



# **A bottom-up approach to spectroscopic data reduction**

Carlo Izzo, Yves Jung, Pascal Ballester



# Major requirements for automatic data reduction

## Robustness

- managing unexpected situations
- supplying information about what went wrong
- actual monitoring of the instrument

## Flexibility

- using general algorithms
- applying instrument-independent DRS strategies
- low maintenance cost



# Identification of reference objects

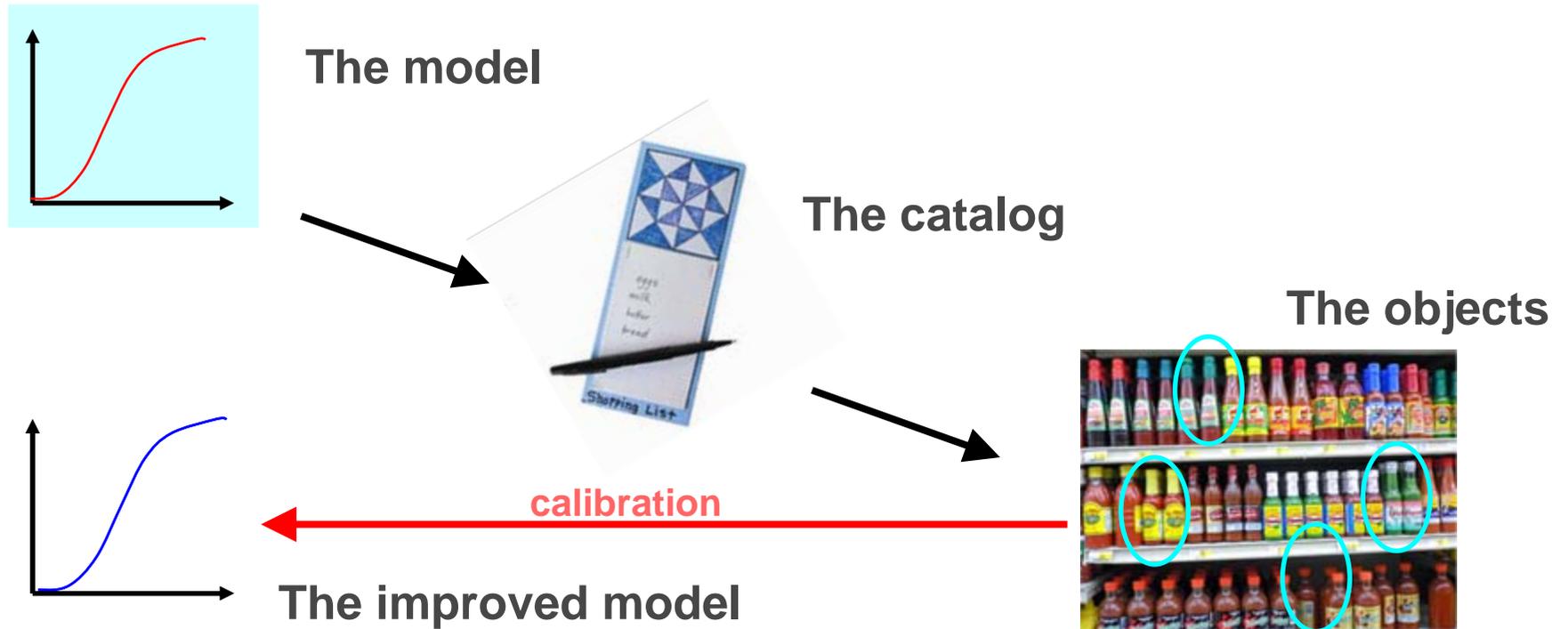
## Reference objects are used for data calibration:

- **Stars**
  - astrometric calibration
  - photometric calibration
- **Spectral lines (arc lamp, sky)**
  - wavelength calibration
- **Spectral edges (flat)**
  - spectral curvature
- **Slit positions (pinhole mask)**
  - mask-to-CCD transformation
- ...



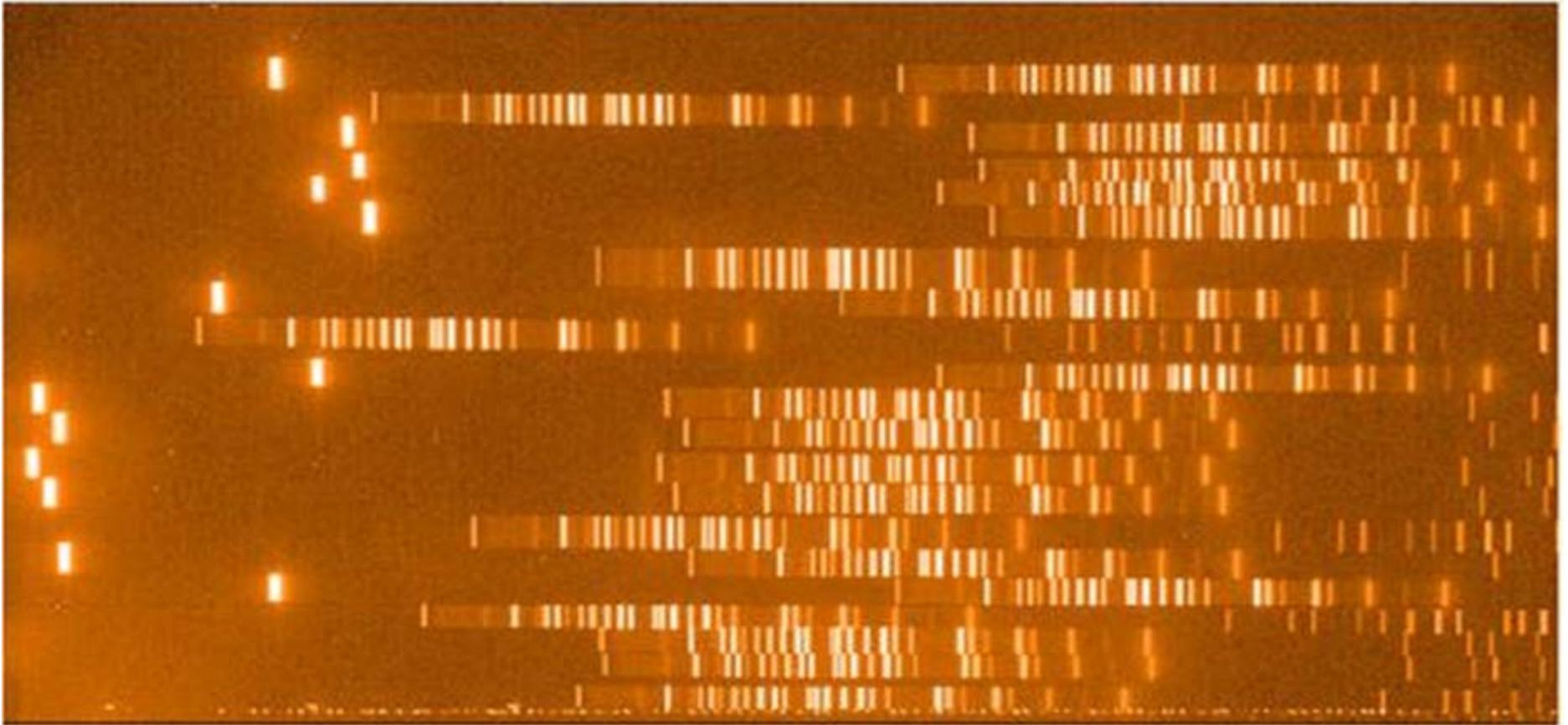
# Identification of reference objects

How to identify reference objects?  
The top-down approach:



