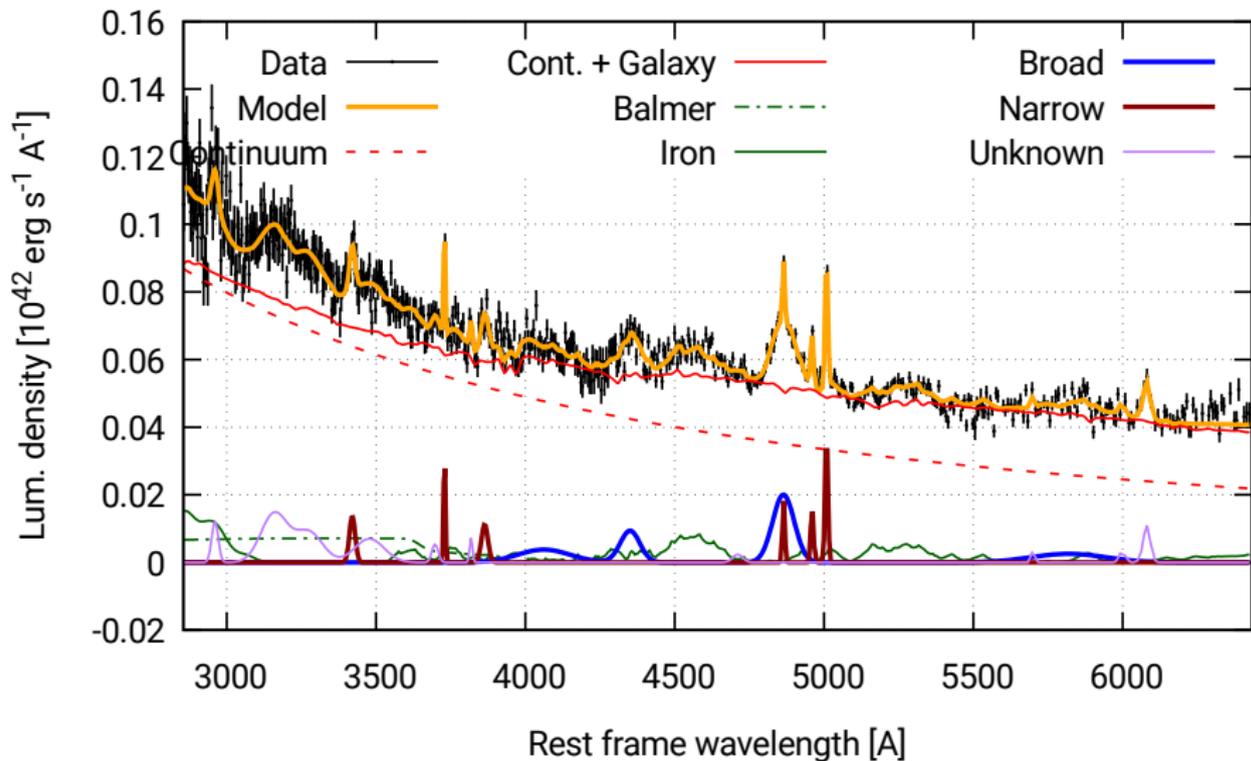
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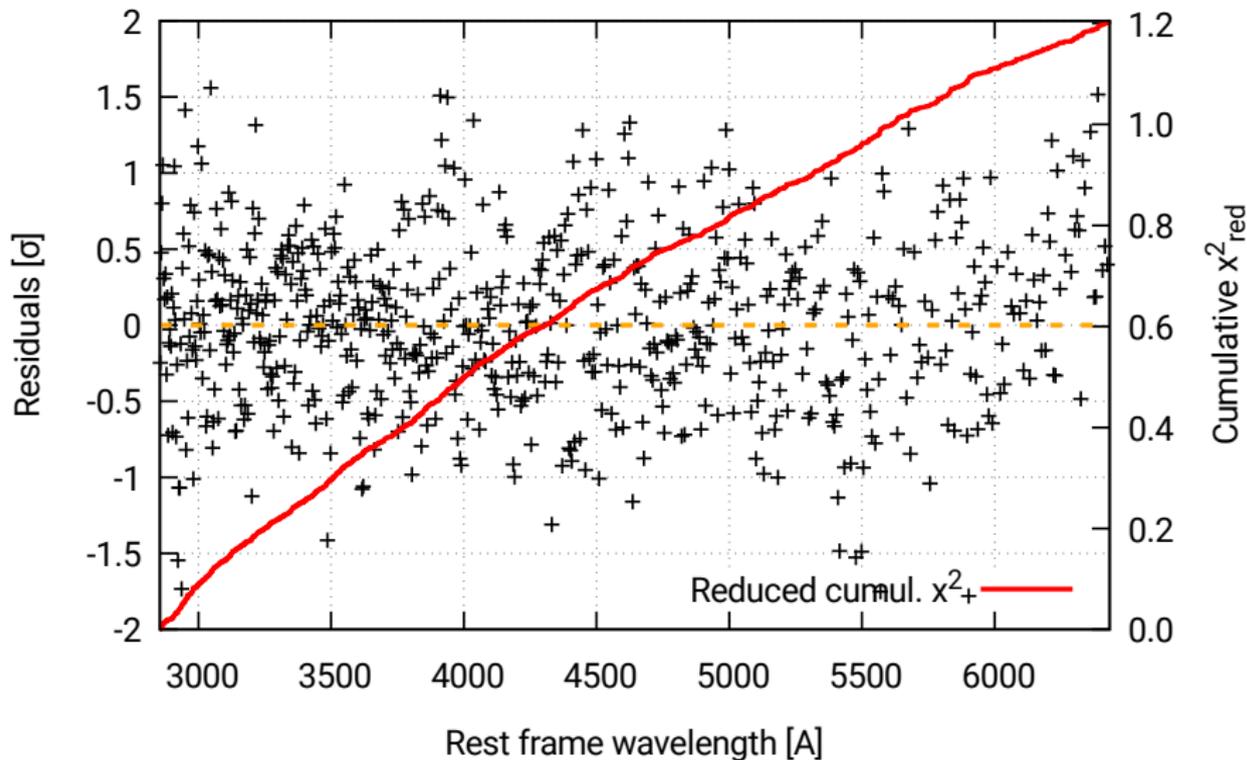
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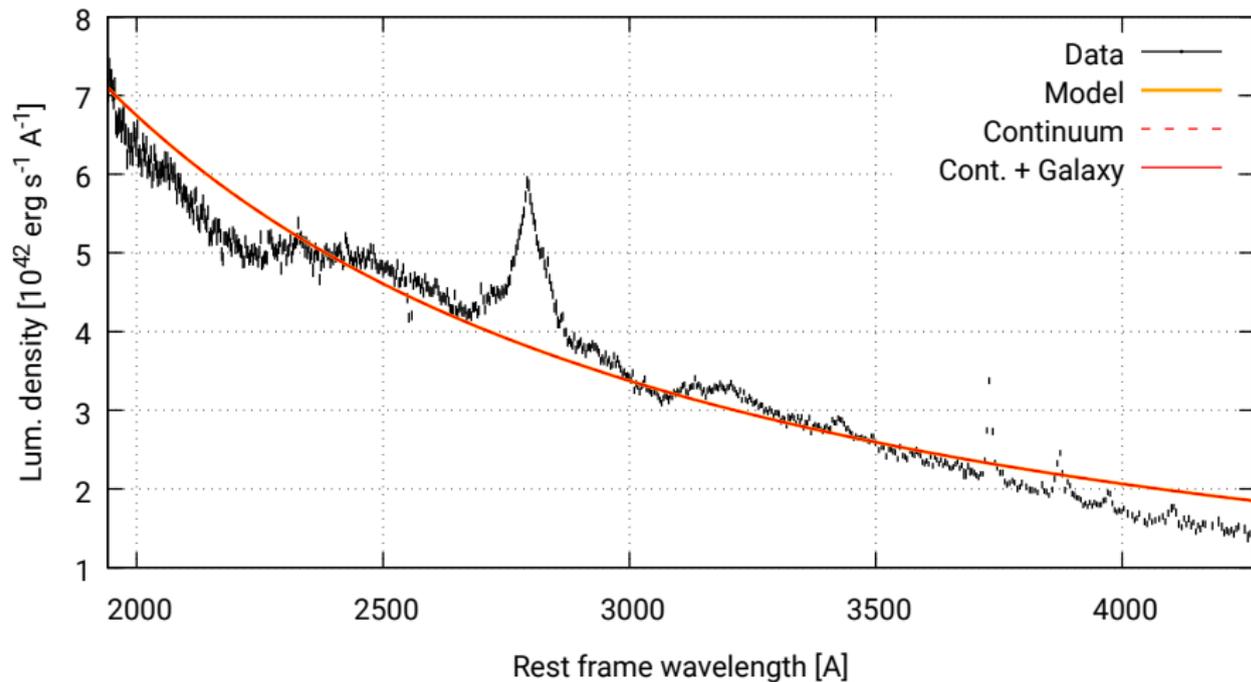


