

HALO21 tutorial: Quasar absorption line fitting

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- The Voigt profile
Mark Krumholz's graduate course
(<https://sites.google.com/a/ucsc.edu/krumholz/teaching-and-courses/ast-230-s-12>)
- Fit quasar continuum with linetools (Prochaska, Tejos+)
<https://github.com/linetools/linetools>
- Fit absorption lines with ALIS (Ryan Cooke)
<https://github.com/rcooke-ast/ALIS>

The Voigt profile

The flux we observe from a source through a foreground gas is $F_\nu = F_\nu(0) \exp(-\tau_\nu)$.

Interpolate in frequency from one side of a line to the other to estimate $F_\nu(0)$.

The optical depth is $\tau_\nu \approx (\pi e^2/m_e c) f_{\ell u} N_\ell \phi_\nu$,
where N_ℓ is the column density through the cloud,
and the line profile function ϕ_ν is a Voigt profile.

A Voigt profile has a Gaussian core and Lorentzian damping wings.

Focus on the core,

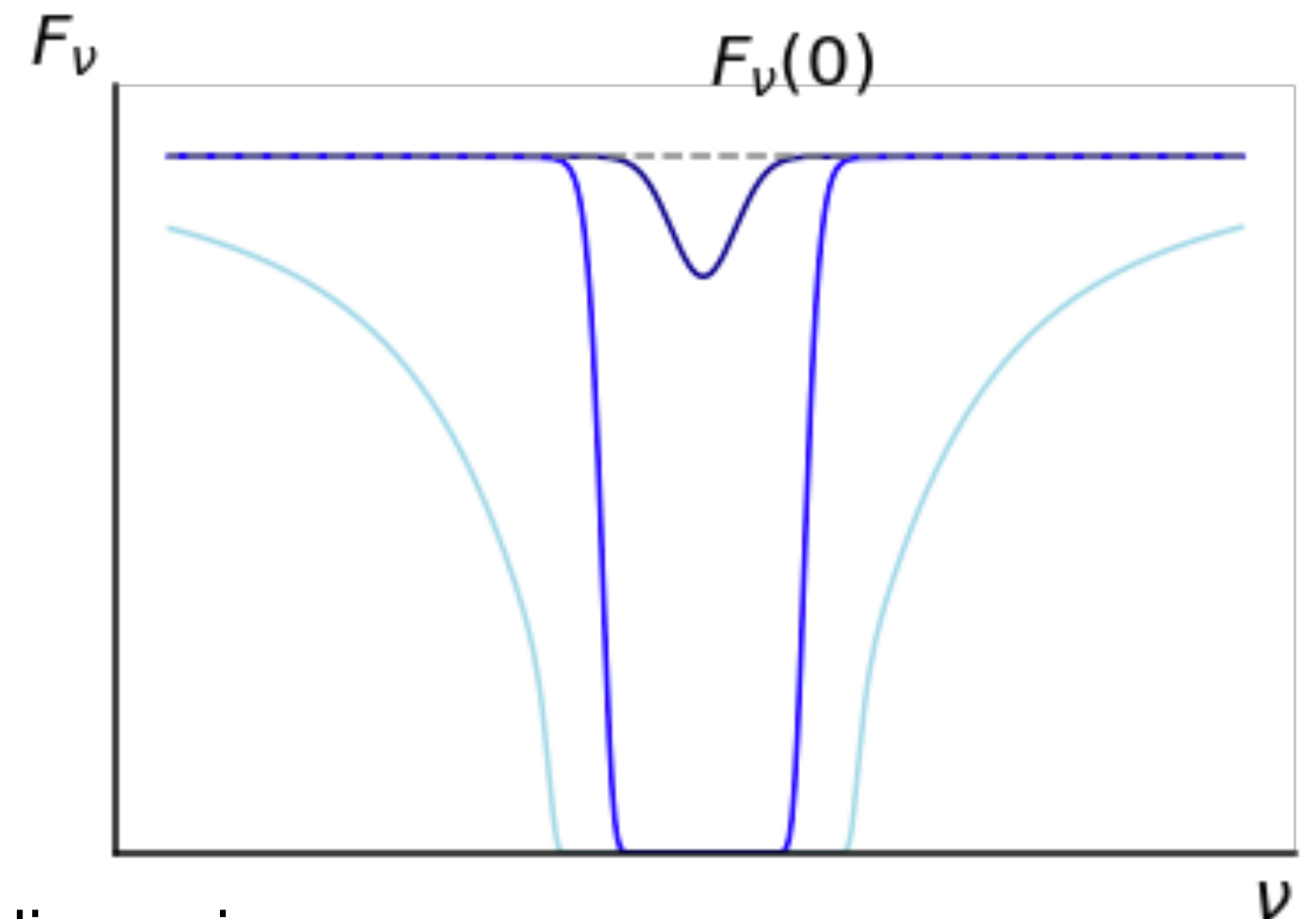
$$\phi_\nu = 1/(\sqrt{\pi} b v_0/c) \exp(-(1-\nu/v_0)^2/(b/c)^2) ,$$