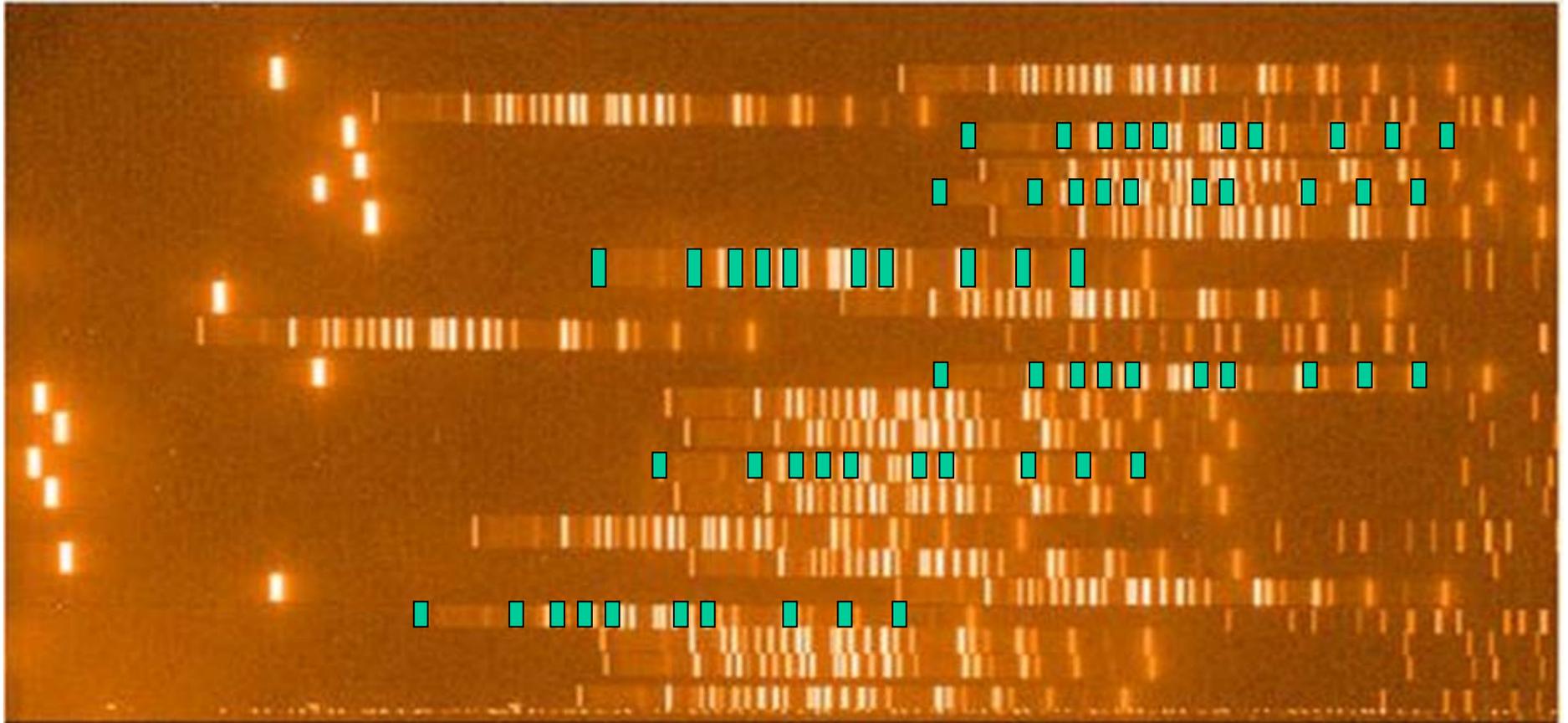


## A typical MOS arc lamp exposure



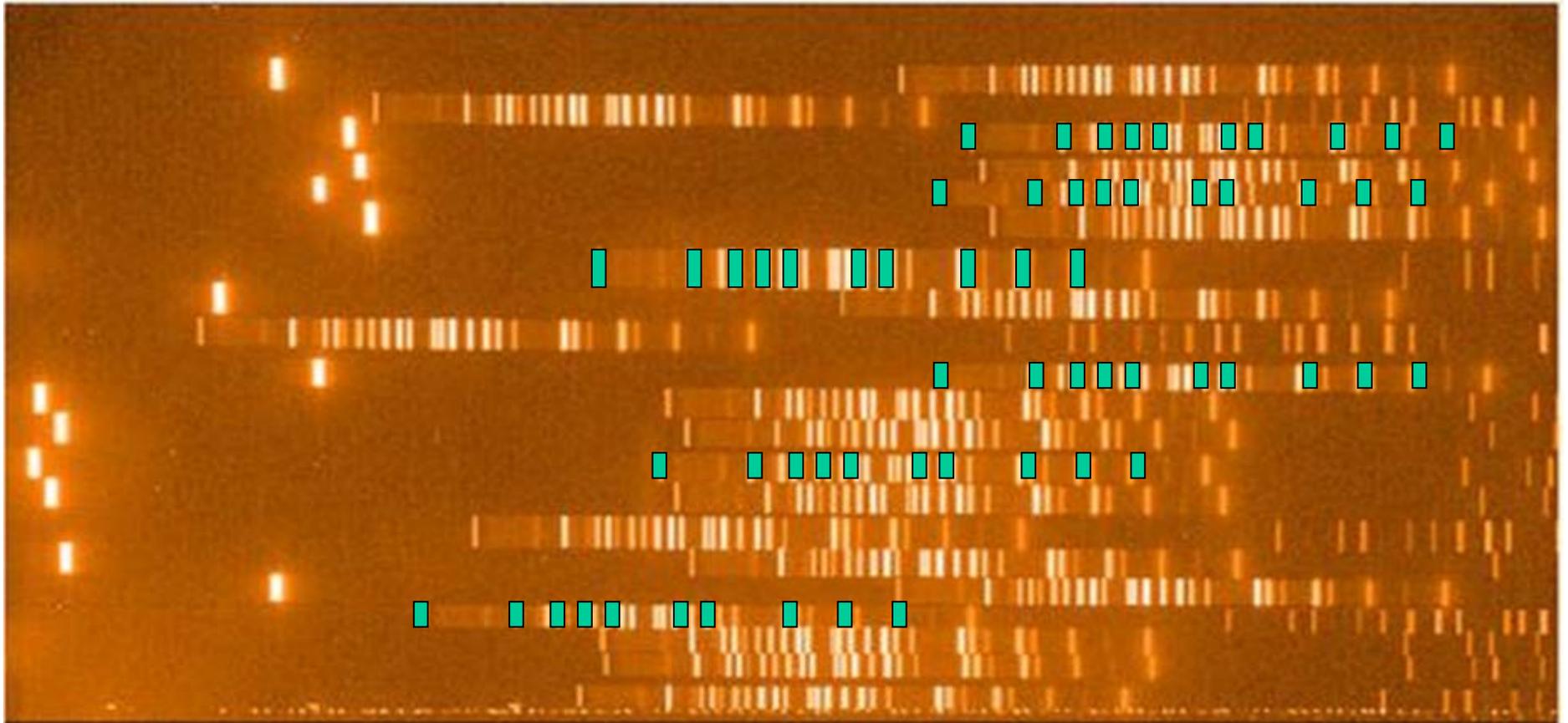


## Using first-guess model to find reference lines...





# Earthquake!

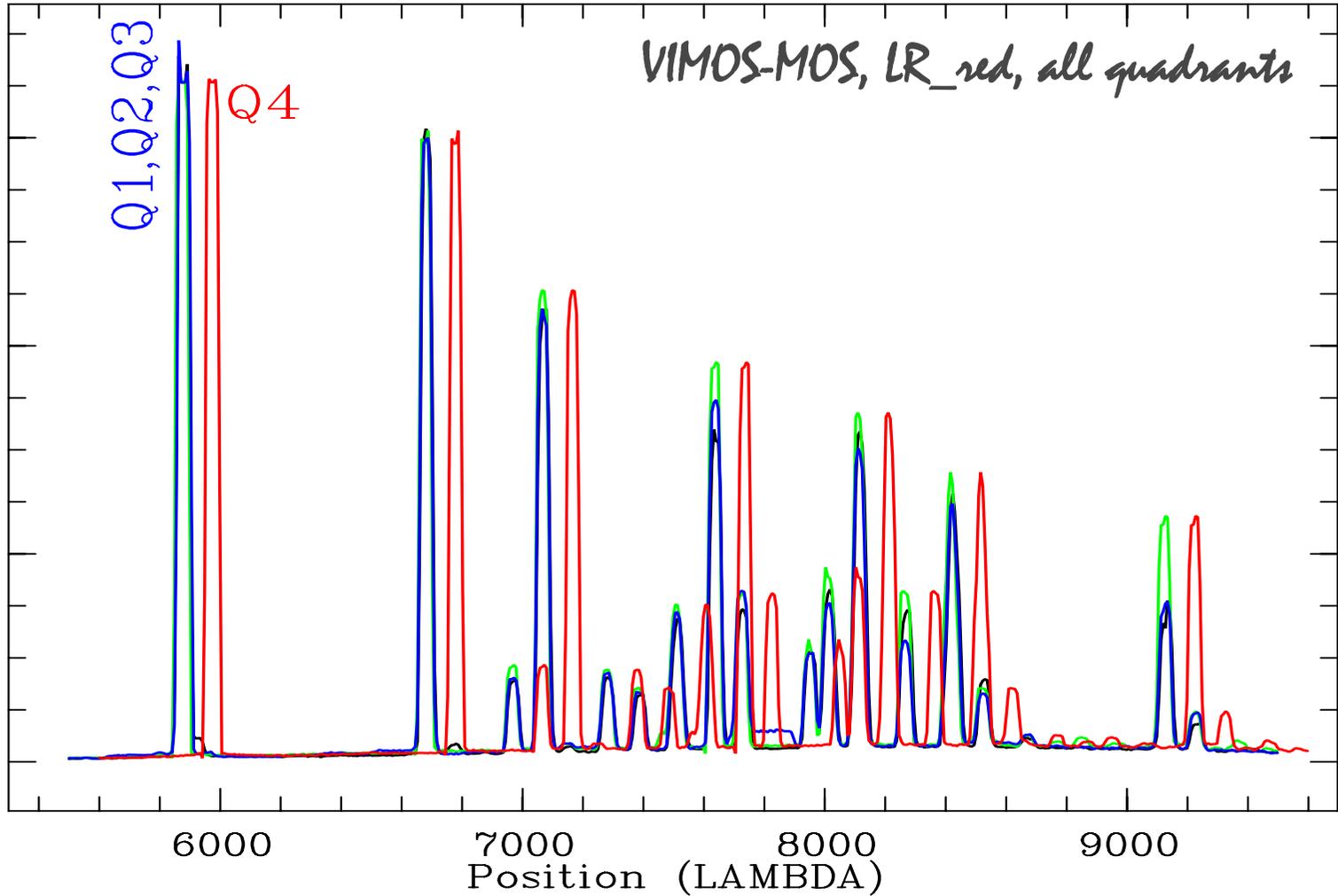


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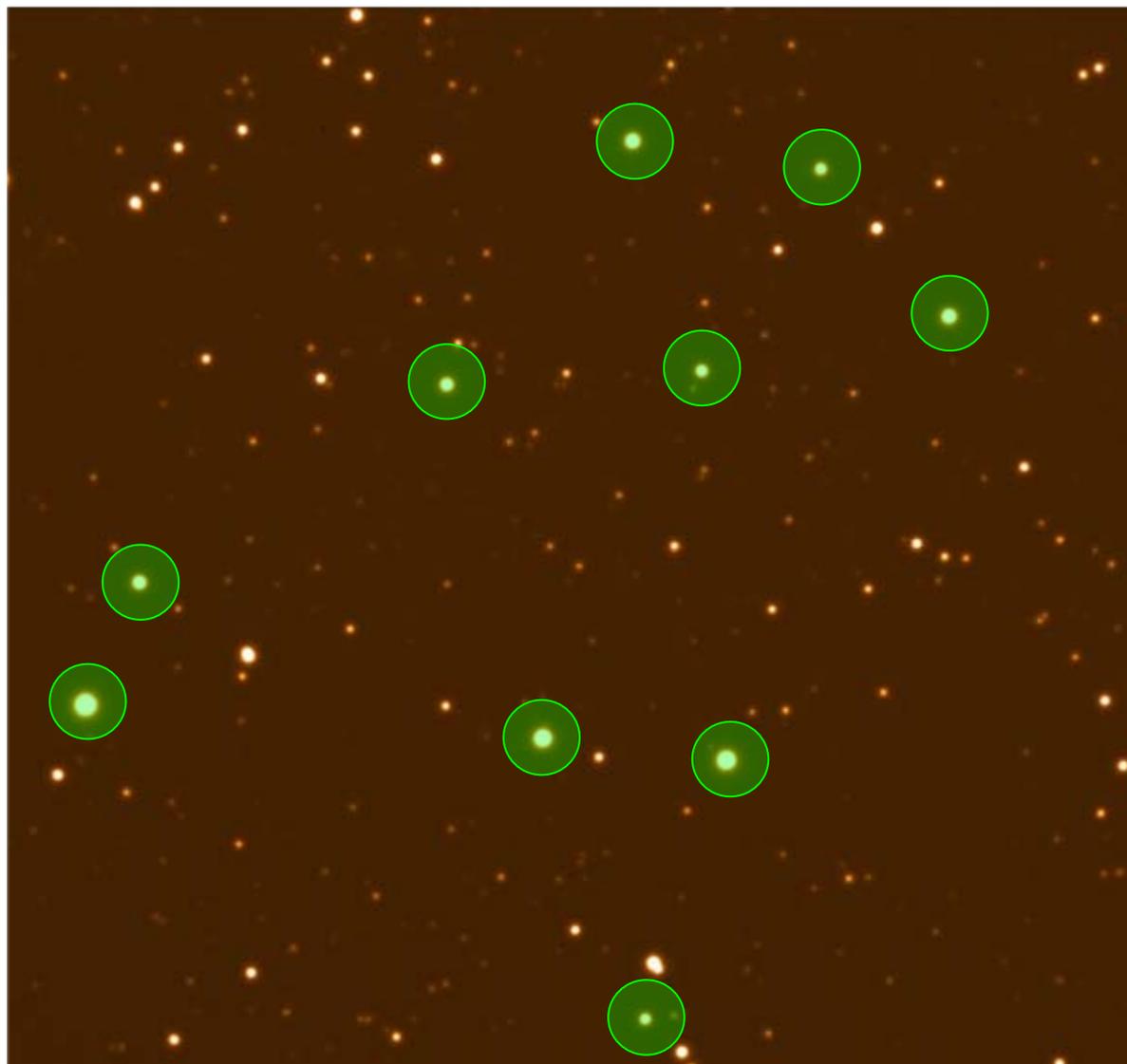


# False matches confirm expectations...





## Finding standard stars

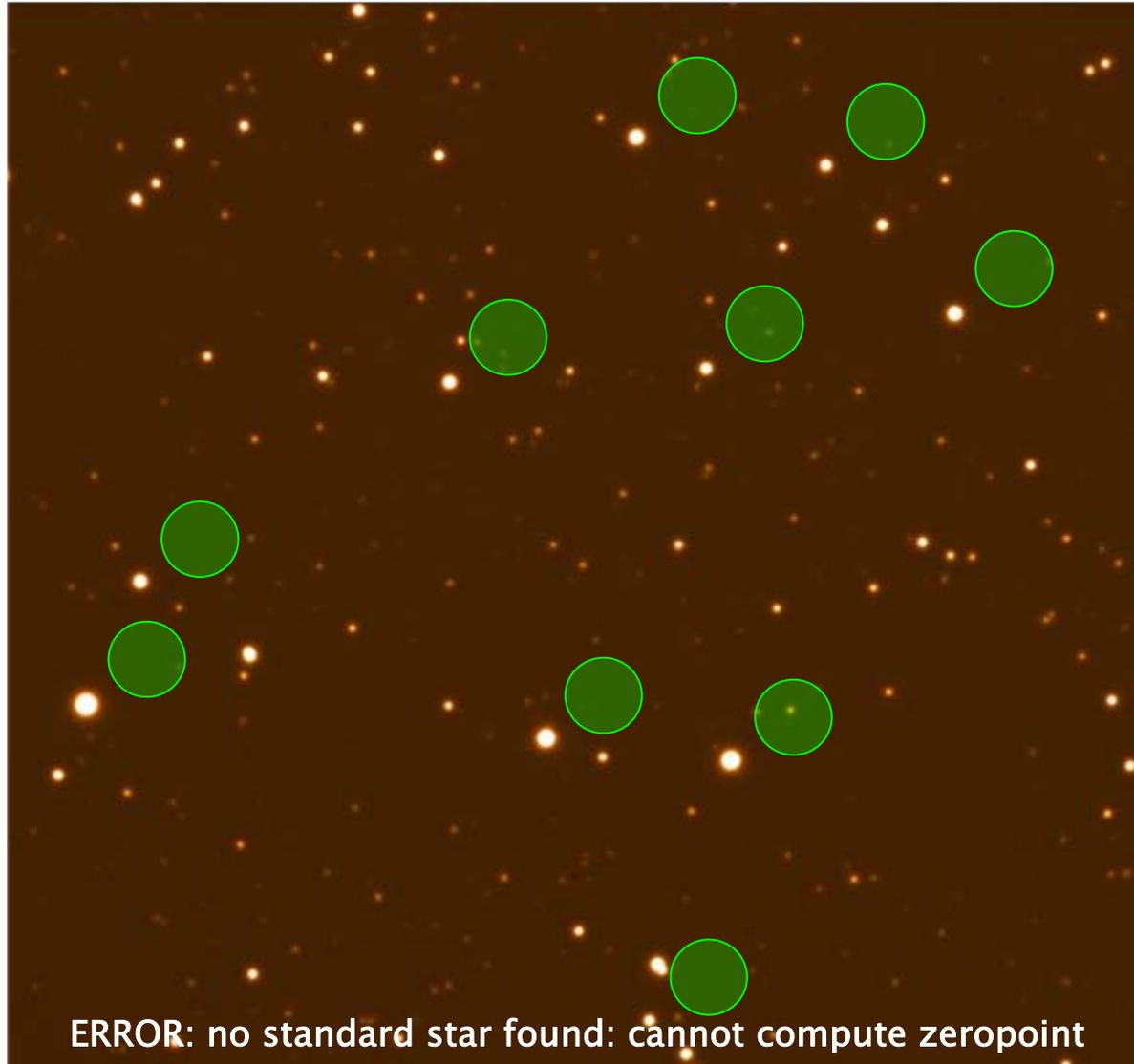


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## Finding standard stars





## Advantages of the top-down approach

- The safest approach for stable instruments
- The only possible approach if very few reference objects are available