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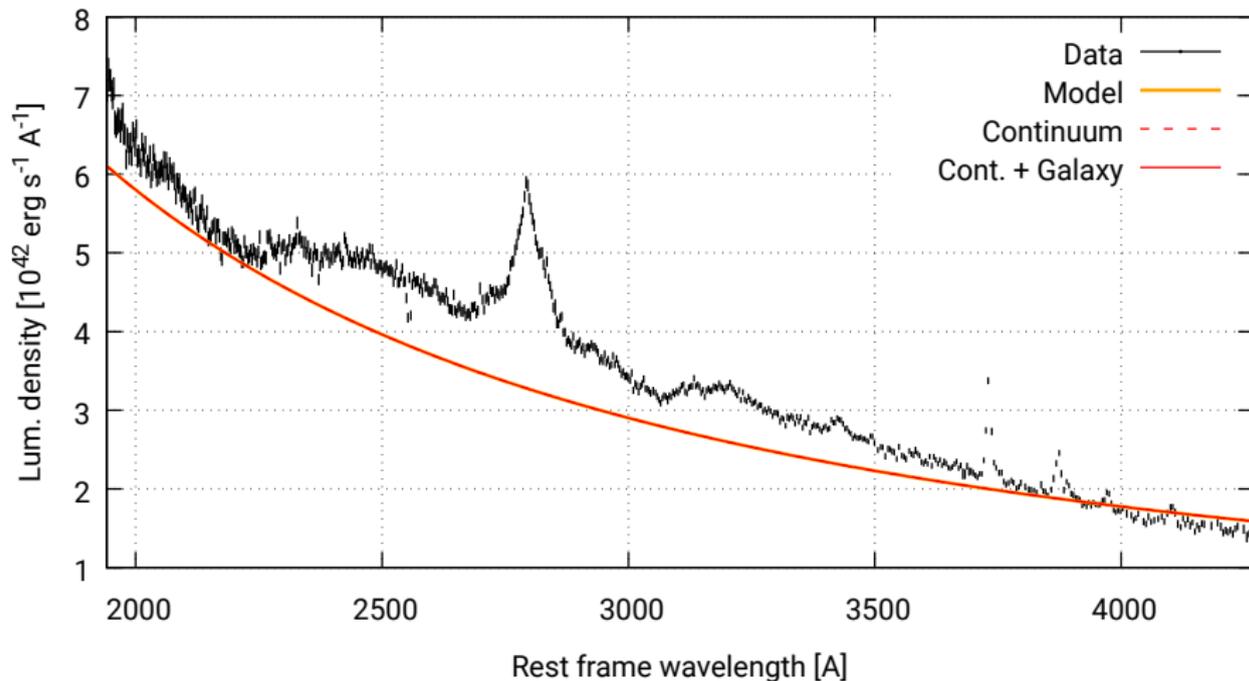