where $b = \sqrt{2}\sigma_\nu$ is the Doppler parameter, which is $\sqrt{2}$ times the velocity dispersion.

As the optical depth increases, the line center is saturated.

As the optical depth continues to increase, the Lorentzian damping wings dominate.

For HI Lyman α , damping dominates at optical depth $\approx 10^5$, corresponding to column density $\approx \text{few} \times 10^{19} \text{ cm}^{-2}$.



Continuum fitting

Fit a quasar continuum by interpolation, and normalize.

The linetools algorithm:

The spectrum is split into an arbitrary number of wavelength intervals.

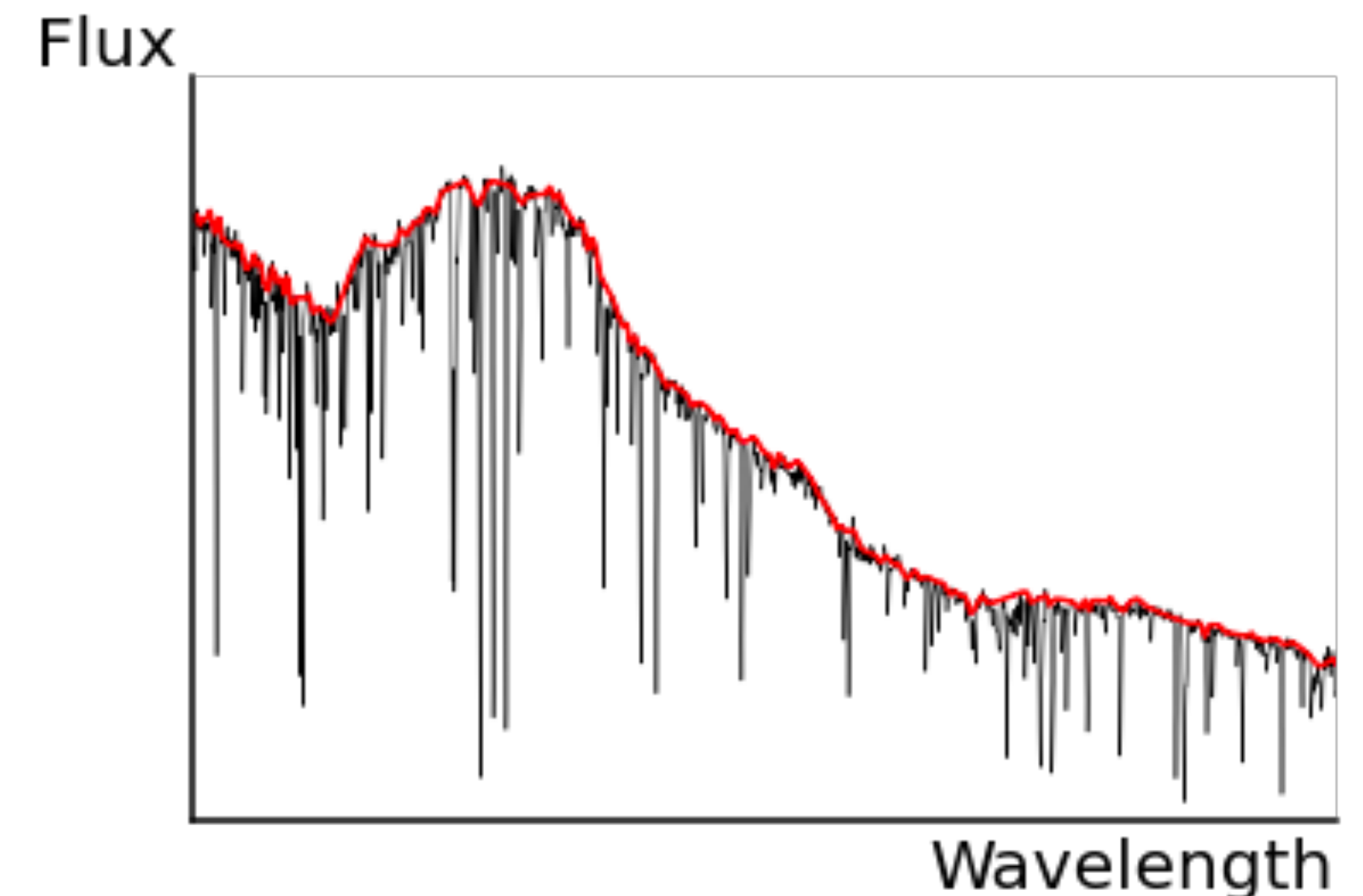
The flux median is calculated in each wavelength interval.