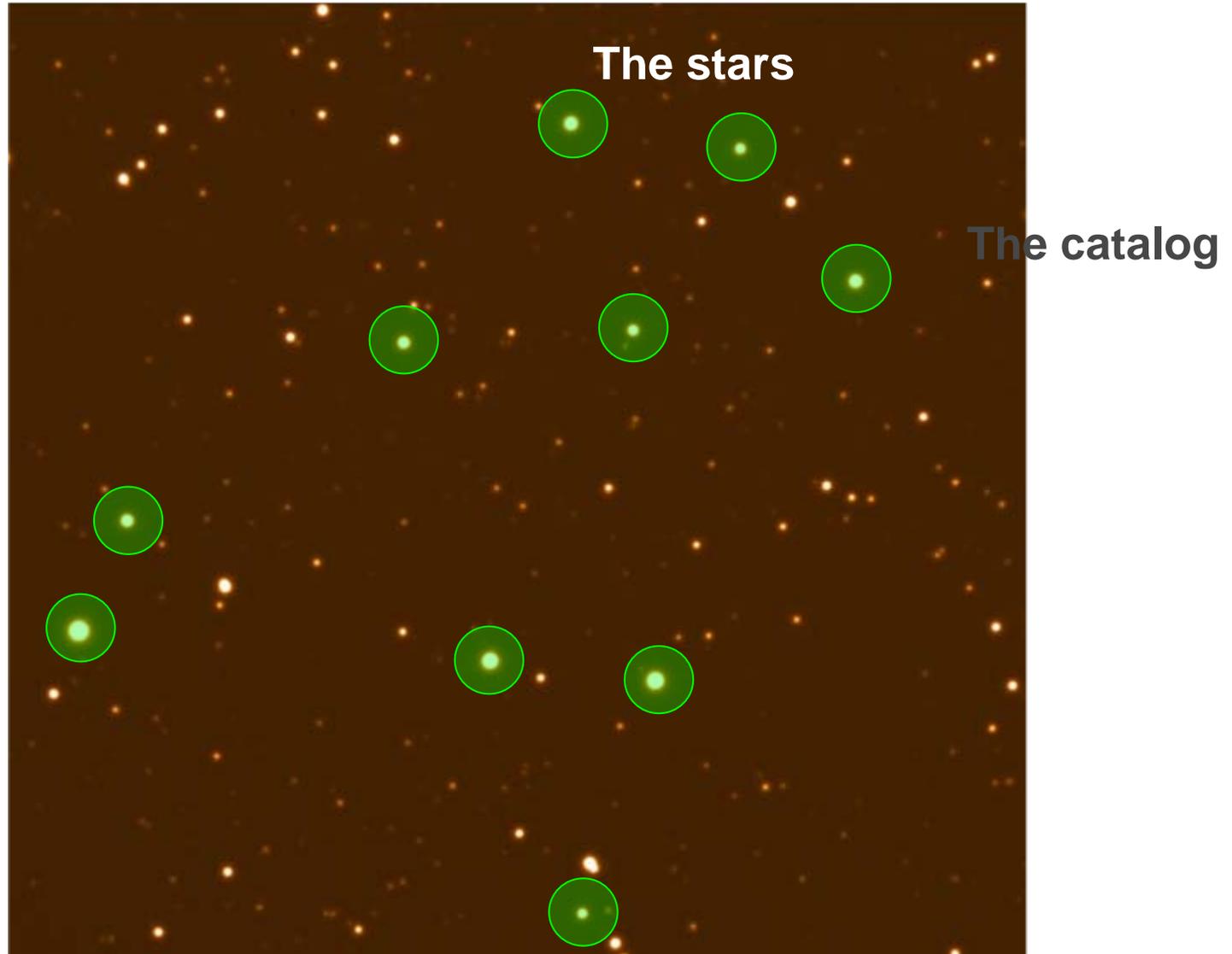


## Disadvantages of the top-down approach

- **Not robust: it fails with unstable instruments**
- **Not flexible: it requires frequent reconfiguration**
- **Biased toward expectations**
- **Misled by contaminations**