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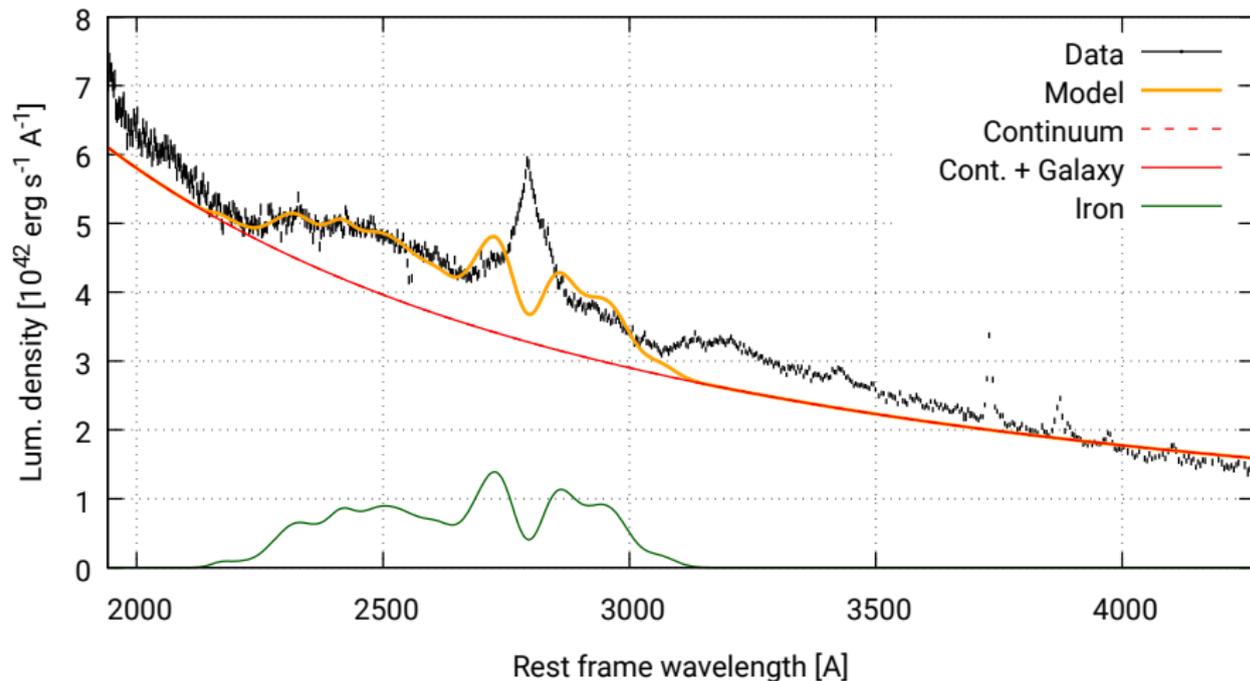
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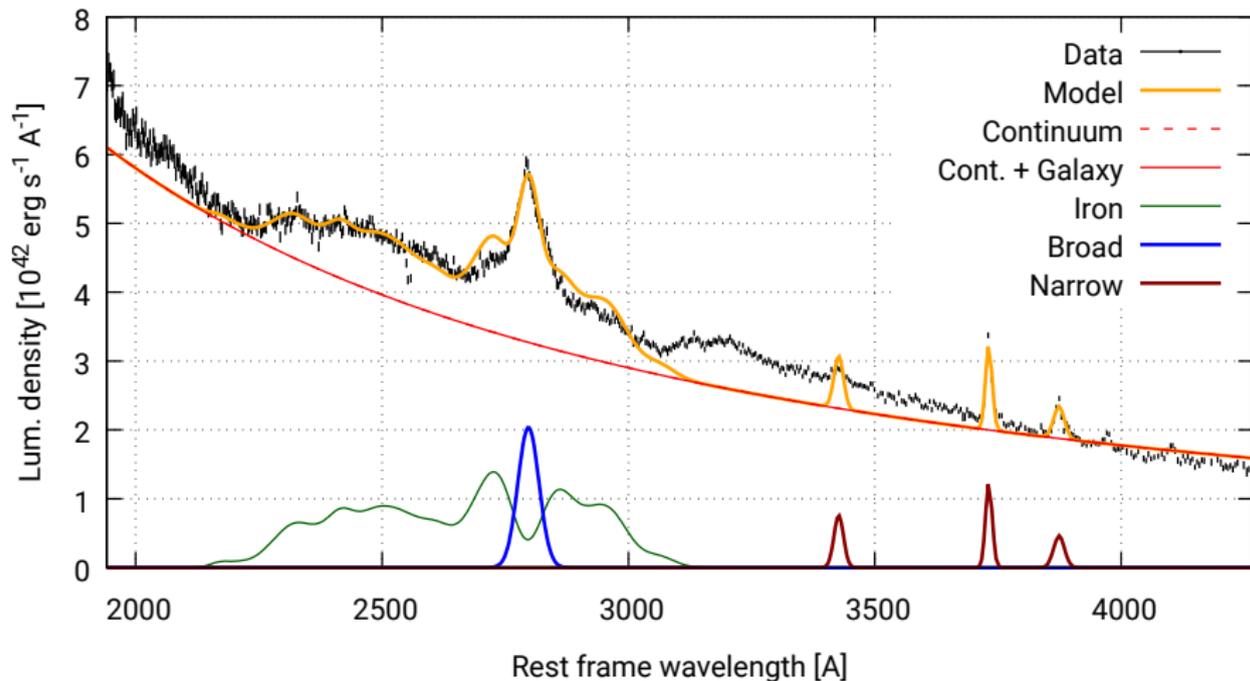