A cubic spline is fitted through points defined by the central wavelength and median flux value in each interval.

Pixels falling more than 1.5 standard deviations below the spline are masked.

Process is iterated over until no further pixels are removed as outliers.

In regions where the fit appears poor, user manually tweaks it.



Longer version of the linetools algorithm:

“The unabsorbed quasar continuum is fitted interactively using the Python software package linetools. The spectrum is splitted into an arbitrary number of wavelength intervals that are chosen based on trial and error. They are about 12.5 rest frame Å wide shortward of the Ly α emission, smaller across emission lines, and larger in regions free of emission lines and longward of Ly α . The flux median is calculated in each wavelength interval. An Akima spline is fitted through a set of points defined by the central wavelength and median flux value in each interval. (Akima's interpolation method uses a continuously differentiable sub-spline built from piecewise cubic polynomials. The resultant curve passes through the given data points and will appear smooth and natural.) A linear spline is also fitted for the purpose of removing outliers from the fitting routine, and pixels falling more than 1.5 standard deviations below the linear spline are masked. This process is iterated over until no further pixels are removed as outliers. The resultant Akima spline from this automated process may still have regions where the continuum fit appears poor, due to strong absorption lines, strong emission lines, or artifacts in the data. In regions where the fit appears poor, new spline knots are manually added or existing knots' wavelength locations are manually moved. Knots are added or moved until the fit is satisfactory.”

Example using linetools

A COS FUV spectrum of FBQS0751+2919 from CASBAH (Tripp, Burchett, Prochaska+), at redshift 0.9158. Load the data into an X Spectrum1D object.

```
In [31]: hdus = fits.open('FUV_casbah.fits')
         for hdu in hdus:
             print(hdu.header['EXTNAME'])
```

```
FLUX
ERROR
WAVELENGTH
```

```
In [42]: from linetools.spectra.xspectrum1d import XSpectrum1D
         FUVspec = XSpectrum1D.from_file('FUV_casbah.fits')
         FUVspec.flux, FUVspec.sig, FUVspec.wavelength
```