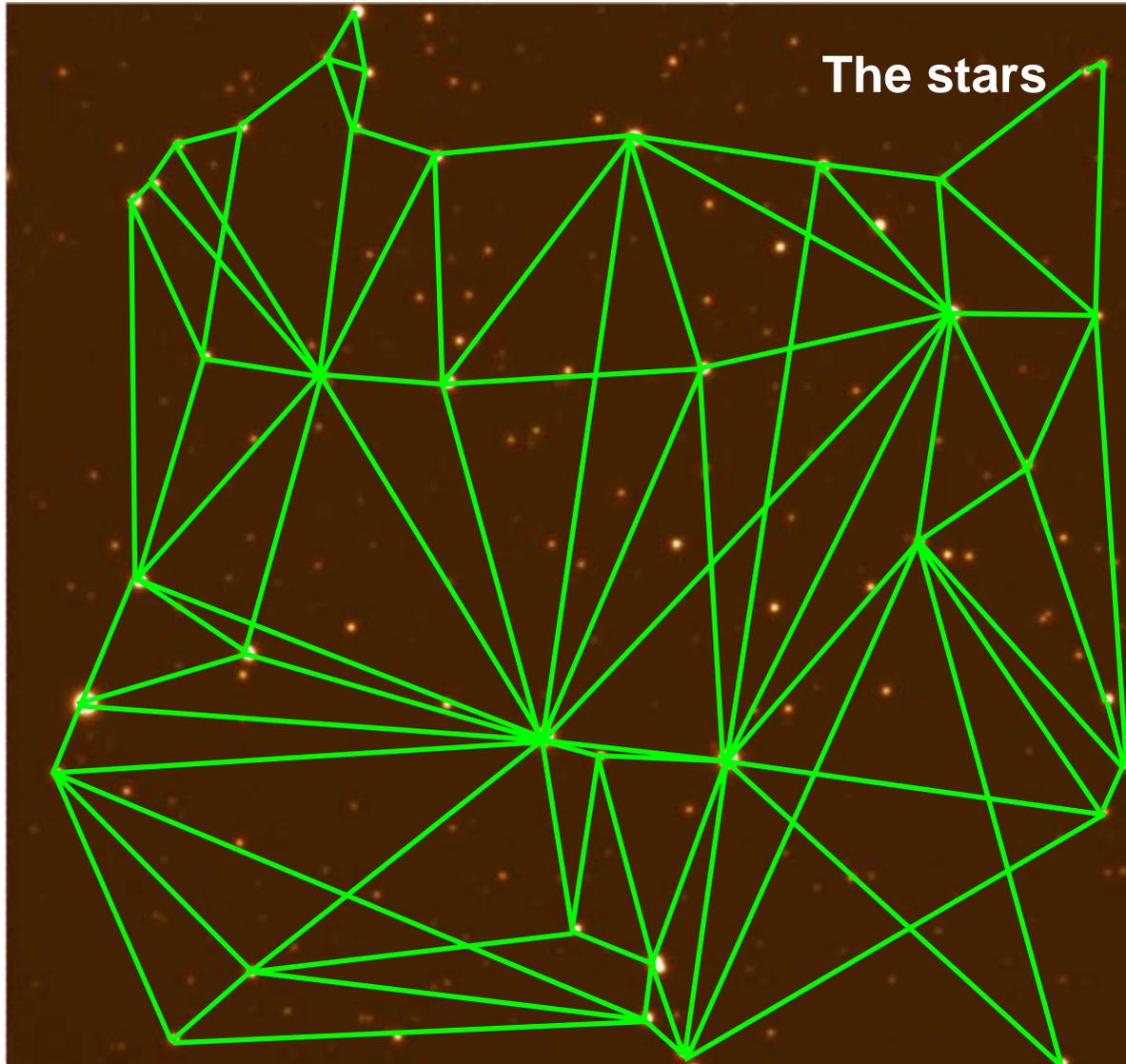


## Finding standard stars

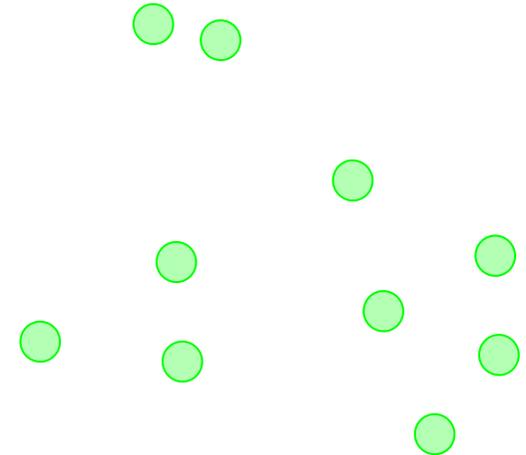




# Finding standard stars

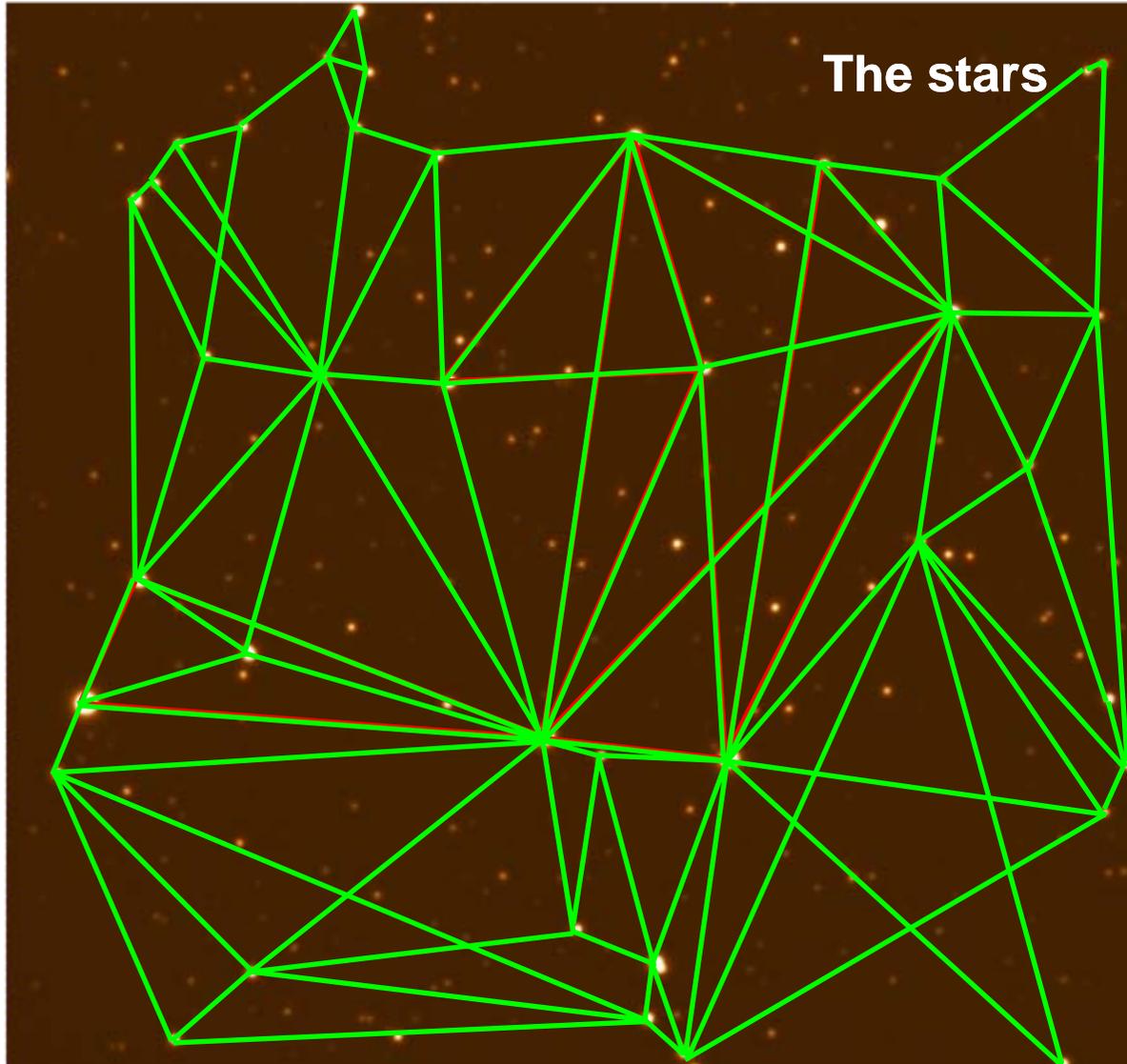


**The catalog**  
(i.e., the pattern)

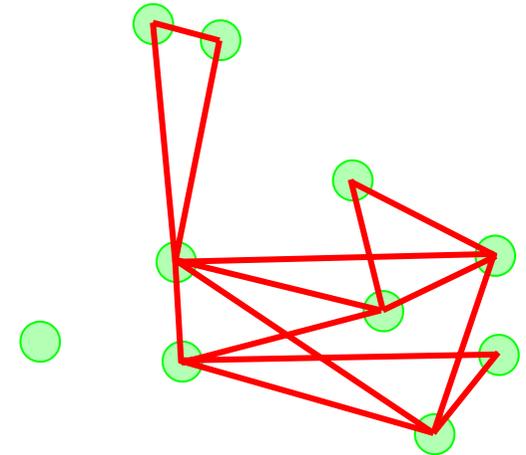




# Finding standard stars



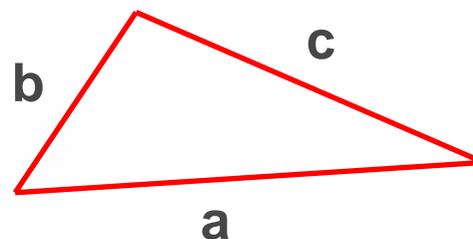
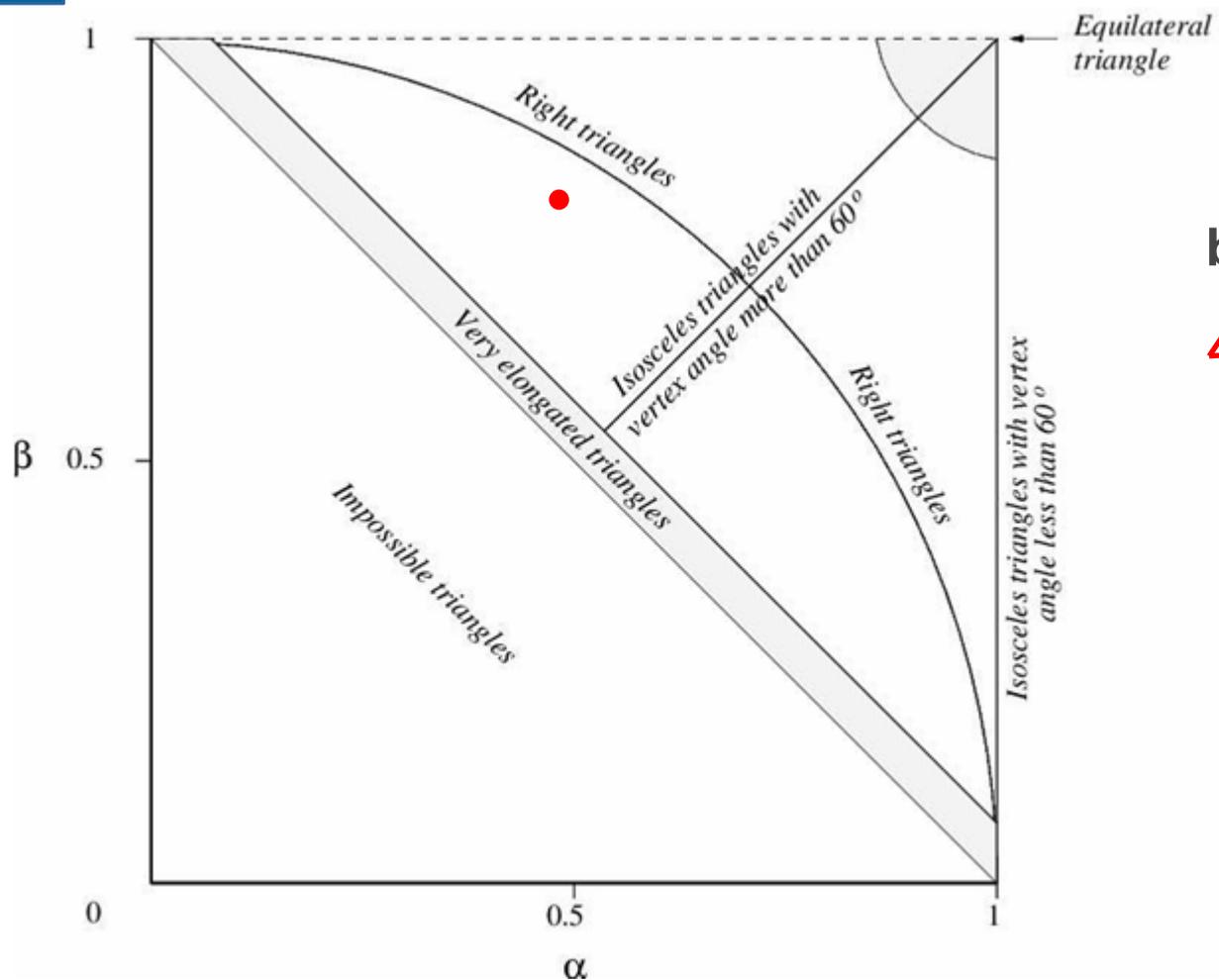
**The catalog**  
(i.e., the pattern)





# Point pattern-matching (2D)

G. S. Cox *et al.* (1991) "A New Method of Rotation, Scale and Translation Invariant Point Pattern Matching Applied To the Target Acquisition and Guiding of an Automatic Telescope"

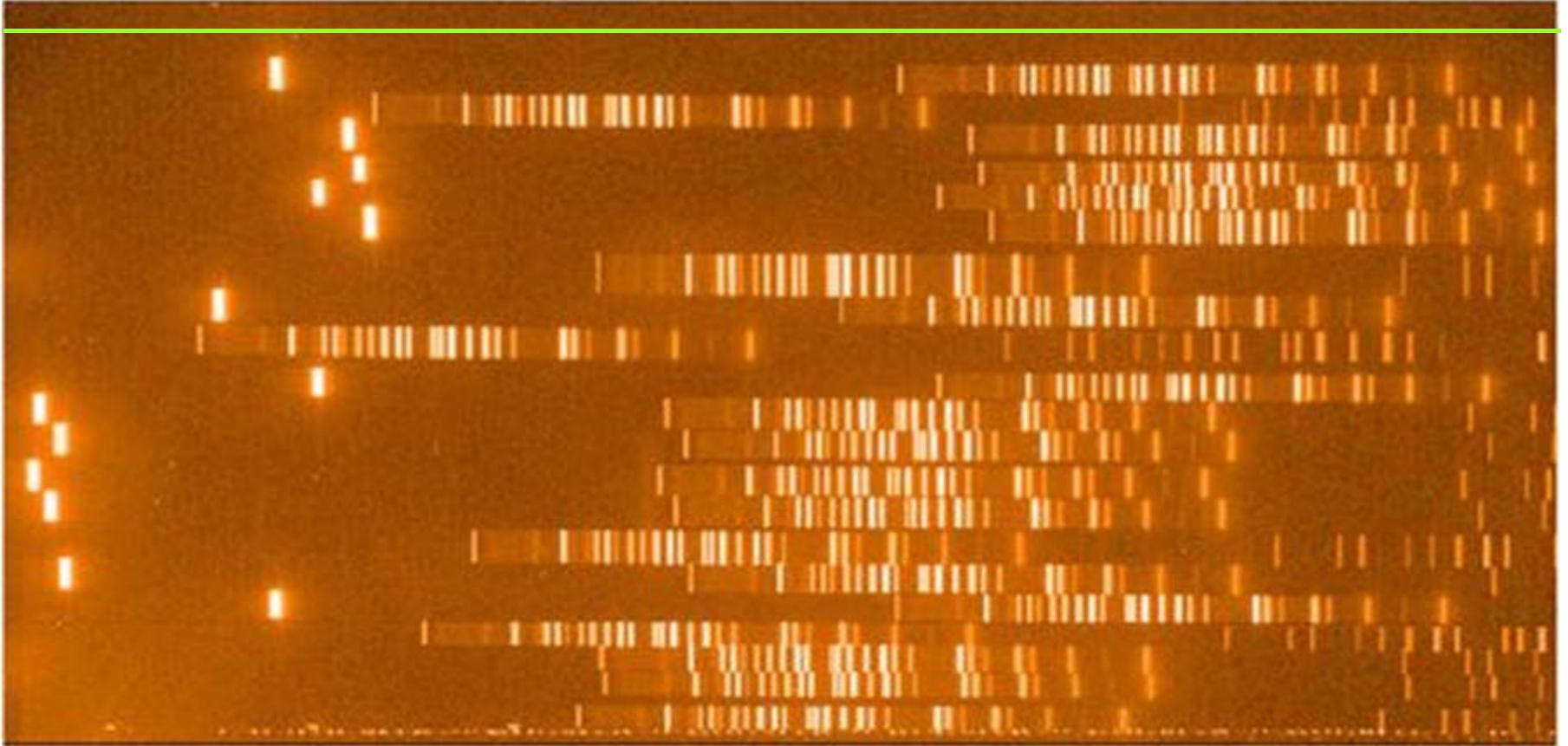


$$\alpha = \frac{b}{a}$$

$$\beta = \frac{c}{a}$$



# Looking for peaks





# Looking for patterns

**The pattern:** *wavelengths*

- ...
- 5400.562
- 5460.742
- 5764.419
- 5769.598
- 5790.656
- 5852.488
- 5875.620
- 5881.900
- ...

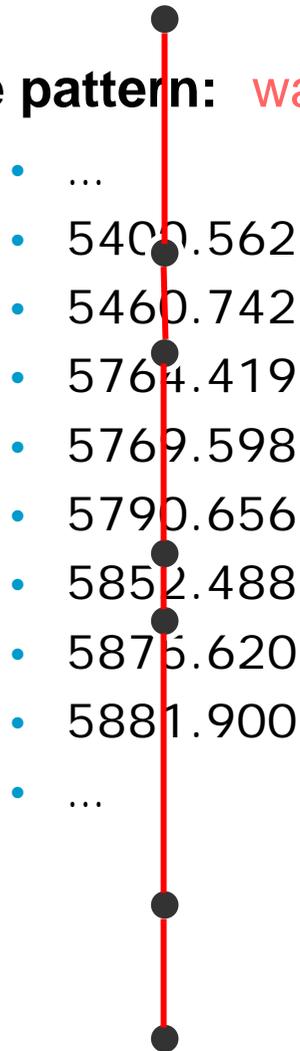
**The data:** *pixel positions*

- ...
- 1220.64
- 1253.23
- 1299.44
- 1304.07
- 1339.30
- 1400.33
- 1450.28
- 1457.32
- 1471.00
- 1496.21
- ...