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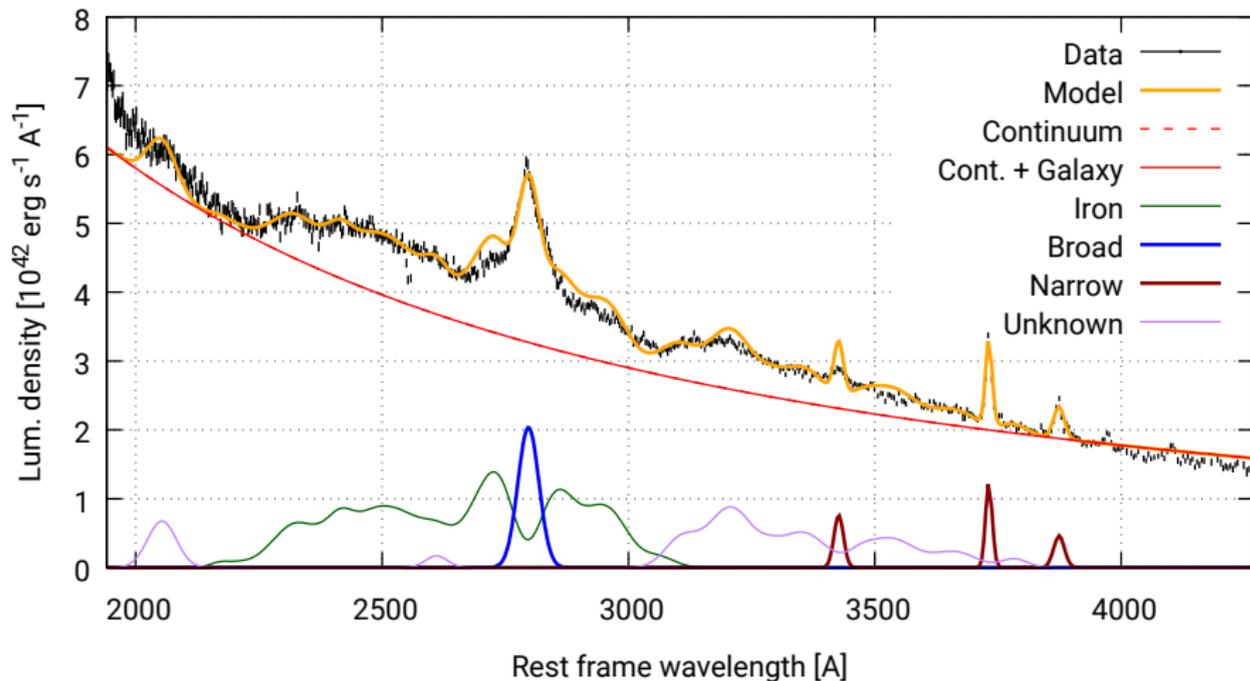
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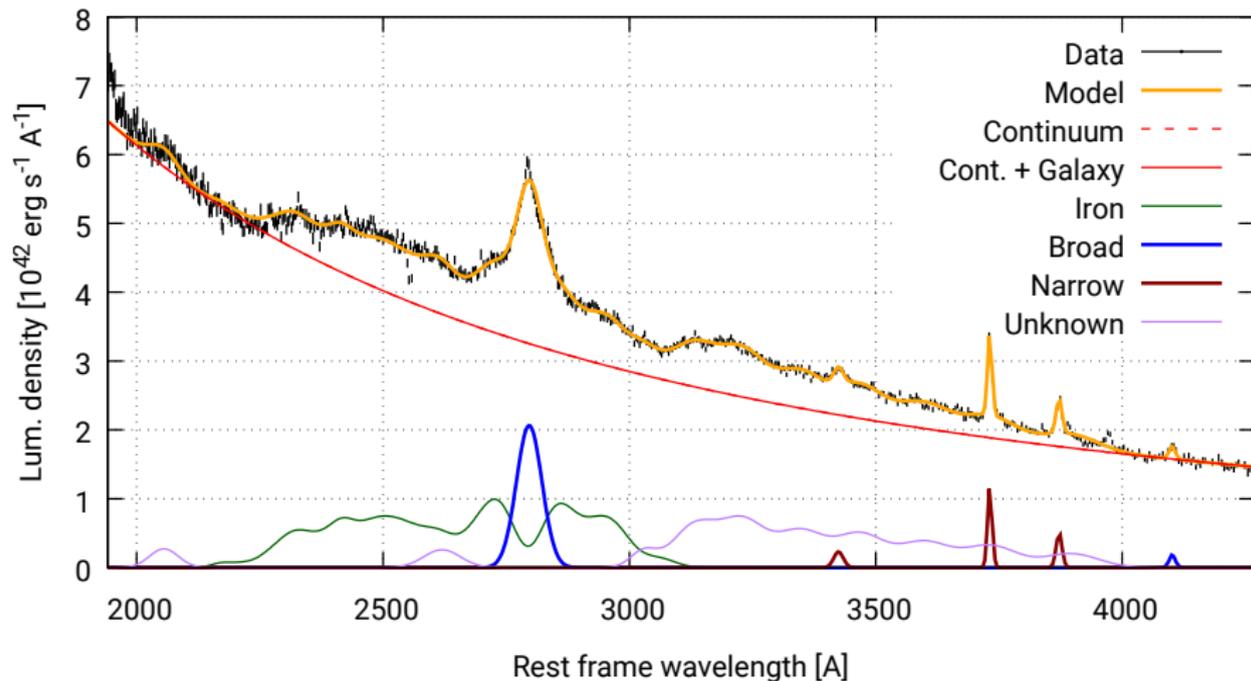
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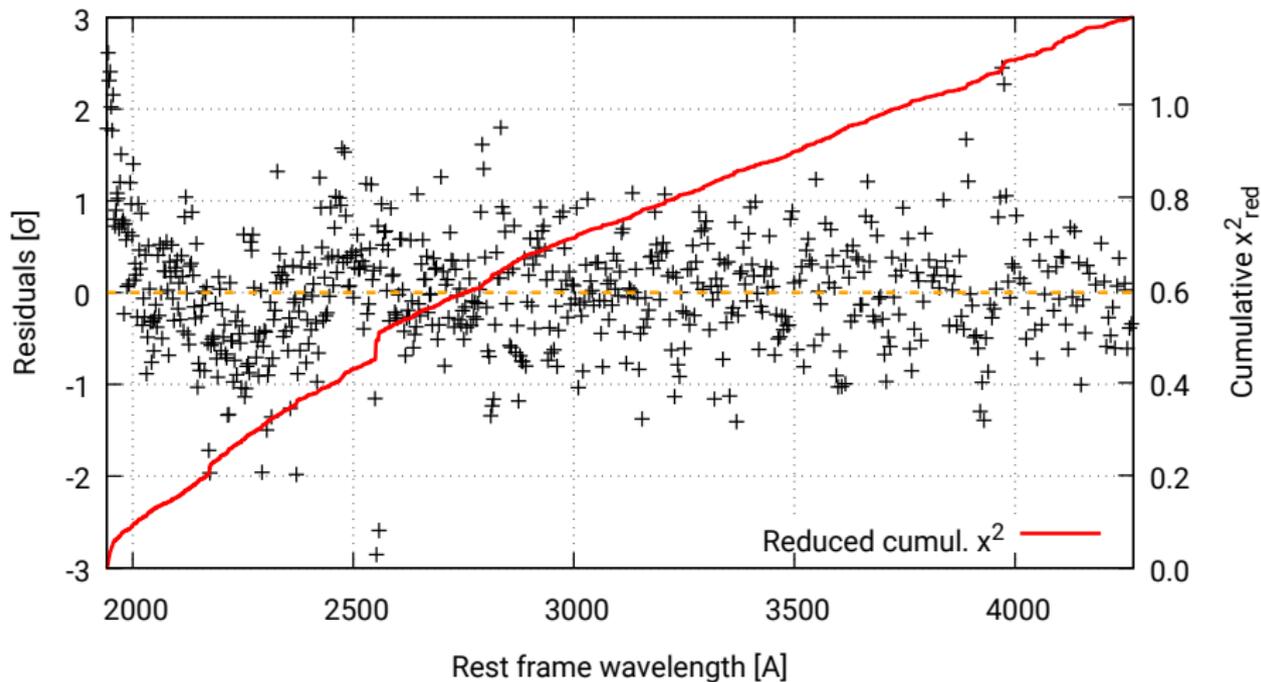
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spec-0433-51873-0181.fits,  $z=1.0669$ ,  $E(B-V)=0.050273$