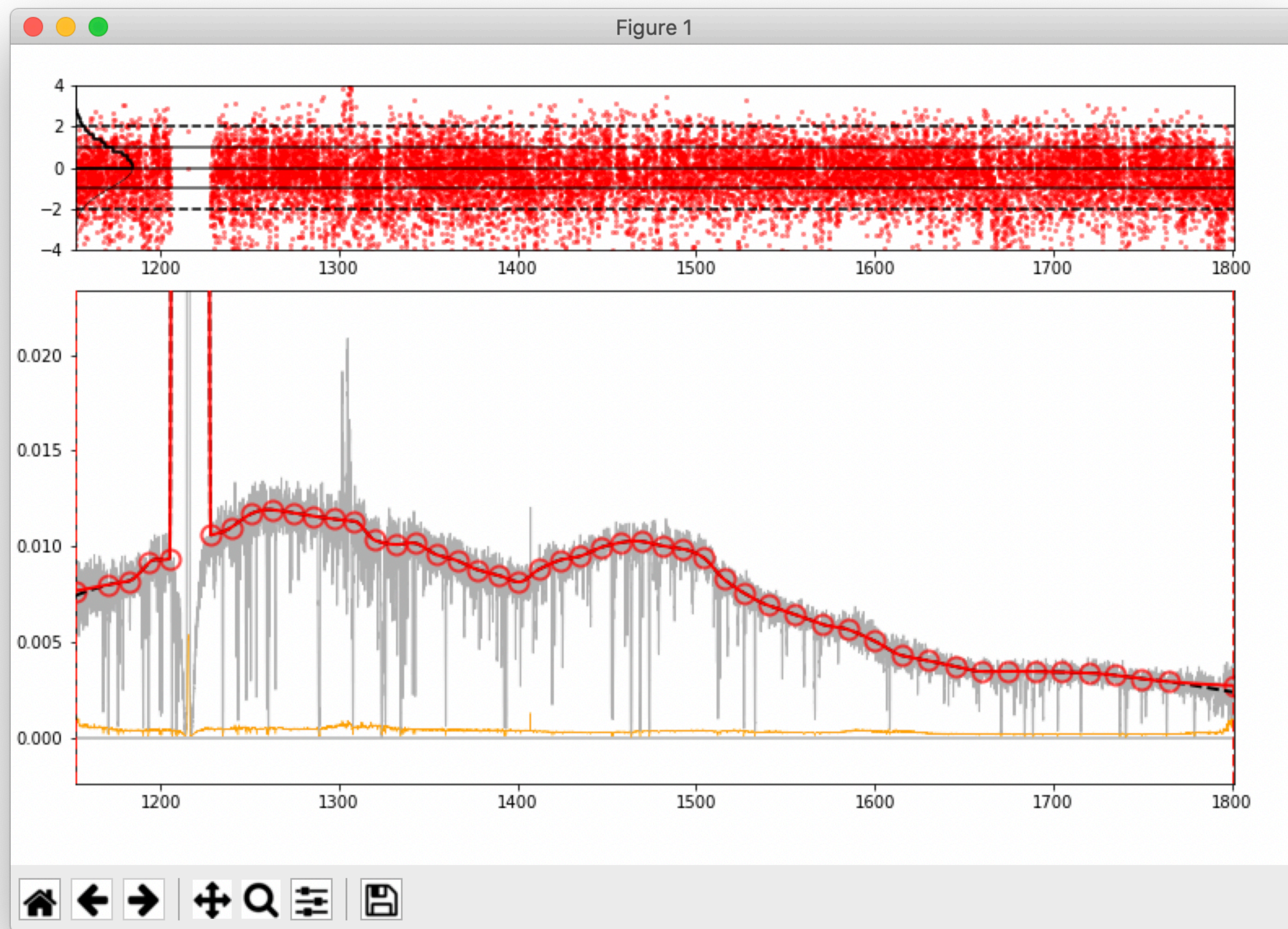
```
Out[42]: (<Quantity [0.00540083, 0.00448517, 0.00715887, ..., 0.001786 , 0.00136441,
                0.00098557]>,
         <Quantity [0.00080016, 0.00075065, 0.0009093 , ..., 0.00073565, 0.00070285,
                0.00069772]>,
         <Quantity [1152.0737497 , 1152.10365014, 1152.13355058, ..., 1801.38763993,
                1801.4243716 , 1801.46110328] Angstrom>)
```

```
In [29]: FUVspec.fit_continuum(kind='QSO', redshift=0.916)
```

Example using linetools

Interactively zoom in/out,
set plot limits,
pan left/right,
add a new spline knot,
delete the nearest knot,
or move the nearest knot.

Type q to quit and save the
continuum in the Xspectrum1D
object.