# Looking for patterns

The pattern: **wavelengths**

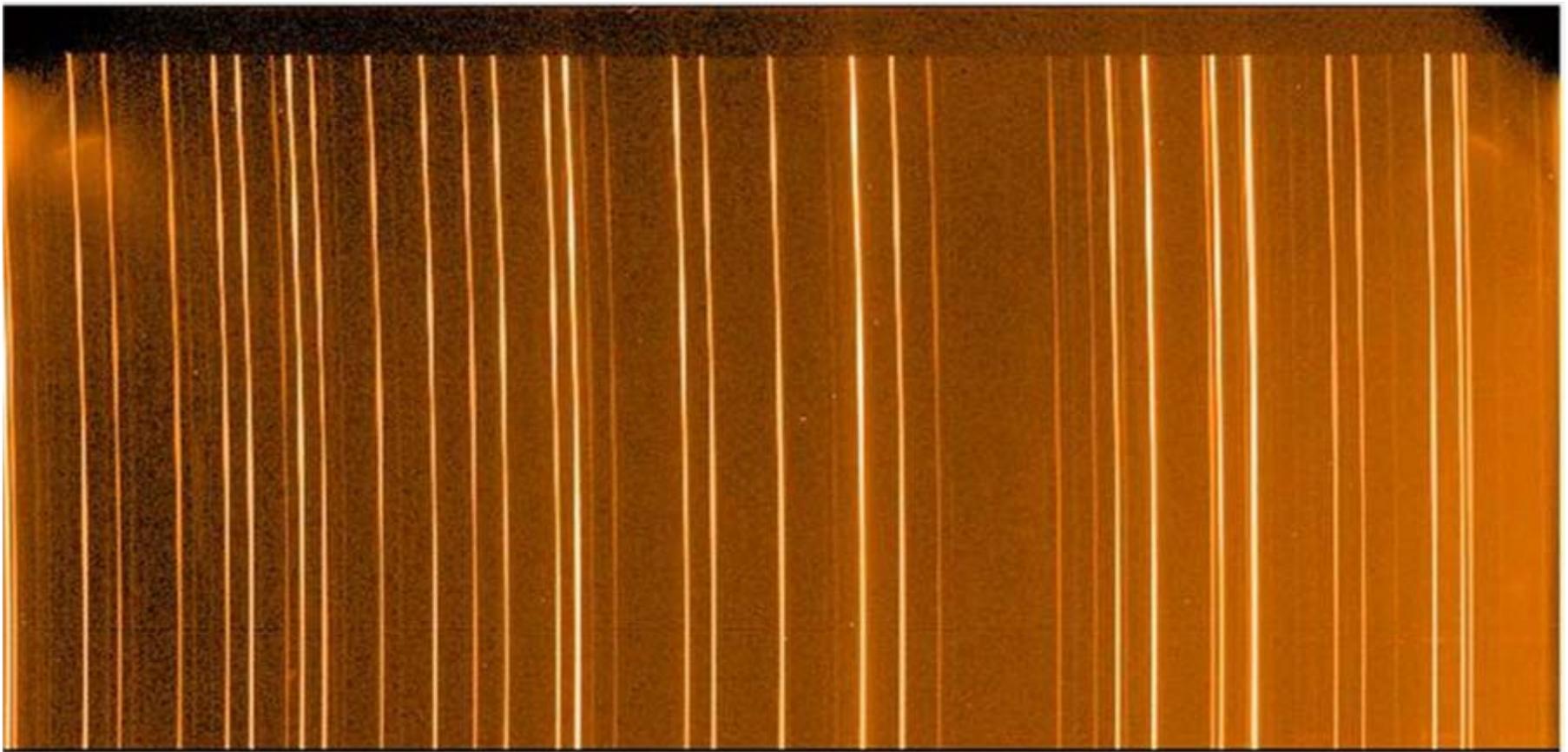


The data: **pixel positions**





# A simple case: calibrating a single spectrum

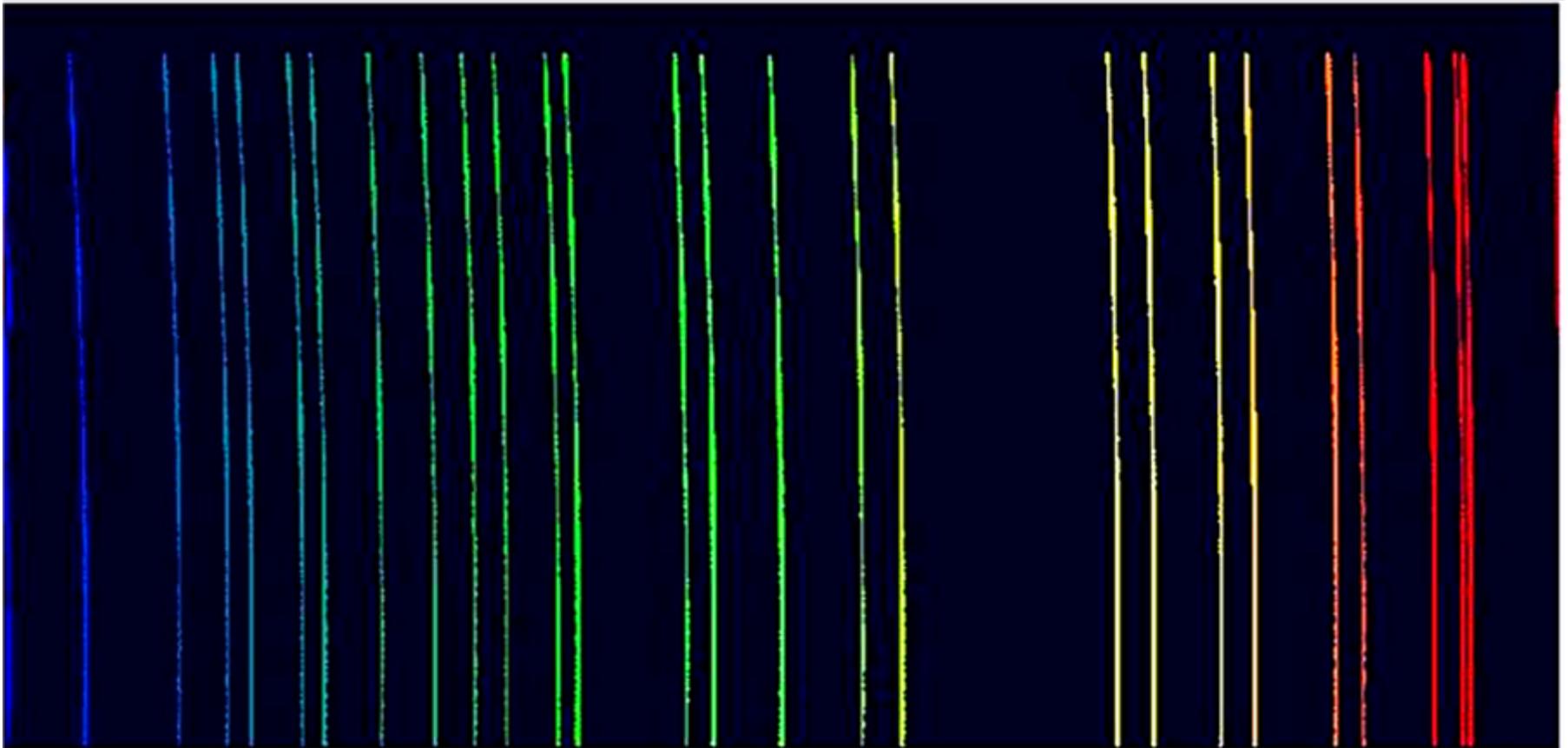


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# Identifying arc lamp lines



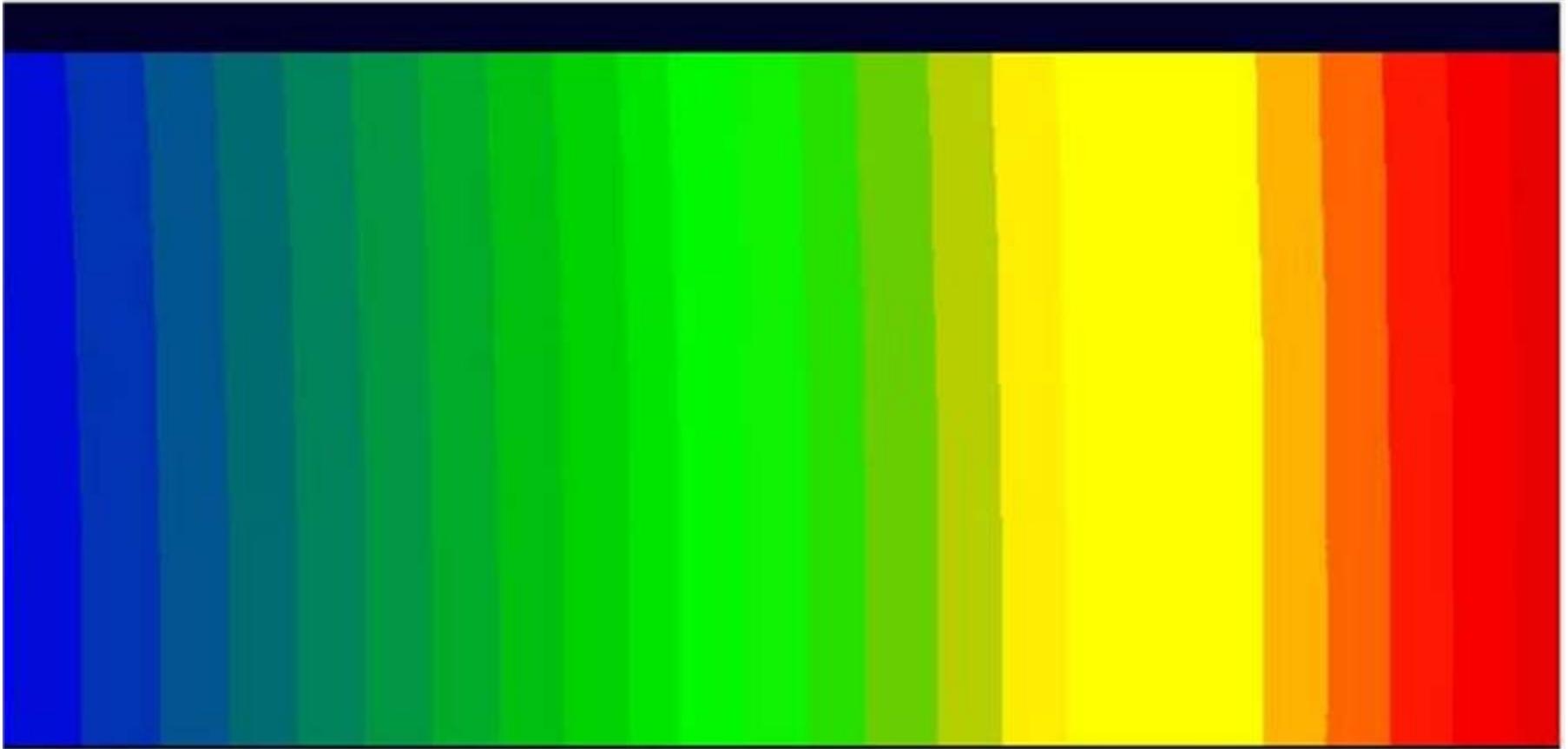
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# Wavelength map