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spec-0433-51873-0181.fits,  $z=1.0669$ ,  $E(B-V)=0.050273$

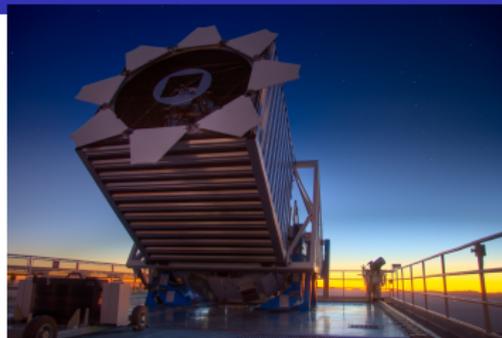


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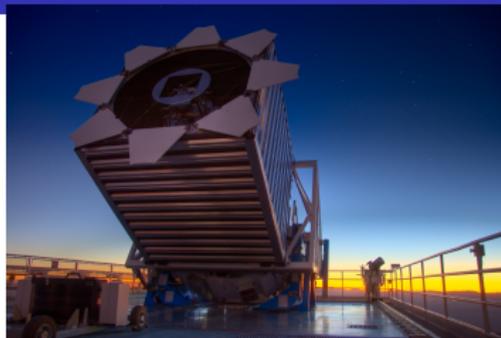
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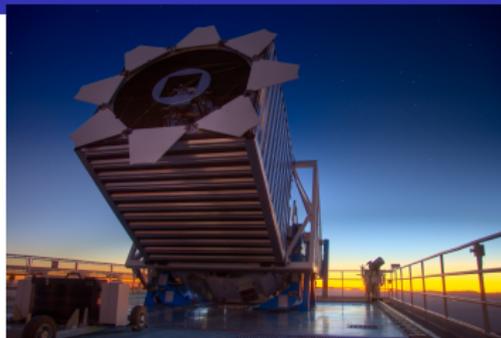
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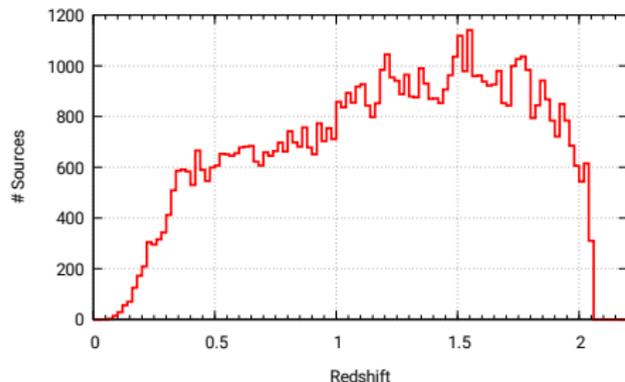
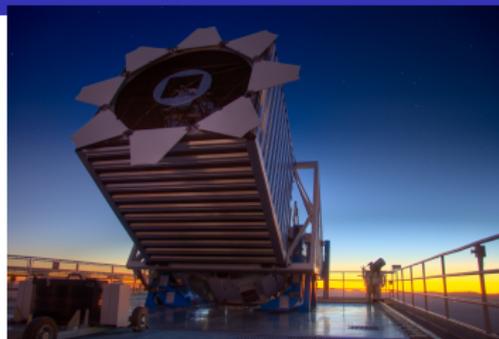
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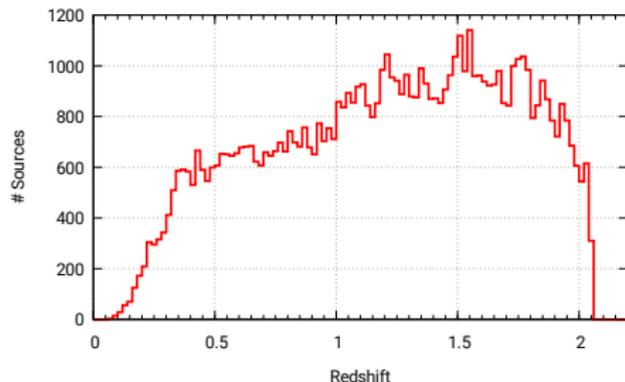
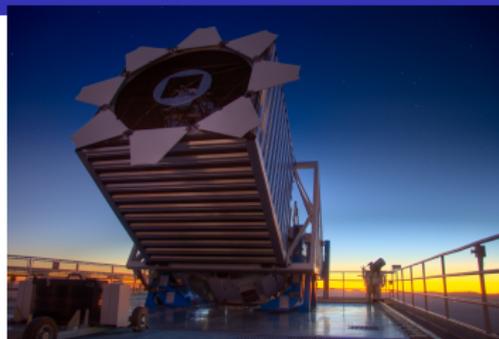