Example using linetools

Save to a file.

```
In [8]: FUVspec.write('FUV_casbah.fits')
```

Wrote spectrum to FUV_casbah.fits

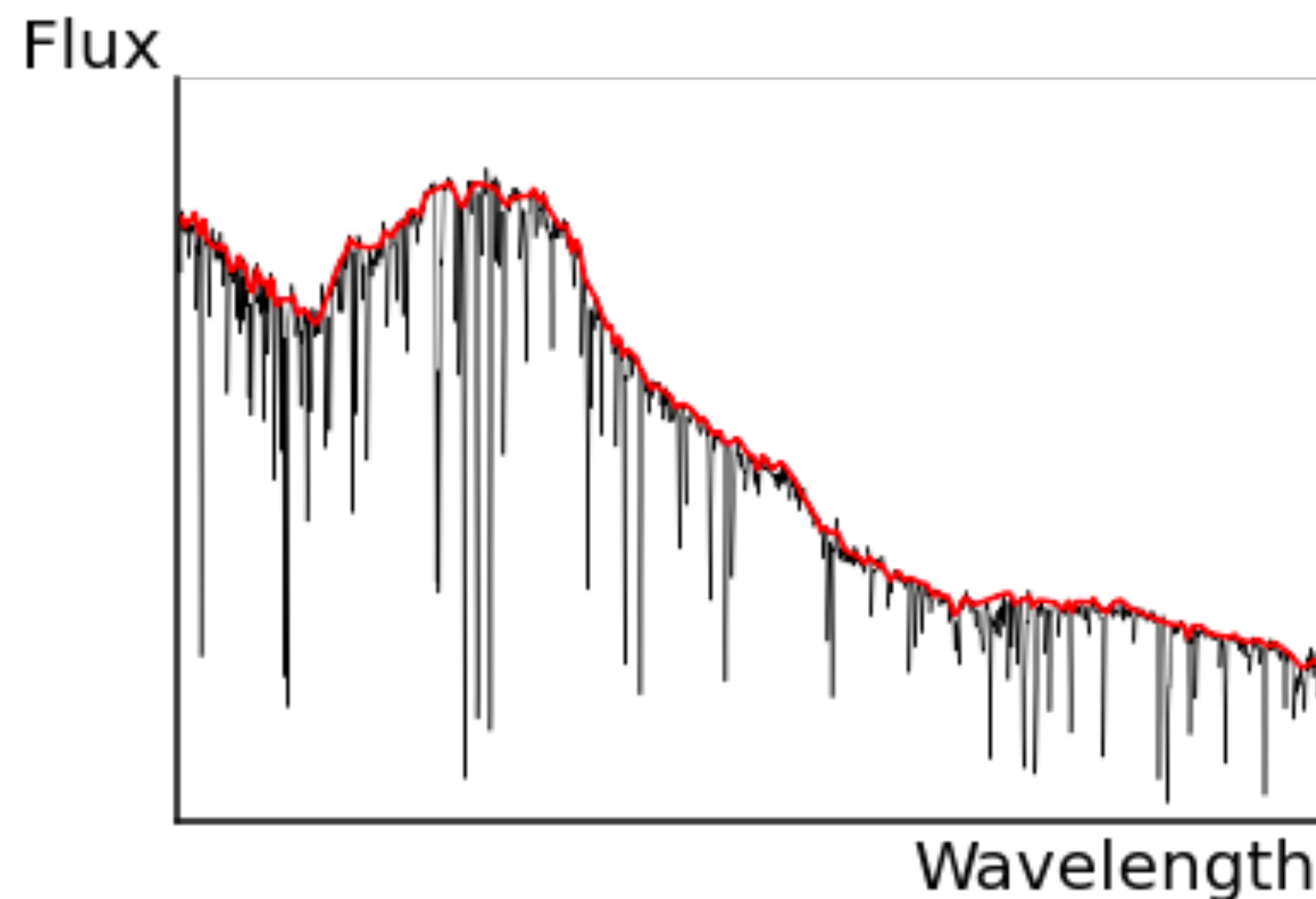
```
In [9]: hdus = fits.open('FUV_casbah.fits')
for hdu in hdus:
    print(hdu.header['EXTNAME'])
```

FLUX

ERROR

WAVELENGTH

CONTINUUM



Tools for fitting absorption lines

From Slack #halo21-analysis-codes channel:

