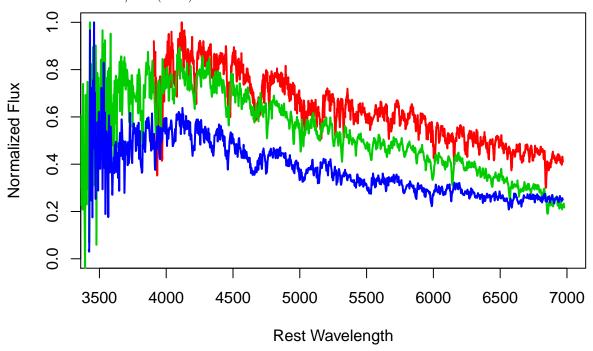
# Cross Correlation to Match Noisy Spectrum

## 1. Original Spectrum

Plot three peculiar spectrum D6-1,D6-2 and D6-3 (3000-7000)

#### 1.1 Normalization

Normalized Flux =  $1/\max(\text{Flux})*\text{Flux}$ 



#### 2. Isotropic undecimated wavelet transform: Starlet transform

The Isotropic Undecimated Wavelet Transform (IUWT) algorithm is well known in the astronomical domain becasue it is well adapted to astronomical data where objects are more or less isotropic in most cases. It is also known as starlet wavelet transform.

The the wavelet function is defined as below:

$$\phi(\lambda) = \frac{1}{16}(|\lambda - 2|^3 - 4|\lambda - 1|^3 + 6|t|^3 - 4|\lambda + 1|^3 + |\lambda + 2|^3)$$

where  $\phi(\lambda)$  is the B-spline of order 3 and the wavelet function is defined as the difference between two resolutions. The related pair of filters (h, g) is defined by

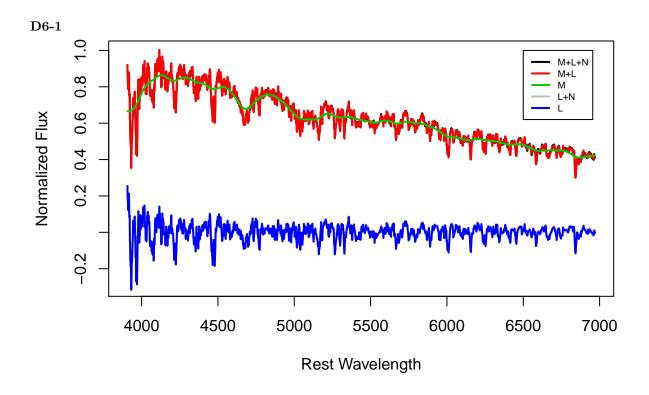
$$h[k] = [1, 4, 6, 4, 1]/16, k = -2, ..., 2g[k] = \delta[k] - h[k]$$

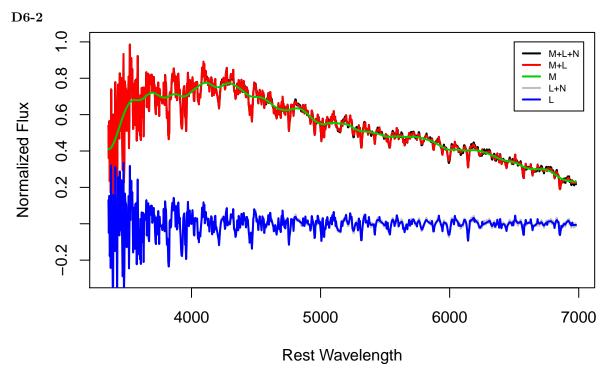
#### 2.1 Result of Starlet Transform and noise removal

For any spectra F,

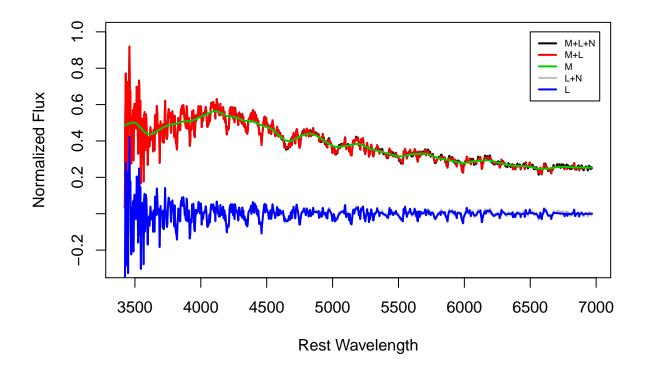
$$F = M + L + N$$

where M is the continuum, L is the information lines and N is the noise.





D6-3



### 3. Cross Correlation to match two spectrum

In signal processing, cross-correlation is a measure of similarity between two signals. The definition of it is the same with the correlation between two random variables in statistics and the each element is one realization of the corresponding random variable. If we have two signal f(x) and g(x), the cross correlation coefficient is defined by the equation below,

$$\gamma_{fg} = \frac{1}{N\sigma_f \sigma_g} \sum_{x} (f(x) - \bar{f})(g(x) - \bar{g})$$

We only consider the cross correlation between the information lines of the spectra (L defined before). To test this idea, we define a new spectra  $D6-1_s$  which is the subset of the original D6-1 where  $\lambda_s \in [4892.984, 5862.962]$  and define  $D6-2_s, \lambda_s \in [4887.184, 7932.187]$  and  $D6-3_s, \lambda_s \in [4955.424, 8000.258]$  in the same way. Calculate the cross correlation coefficient with D6-1.

source('~/Dropbox/project/Wang/LamostSpecMatch/SpecMatch/R/CrossCorrelation.R', echo=TRUE)

```
##
## > CrossCorrelation <- function(TestSpectra, TemplateSpectra) {</pre>
##
          TemplateLambda <- TemplateSpectra[, 1]</pre>
          TemplateF <- TemplateSpectra[, 2]</pre>
## +
##
            [TRUNCATED]
##
## > SpectrumNormalization <- function(Specdf) {</pre>
          maxfluxVec <- max(Specdf[, 2])</pre>
## +
          Specdf[, 2] <- Specdf[, 2]/maxfluxVec</pre>
## +
## +
          return(Specdf)
      .... [TRUNCATED]
Rcpp::sourceCpp('../SpecMatch/src/CrossCorr.cpp')
t1 = Sys.time()
CrossCorrelation(D6_1,D6_2)
```

## [1] 0.9770208

CrossCorrelation(D6\_1,D6\_3)

## [1] 0.9687285

CrossCorrelation(D6\_3,D6\_2)

## [1] 0.9562887

Sys.time()-t1

## Time difference of 0.119662 secs

$D6-1_s$	$D6-2_s$	$D6-3_s$
0.9500597	-0.04024396	-0.03792305

Because  $D6 - 1_s$  is a subset of D6 - 1, the cross correlation between  $D6 - 1_s$  and D6 - 1 is close to 1. It only takes 0.03419304 secs to calculate cross correlation coefficient.

### Reference:

- 1. Anisimova, Elena, Jan Bednar, and Petr Pata. "Astronomical image denoising using curvelet and starlet transform." Radioelektronika (RADIOELEKTRONIKA), 2013 23rd International Conference. IEEE, 2013.
- 2. Jean-Luc Starck et al (2015). Sparse Image and Signal Procedding 1-77,86-91