## The QSFit catalog

- 71,251 sources;
- QSFit input (SDSS data):  $\sim 18$  GB;
- QSFit output (results, plots, log files):  $\sim 35$  GB;
- Analysis time (12 simult. process INAF–Bologna):  $\sim 24$  hours;
- Size of final catalog (S11 + QSFit):  $\sim 85$  MB;
- $\chi^2_{\text{red}} \sim 1.09$  (median);
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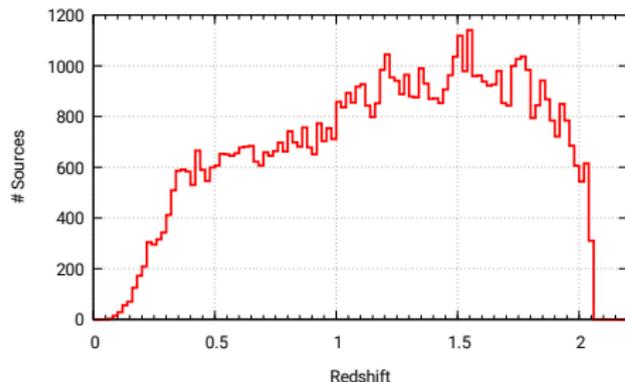
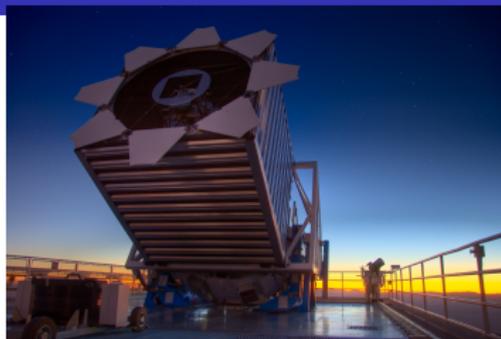


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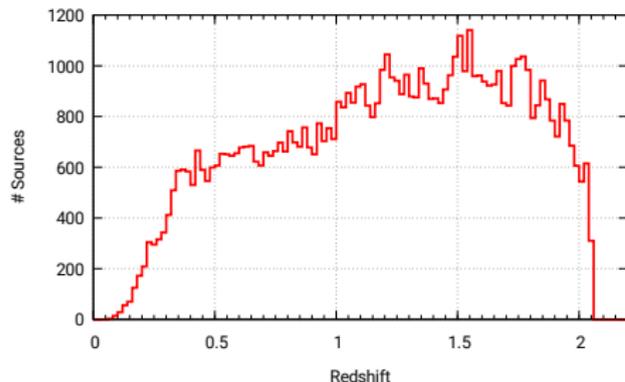
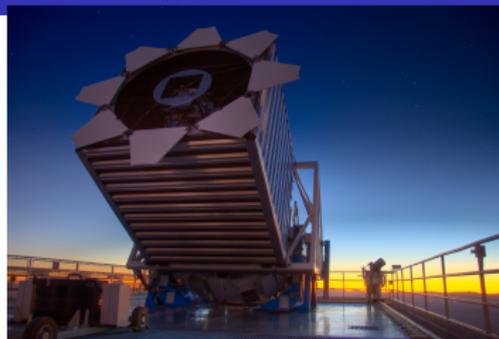


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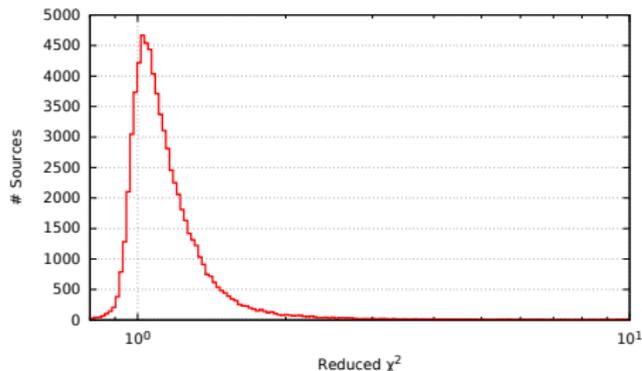
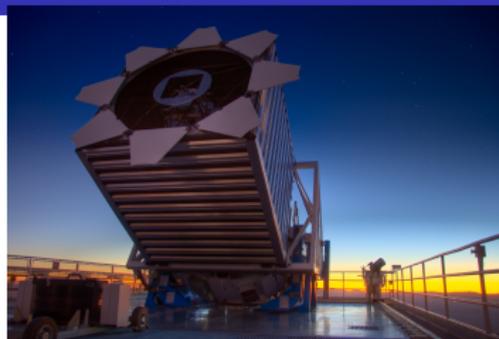


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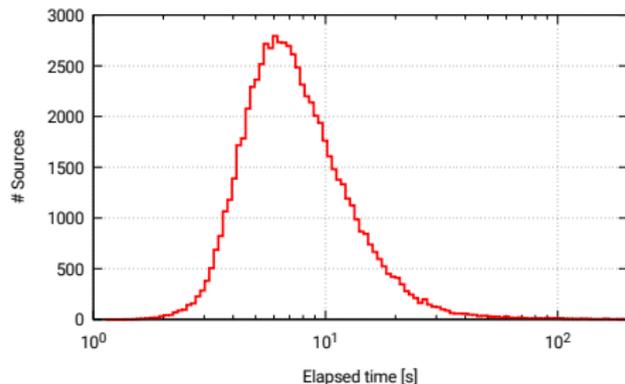
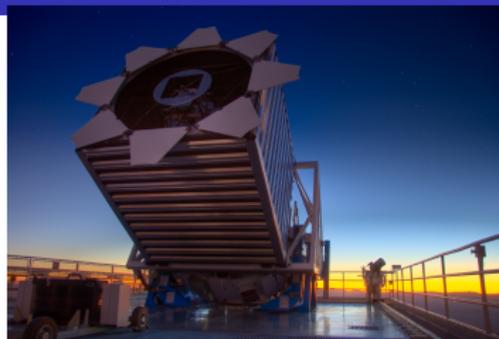


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## Quasar Spectral FITting package

QSFit is a software package to automatically perform spectral analysis of Active Galactic Nuclei (AGN) optical/UV spectra. It provides estimates of:

- AGN continuum luminosities and slopes at several rest frame wavelengths;
- host galaxy luminosities (for sources with  $z < 0.8$ );
- luminosities, widths and velocity offsets of 20 individual emission lines (H $\alpha$ , H $\beta$ , MgII, [OIII], CIV, etc.), and luminosity of the blended Balmer lines ( $n \geq 7$ );
- luminosities of iron blended lines at optical and UV wavelengths;
- luminosity of the Balmer continuum;
- several "quality flags" to assess the reliability of the results.