ALIS (Ryan Cooke),

Veeper (Burchett),

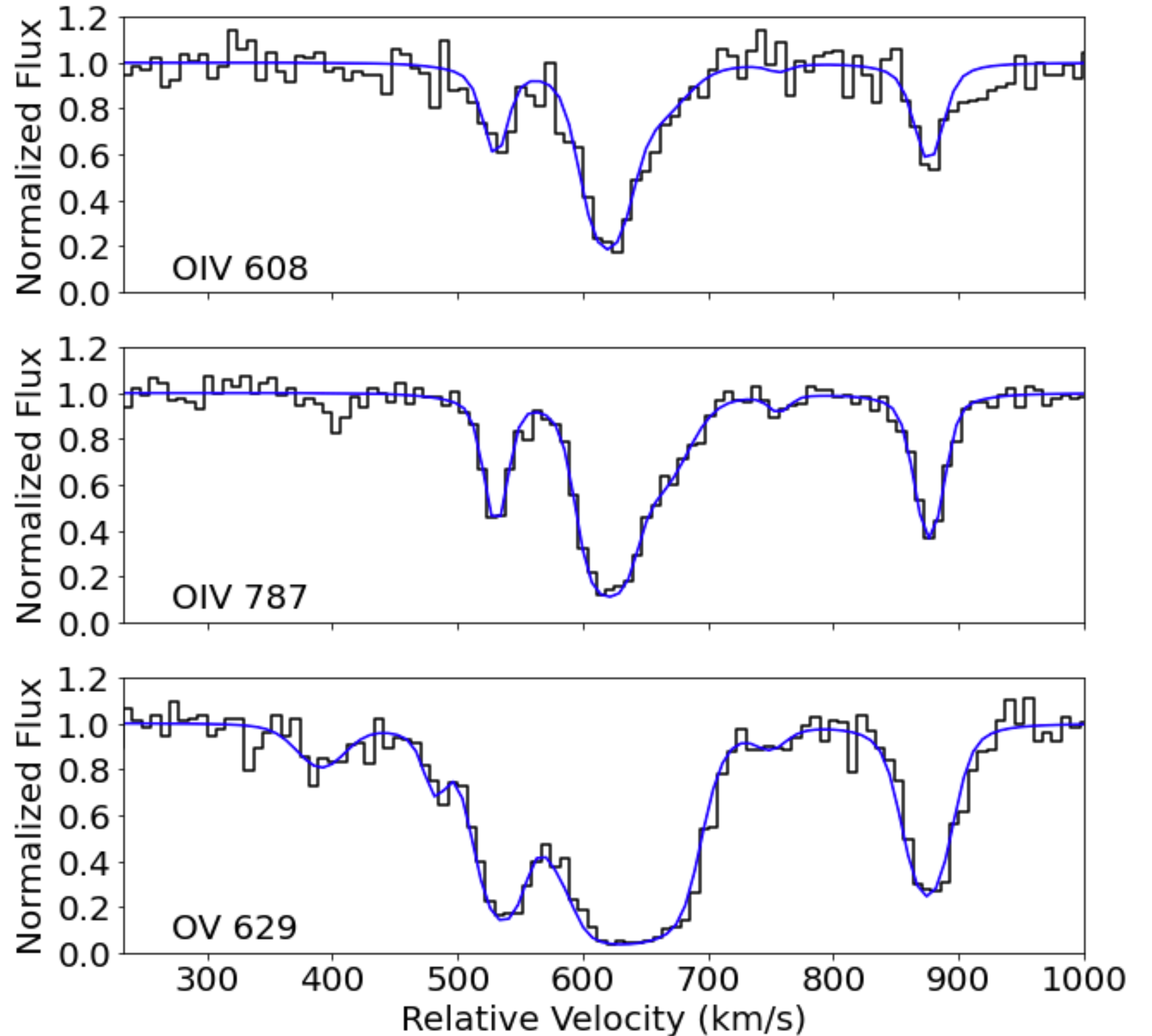
rbvfit (Bordoloi).

All written in Python.

Example here is a few associated absorption lines in FBQS0751+2019.

Fitting results by Todd Tripp using the Veeper are used as the truth set.

ALIS depends on linetools.



Example using ALIS: input

Input file is named XX.mod.

Give the paths to data, the wavelength ranges for fitting, and the spectral resolutions.

Data in ascii format and flux should be normalized.

```
run atomic atomic_marie.xml
run blind False
run ncpus -1
run ngpus 1
chisq maxiter 50
out model True
out fits False
out plots try_alis
out overwrite True
plot ticklabels True
plot dims 2x2

data read
  FUV_norm.ascii  specid=0IV  fitrange=[1166.5,1169.5]  resolution=lsf(name:COS,grating:G130M)  columns=[wave:0,flux:1,error:2]
  FUV_norm.ascii  specid=0IV  fitrange=[1510.3,1514.1]  resolution=lsf(name:COS,grating:G160M)  columns=[wave:0,flux:1,error:2]
  FUV_norm.ascii  specid=0V   fitrange=[1207.4,1210.5]  resolution=lsf(name:COS,grating:G130M)  columns=[wave:0,flux:1,error:2]
data end
```