Mean accuracy: 0.05 pixel

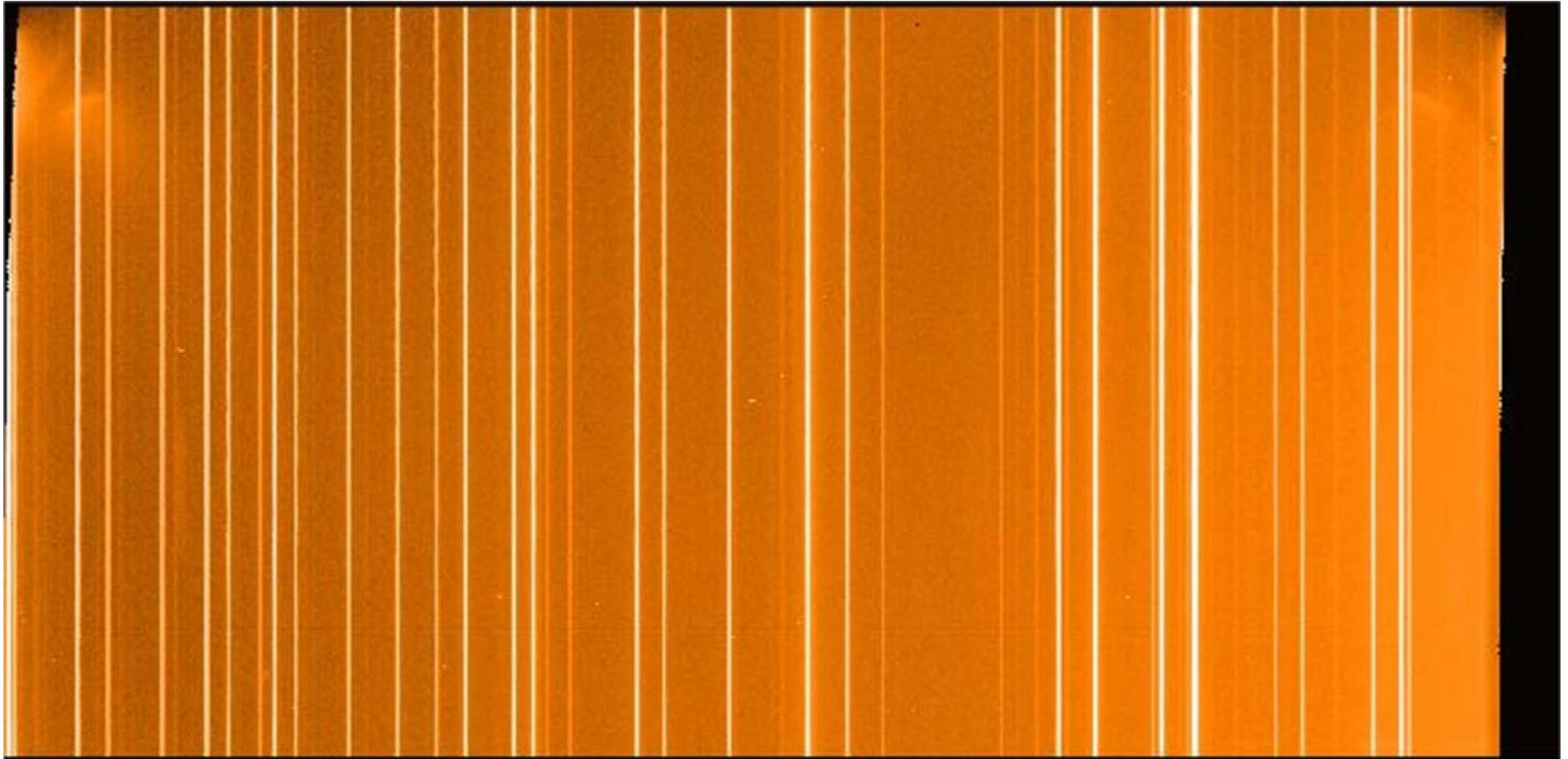


*SDD*



# Resampled spectrum

Mean accuracy: 0.05 pixel

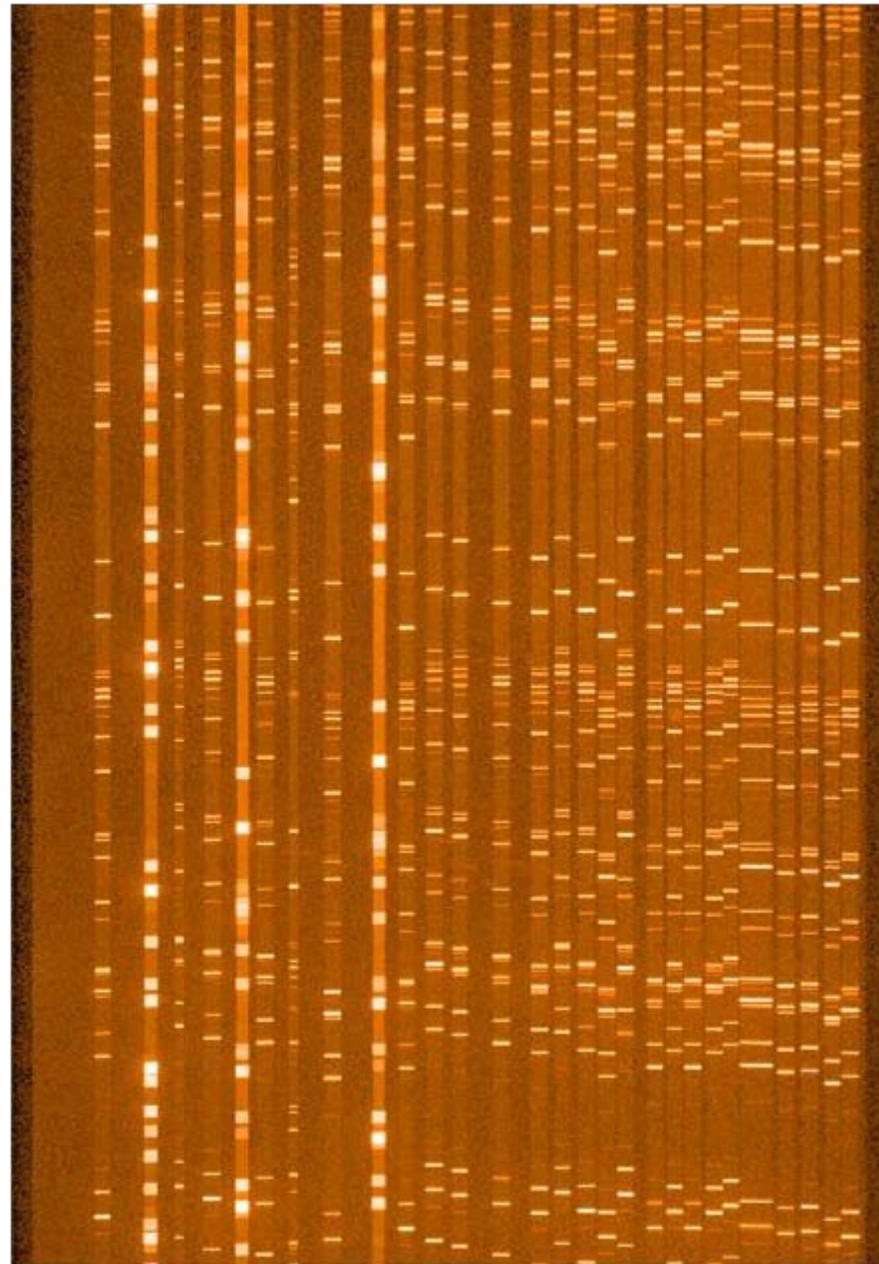


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**A case with many spectra  
(VIMOS GRIS\_HRred)**



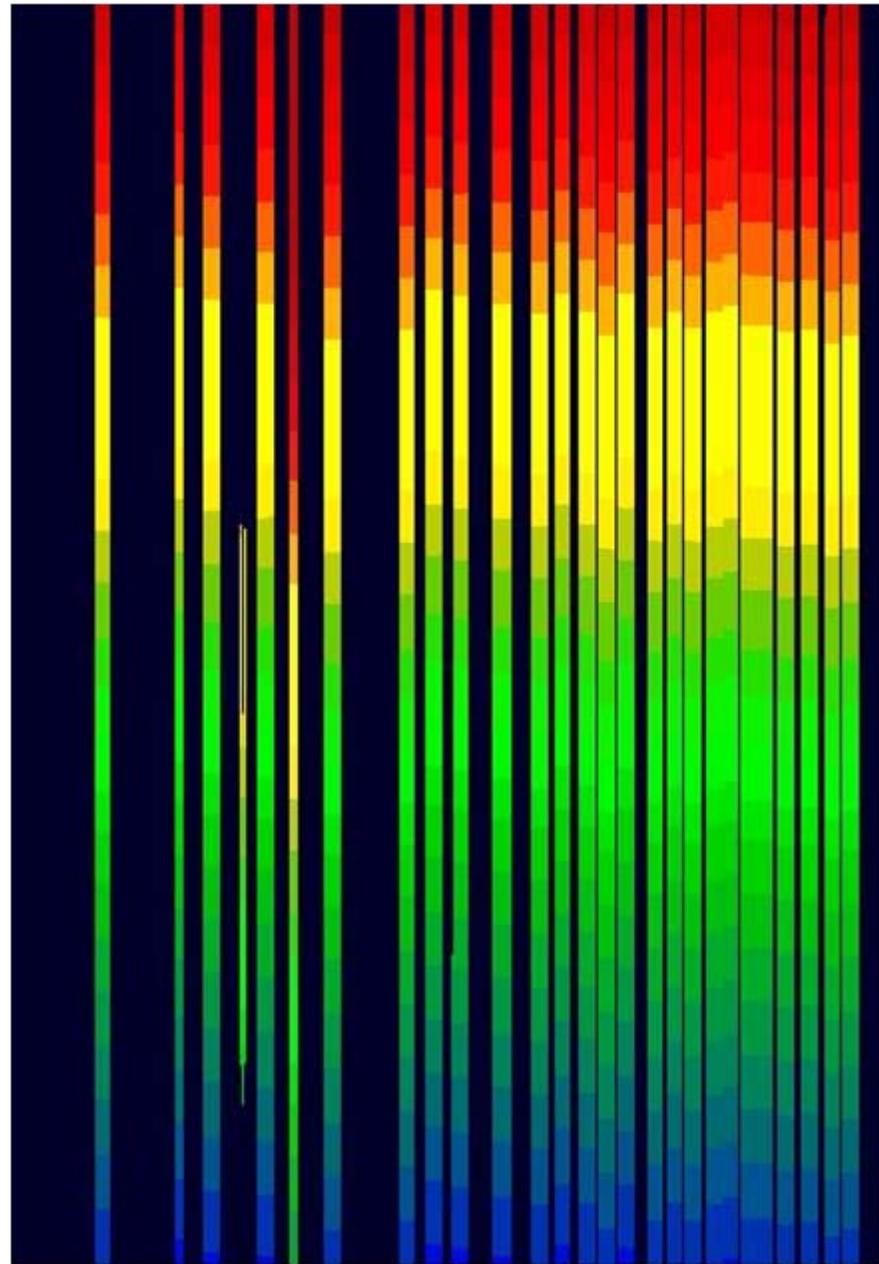
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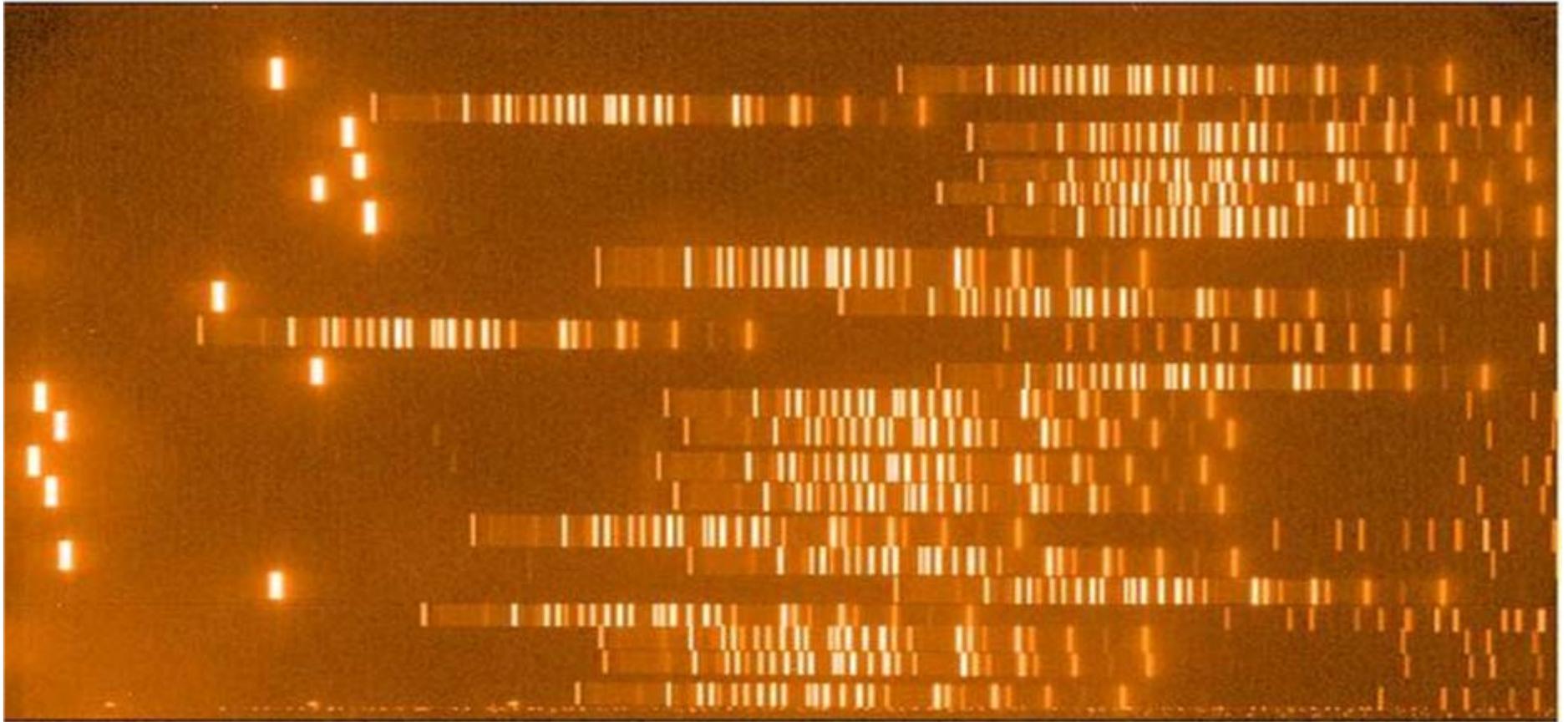
## Wavelength map