The main purpose of QSFit is to allow anyone to perform AGN spectral analysis in a simple, replicable and shareable way. The code is available on Github and can be easily customized for specific purposes.

### Reference Paper

The paper was published on [MNRAS, 472, 4051-4080 \(2017\)](#). Preprint available from [arXiv](#).

If you make use of the catalog or the code, please acknowledge as: [Calderone et al., MNRAS, 72, 4 \(2017\)](#)

### New version released (v1.3.0)

A new QSFit version is available, see Changelog in [Github](#) for changes. Also, a new online calculator is available [here](#).

### Catalog of spectral properties (ver. 1.2.4)

#### NEWS

After the publication of the paper we found a few small bugs in the code affecting:

- the freezing/thawing of the iron template component at optical wavelengths (this bug affected only the spectral estimates for the sources with  $z < 0.4$ );
- the calculation of the spectral coverage of the emission lines (this bug affected only those source with many spectral channels whose quality mask is not zero, as marked by the SDSS reduction pipeline);
- the spectral estimates of QSFit had a very weak dependence on the data type precision of the input keyword Z and EBV: changing them from FLOAT to DOUBLE would introduce slight discrepancies in the results.

We fixed all these bugs and generated a new QSFit catalog. The spectral estimates, in the vast majority of cases, are compatible with the previous ones (within the quoted uncertainties). The new catalog is available [here](#) and the new source code release can be downloaded [here](#).



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[About «](#)[Who we are »](#)[Composite spectra](#)

## Catalogue of spectral properties of Type 1 AGN (observed with SDSS-DR10)



Version 1.2

The QSFit reference paper is accepted for publication in MNRAS. [See the arXiv preprint.](#)

The QSFit catalog (ver. 1.2) is a collection of spectral properties of 71,251 Type 1 Active Galactic Nuclei (AGN), obtained by the SDSS-DR10 survey.

The QSFit catalog was compiled using the QSFit software package, specifically designed to automatically perform spectral analysis of AGN at optical/UV wavelengths, in a simple, replicable and shareable way.

The catalog provides estimates of:

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The catalog is available as a [FITS table](#). We also provide an [enlarged version](#) of the catalog where we added, for each source, the quantities reported in the Shen et al. 2011 catalog, to allow an easy comparison of the estimates in both catalogs.

You can browse the catalog using the search form below. The available search criteria are: the SDSS plate/MJD/fiber; the SDSS name; a redshift interval; and coordinates circle.

For each source we provide the **interactive plot** of best fitting model and residuals, the QSFit and Shen+11 estimates, several images of the source (using AladinLite), the SDSS FITS file of the spectra used for the analysis and the QSFit outputs, namely the log file, the gnuplot files and the IDL binary file where all the relevant info are stored.

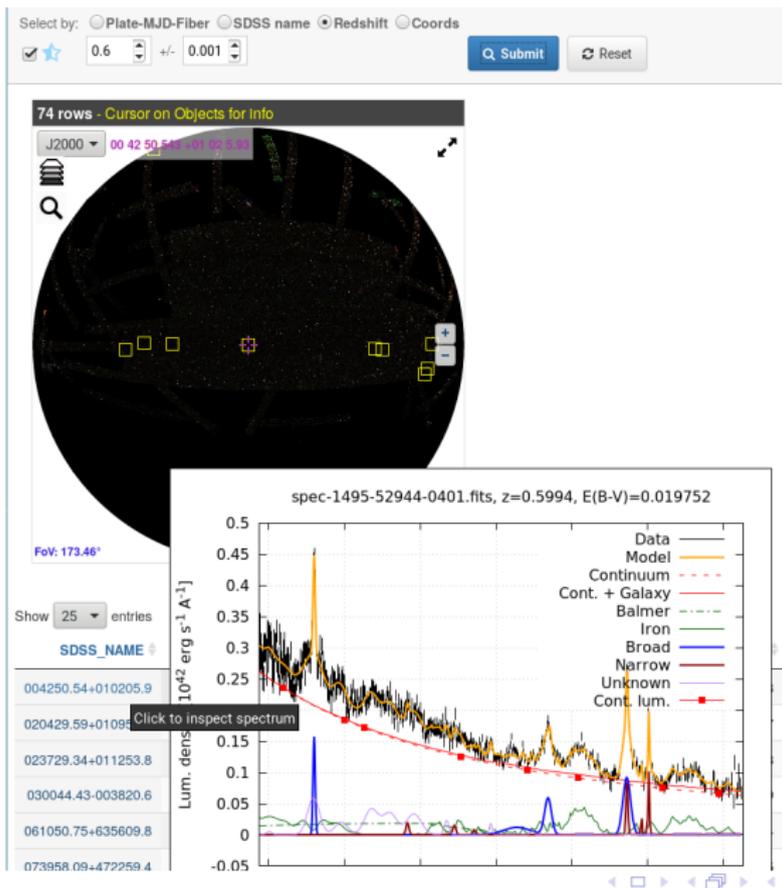
Select by:  Plate-MJD-Fiber  SDSS name  Redshift  Coords