Example using ALIS: input

For each ionic absorption component, give a guess to column density, redshift, and Doppler b . Use uppercase letters to specify fixed parameters, and lowercase letters to specify tied parameters.

```
model read
  fix voigt temperature True
  fix voigt DELTAa/a True
  fix voigt DELTAmu/mu True
  lim voigt bturb [1,60]
  emission
    constant 1.0CNS specid=0V,0IV
  absorption
    voigt ion=160_IV 14.3 0.9192ra 5.0ba 0.0 0.0 0.0 specid=0IV
    voigt ion=160_IV 15.2 0.9198rb 20.0bb 0.0 0.0 0.0 specid=0IV
    voigt ion=160_IV 14.1 0.9200rc 30.0bc 0.0 0.0 0.0 specid=0IV
    voigt ion=160_IV 13.0 0.9206rd 5.0bd 0.0 0.0 0.0 specid=0IV
    voigt ion=160_IV 14.4 0.9214re 10.0be 0.0 0.0 0.0 specid=0IV
    voigt ion=160_V 13.1 0.9183ri 20.0bi 0.0 0.0 0.0 specid=0V
    voigt ion=160_V 13.1 0.9189rii 5.0bii 0.0 0.0 0.0 specid=0V
    voigt ion=160_V 14.2 0.9192riii 20.0biii 0.0 0.0 0.0 specid=0V
    voigt ion=160_V 13.2 0.9195riv 10.0biv 0.0 0.0 0.0 specid=0V
    voigt ion=160_V 15.2 0.9199rv 30.0bv 0.0 0.0 0.0 specid=0V
    voigt ion=160_V 12.6 0.9206rvi 10.0bvi 0.0 0.0 0.0 specid=0V
    voigt ion=160_V 14.1 0.9214rvii 15.0bvii 0.0 0.0 0.0 specid=0V
  model end
```

In terminal prompt, run this: `run_alis XX.mod`

Example using ALIS: outputs

Fitting results are printed to a file named XX.mod.out.

The fitted model is printed in the same format as the initial guess model.

```
model read
  fix voigt temperature True
  fix voigt DELTAa/a True
  fix voigt DELTAmu/mu True
  lim voigt bturb [1,60]
emission
  constant 1.00000000CNS      specid=0V,0IV
absorption
voigt  ion=160_IV  14.2720348    0.919192125485ra    7.069894ba    0.0000000    0.0000000    0.0000000    specid=0IV
voigt  ion=160_IV  15.0745141    0.919770318579rb    16.505493bb    0.0000000    0.0000000    0.0000000    specid=0IV
voigt  ion=160_IV  13.9762821    0.920064267764rc    23.013518bc    0.0000000    0.0000000    0.0000000    specid=0IV
voigt  ion=160_IV  12.9291408    0.920651516716rd    4.414600bd    0.0000000    0.0000000    0.0000000    specid=0IV
voigt  ion=160_IV  14.3989017    0.921414156938re    8.547070be    0.0000000    0.0000000    0.0000000    specid=0IV
voigt  ion=160_V   13.1281528    0.918322947114ri    22.696606bi    0.0000000    0.0000000    0.0000000    specid=0V
voigt  ion=160_V   13.2146548    0.918903349489rii   3.440261bii    0.0000000    0.0000000    0.0000000    specid=0V
voigt  ion=160_V   14.2043471    0.919235813246riii  17.415544biii   0.0000000    0.0000000    0.0000000    specid=0V
voigt  ion=160_V   13.7214609    0.919484542242riv   1.578201biv    0.0000000    0.0000000    0.0000000    specid=0V
voigt  ion=160_V   15.1450418    0.919907603825rv    29.763870bv    0.0000000    0.0000000    0.0000000    specid=0V
voigt  ion=160_V   12.5945797    0.920617169235rvi   10.967802bvii  0.0000000    0.0000000    0.0000000    specid=0V
voigt  ion=160_V   14.0554719    0.921416653598rvii  16.392565bviii 0.0000000    0.0000000    0.0000000    specid=0V
model end
```

Errors of the fitted model are printed after the fitted model.

Also output figures of the fits and residuals.