Mean accuracy: 0.07 pixel





## Another example (FORS2-MXU GRIS\_150I)



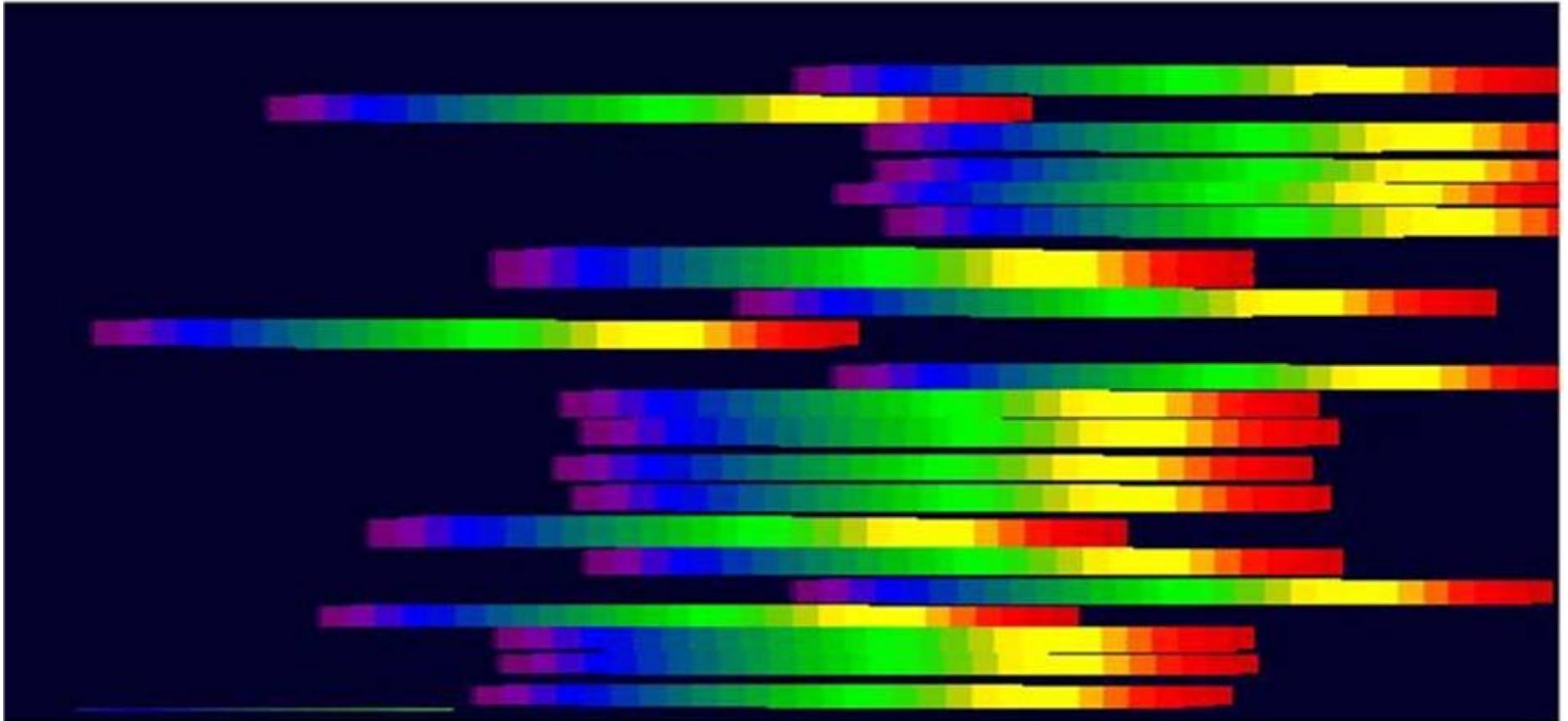
*SDD*

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# Wavelength map

Mean accuracy: 0.05 pixel



*SDD*

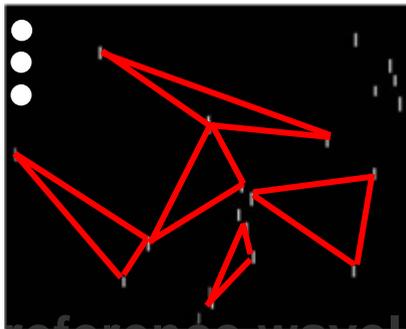
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## Identifying the spectra

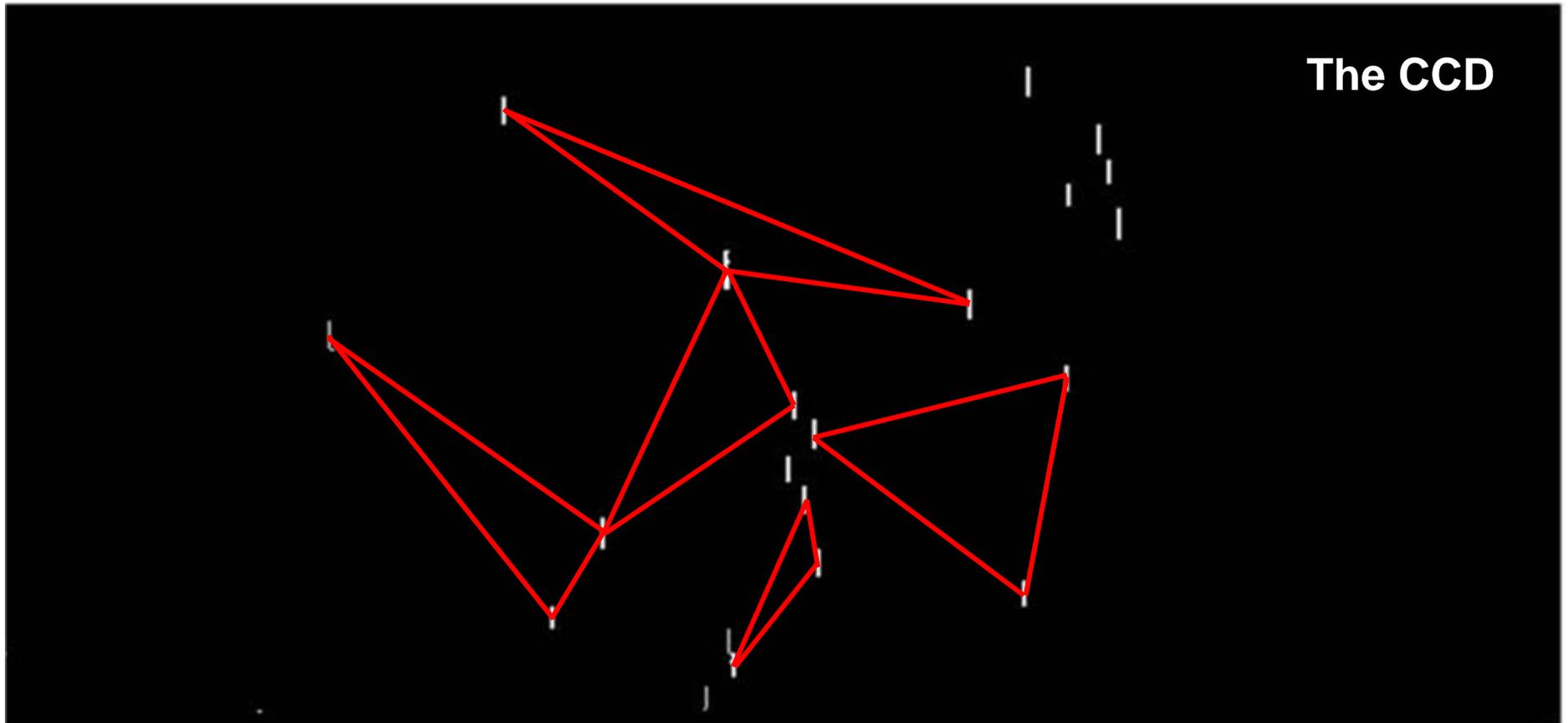
Select the reference wavelength: in this example,  $\lambda = 7000.00 \text{ \AA}$

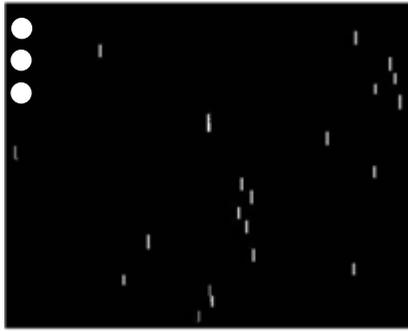




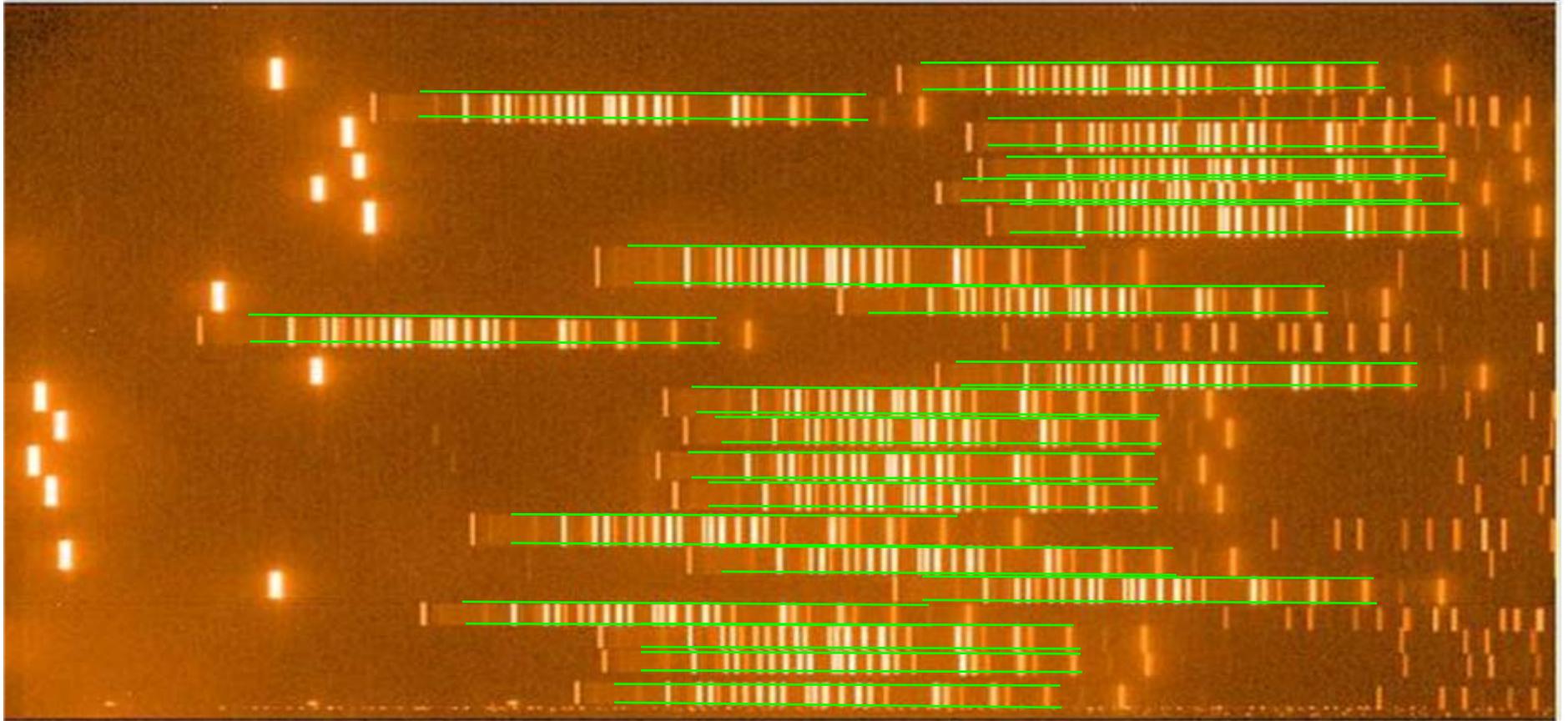
## Identifying the slits

Select the reference wavelength: in this example,  $\lambda = 7000.00 \text{ \AA}$