289 - 51990 - 234

Submit

Reset

# The QSFit catalog: results



# The QSFit catalog: browse the spectrum

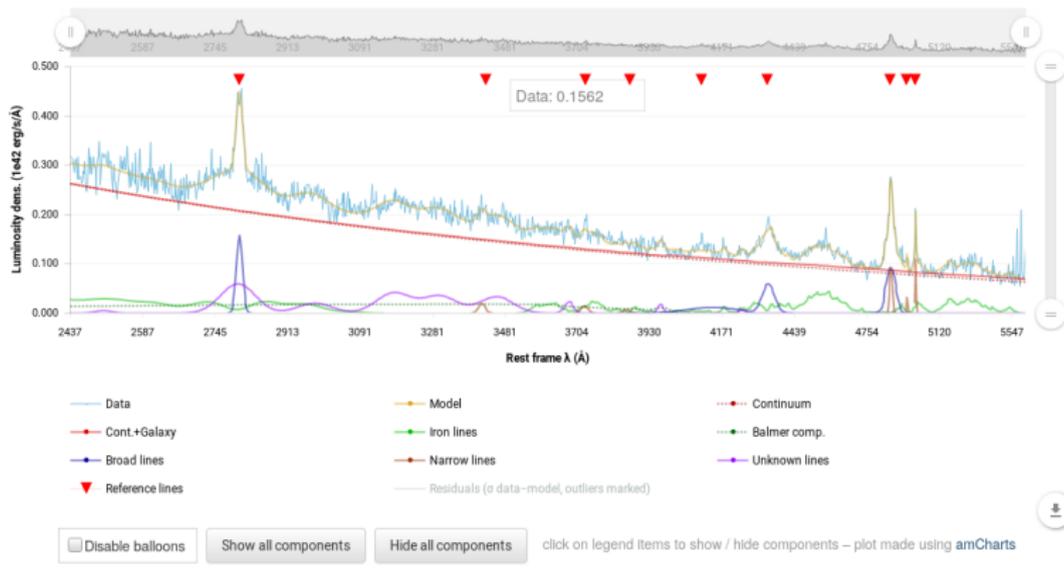


Catalogue of spectral properties of Type 1 AGN (observed with SDSS DR10)

Version 1.2

Show:  Emitted luminosity  De-reddened flux File: spec-1495-52944-0401 X range (Å): 2431 to 5642 Rebin fac.: 3 [Get data](#)

SDSS J004250.54+010205.9 [ z = 0.5994 ]



# The QSFit catalog: browse the spectrum

## Sky view & Catalogue selected fields



RA	10.71059	CONT5100_LUM	381.031
DEC	1.03498	GALAXY_LUM	34.2103
PLATE	1495	BR_CIV_1549_LUM	null
MJD	52944	BR_CIV_1549_FWHM	null
FIBER	401	BR_MGII_2798_LUM	8.78398
SPEC	spec-1495-52944-0401	BR_MGII_2798_FWHM	2312.27
E_BV	0.019752	BR_HB_LUM	5.78621
Flux to Lum. fac.	1.5218e-2	BR_HB_FWHM	3633.69
CONT1450_LUM	null	BR_HA_LUM	null
CONT3000_LUM	552.43	BR_HA_FWHM	null

Re-center on source

View all fields

## Associated files

View fit log file

Preview PNG

Download: [ Log file | Gnuplot data | Gnuplot residuals | IDL data | SDSS DR10 FITS ]

Query: SELECT \* FROM `spec-1495-52944-0401` WHERE x >= 1000 AND x <= 10000 ORDER BY x



L. Nicastro & G. Calderone 2016, 2017

## Applications:

- Statistical studies on AGN samples, e.g.:
  - trends of characteristic properties with redshift;
  - slopes of BAL vs. nonBAL sources ( $\Rightarrow$  C. Campbell, master thesis @ Univ. Southampton);
- Estimate importance of Balmer continuum in SEV mass estimates ( $\Rightarrow$  Varisco+18, master thesis @ Univ. Milano–Bicocca);
- Comparison of different galaxy templates;
- Comparison of emission line models (Gaussian, Lorentzian, etc...);
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- Fit of multiple spectra simultaneously;
- Added [OIII]5007 blue wing model component;
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## The *near* future: Calderone 2019 (...or 2020 ?)

- Analyze the DR14Q (up to  $z \sim 3$ ) catalog (Pâris et al. 2018);
- Extend the analysis to  $z \sim 3$  (consider absorptions up to Lyman edge);
- **Abandon IDL!**  $\Rightarrow$  complete open source implementation in **Julia**:

## Easy reproducibility of results is a must!

- Released as free software (<https://www.gnu.org/philosophy/free-sw.en.html>)
- Resist the temptation to design an all-encompassing, or too general package;
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## The *cooking* paradigm:

- **Ingredients:** small, well-defined functionalities which can be documented in less than  $\sim 1$  page, and implemented in a black box (i.e. a library);
- **Recipes:** brief solutions to a problem (even an ill-posed one) based on ingredients.
  - No need to be perfect: **if you can do science with it, it is worth to be relased!**

# Conclusions

- QSFit allows **simple, replicable and shareable** standardized recipes for AGN spectral fitting;
- It is **the only open source** package currently available, allowing **customized** recipes;
- We applied the **QSFit** recipe to a sample of 71,251 sources with  $z < 2 \Rightarrow$  **QSFit catalog**:
  - all results, plots and logs, are publicly released in a dedicated website;
- Upcoming **QSFit** applications:
  - Automatic analysis of the DR14Q (up to  $z \sim 3$ ) catalog (Pàris et al. 2018);
  - Automatic analysis of J-PAS low resolution spectra;

## References:

- Paper: Calderone+17, MNRAS, 472, 4051  
(<http://adsabs.harvard.edu/abs/2017MNRAS.472.4051C>)
- QSFit website: <http://qsfit.inaf.it/>
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- Basic take home messages:
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  - **Extract ingredients from recipes**
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# Conclusions

- QSFit allows **simple, replicable and shareable** standardized recipes for AGN spectral fitting;
- It is **the only open source** package currently available, allowing **customized** recipes;
- We applied the **QSFit** recipe to a sample of 71,251 sources with  $z < 2 \Rightarrow$  **QSFit catalog**:
  - all results, plots and logs, are publicly released in a dedicated website;
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  - Automatic analysis of the DR14Q (up to  $z \sim 3$ ) catalog (Pàris et al. 2018);
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