Example using ALIS: verify the fitting results

	This trial	Tripp/Veeper
OIV component a	$N=10^{14.27} \text{ cm}^{-2}$, $b=7 \text{ km s}^{-1}$, $v=+530 \text{ km s}^{-1}$	$N=10^{14.33} \text{ cm}^{-2}$, $b=6 \text{ km s}^{-1}$, $v=+530 \text{ km s}^{-1}$
OIV component b	$N=10^{15.07} \text{ cm}^{-2}$, $b=17 \text{ km s}^{-1}$, $v=+621 \text{ km s}^{-1}$	$N=10^{15.15} \text{ cm}^{-2}$, $b=15 \text{ km s}^{-1}$, $v=+619 \text{ km s}^{-1}$
OIV component c	$N=10^{13.98} \text{ cm}^{-2}$, $b=23 \text{ km s}^{-1}$, $v=+666 \text{ km s}^{-1}$	$N=10^{14.09} \text{ cm}^{-2}$, $b=27 \text{ km s}^{-1}$, $v=+660 \text{ km s}^{-1}$
OIV component d	$N=10^{12.93} \text{ cm}^{-2}$, $b=4 \text{ km s}^{-1}$, $v=+758 \text{ km s}^{-1}$	$N=10^{12.96} \text{ cm}^{-2}$, $b=4 \text{ km s}^{-1}$, $v=+756 \text{ km s}^{-1}$
OIV component e	$N=10^{14.40} \text{ cm}^{-2}$, $b=9 \text{ km s}^{-1}$, $v=+877 \text{ km s}^{-1}$	$N=10^{14.36} \text{ cm}^{-2}$, $b=9 \text{ km s}^{-1}$, $v=+876 \text{ km s}^{-1}$
OV component i	$N=10^{13.13} \text{ cm}^{-2}$, $b=23 \text{ km s}^{-1}$, $v=+394 \text{ km s}^{-1}$	$N=10^{13.12} \text{ cm}^{-2}$, $b=22 \text{ km s}^{-1}$, $v=+391 \text{ km s}^{-1}$
OV component ii	$N=10^{13.21} \text{ cm}^{-2}$, $b=3 \text{ km s}^{-1}$, $v=+485 \text{ km s}^{-1}$	$N=10^{13.08} \text{ cm}^{-2}$, $b=6 \text{ km s}^{-1}$, $v=+482 \text{ km s}^{-1}$
OV component iii	$N=10^{14.20} \text{ cm}^{-2}$, $b=17 \text{ km s}^{-1}$, $v=+538 \text{ km s}^{-1}$	$N=10^{14.20} \text{ cm}^{-2}$, $b=17 \text{ km s}^{-1}$, $v=+535 \text{ km s}^{-1}$
OV component iv	$N=10^{13.72} \text{ cm}^{-2}$, $b=2 \text{ km s}^{-1}$, $v=+575 \text{ km s}^{-1}$	$N=10^{13.22} \text{ cm}^{-2}$, $b=12 \text{ km s}^{-1}$, $v=+577 \text{ km s}^{-1}$
OV component v	$N=10^{15.15} \text{ cm}^{-2}$, $b=30 \text{ km s}^{-1}$, $v=+642 \text{ km s}^{-1}$	$N=10^{15.16} \text{ cm}^{-2}$, $b=29 \text{ km s}^{-1}$, $v=+640 \text{ km s}^{-1}$
OV component vi	$N=10^{12.59} \text{ cm}^{-2}$, $b=11 \text{ km s}^{-1}$, $v=+753 \text{ km s}^{-1}$	$N=10^{12.61} \text{ cm}^{-2}$, $b=12 \text{ km s}^{-1}$, $v=+750 \text{ km s}^{-1}$
OV component vii	$N=10^{14.06} \text{ cm}^{-2}$, $b=16 \text{ km s}^{-1}$, $v=+878 \text{ km s}^{-1}$	$N=10^{14.05} \text{ cm}^{-2}$, $b=16 \text{ km s}^{-1}$, $v=+875 \text{ km s}^{-1}$

Tips on using ALIS

Augment the atomic data table with e.g. OIV608, OV629, OIV*609, OIV*790.

Edit atomic.xml.

Handling partial coverage of the emitting source is not straightforward (Hamann+2011).

To customize it, clone the 'coverfactor' branch on github and edit `alfunc_voigt.py`.