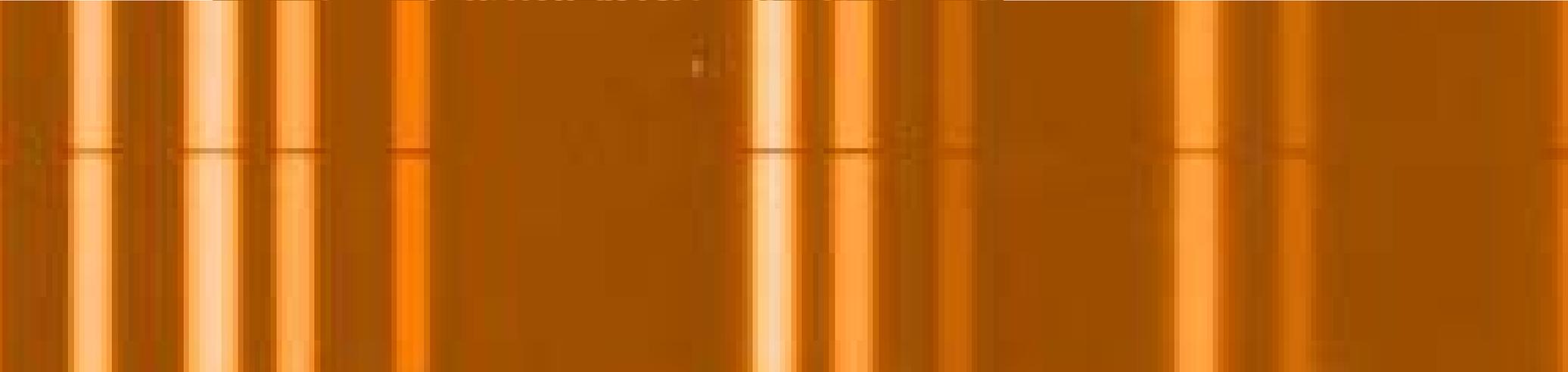
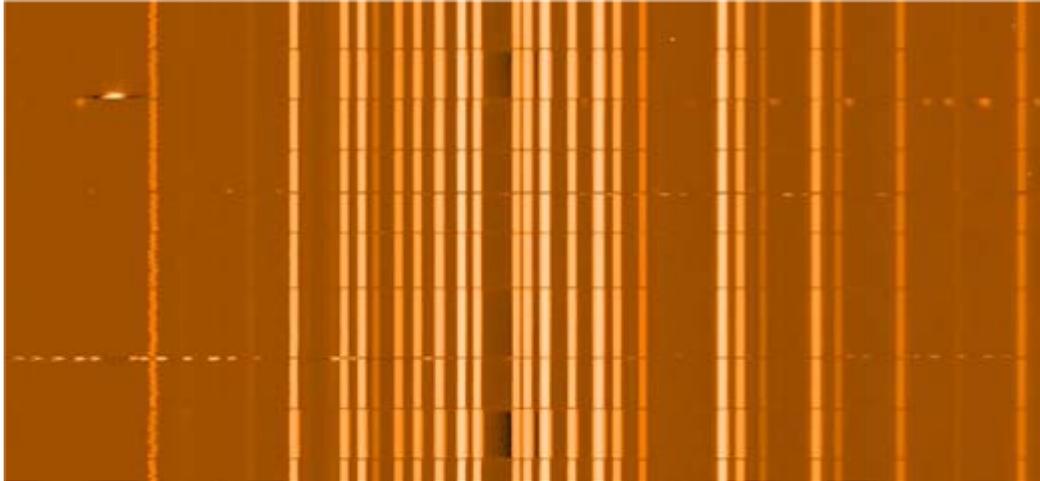


# Measuring the spectral curvature





Rectified image



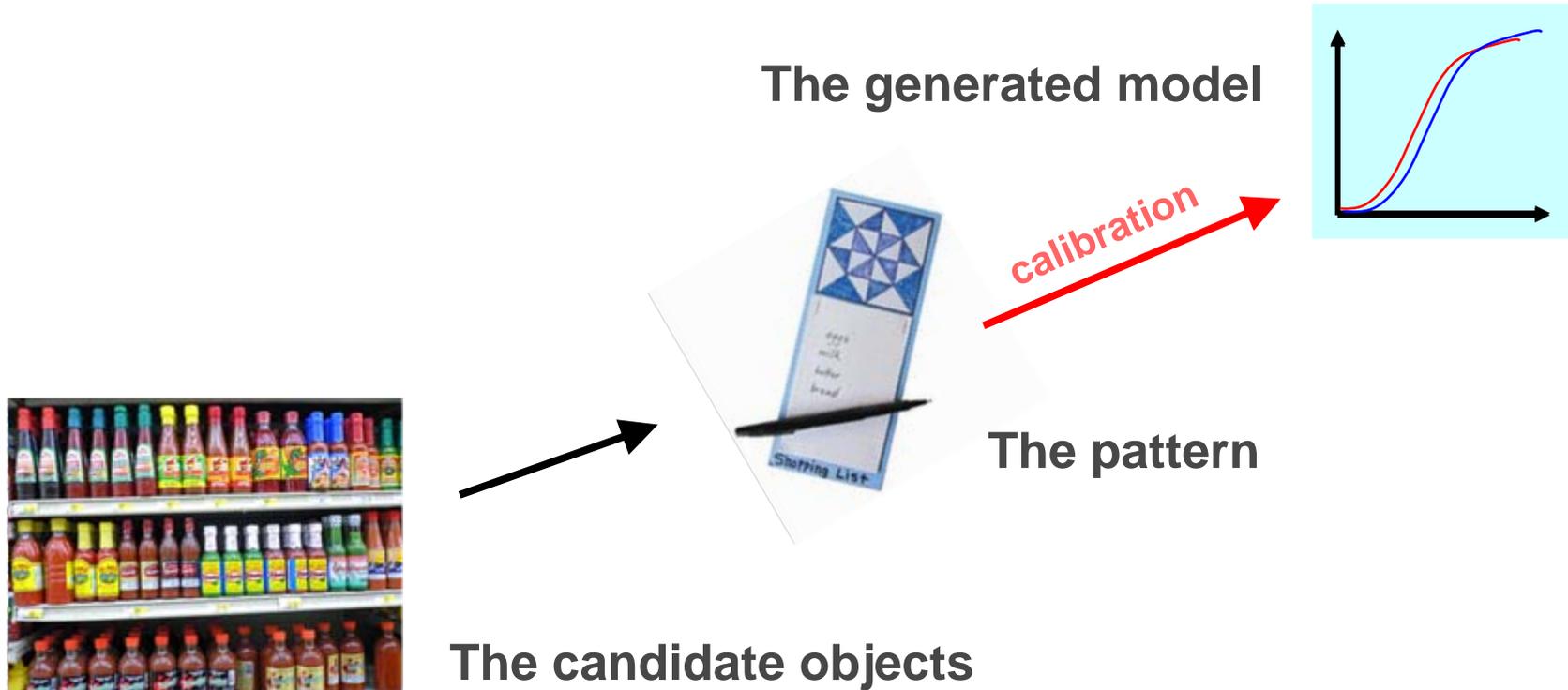
*SDD*

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# Identification of reference objects

How to identify reference objects?  
The bottom-up approach:





## Robustness

- This approach can cope with unexpected position and/or number of spectra
- Reference lines are more safely identified for being part of a pattern, rather than for being close to some expected position



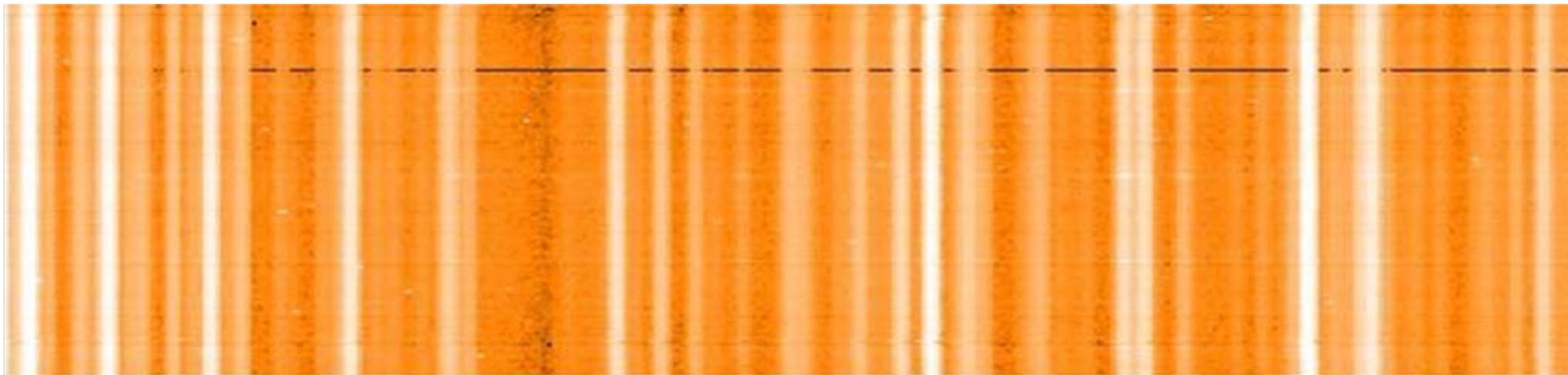
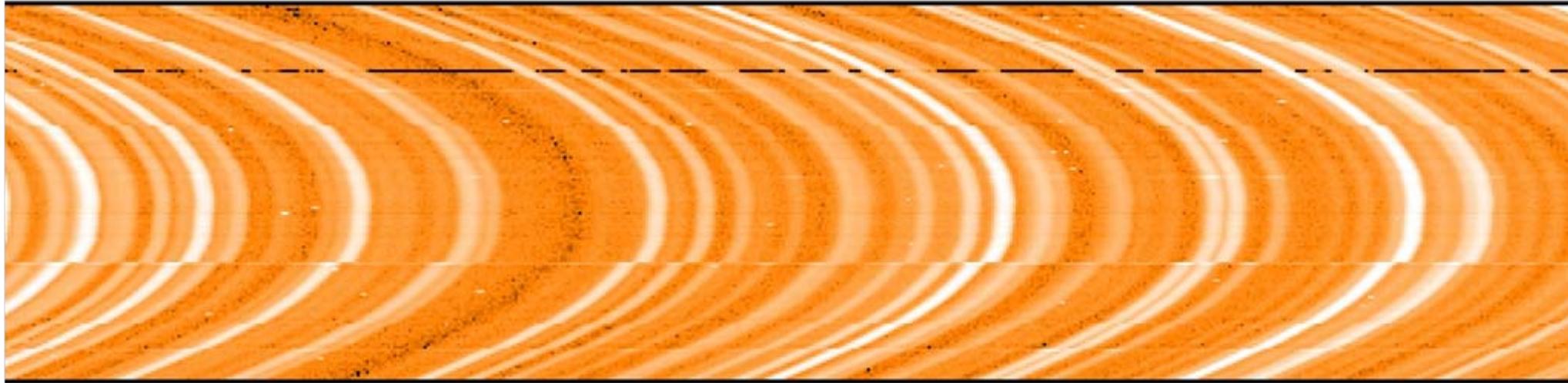
## Flexibility

- This approach is (MOS) instrument-independent
- Low maintenance cost, even at instrument upgrades (new chip, new grism, new lamps...)
- This approach may be applied to extracted products from any kind of spectroscopic data (not just MOS, but also IFU, echelle, etc.).



# GIRAFFE Medusa1\_H525.8nm

Mean accuracy: 0.10 pixel



*SDD*



## Disadvantages of the bottom-up approach

- As the top-down approach depends on a model, the bottom-up approach depends on the data!
- This approach is a black box: as for any program based on a bottom-up strategy (e.g., using trained neural networks), it is often difficult to find the reason of a failure.



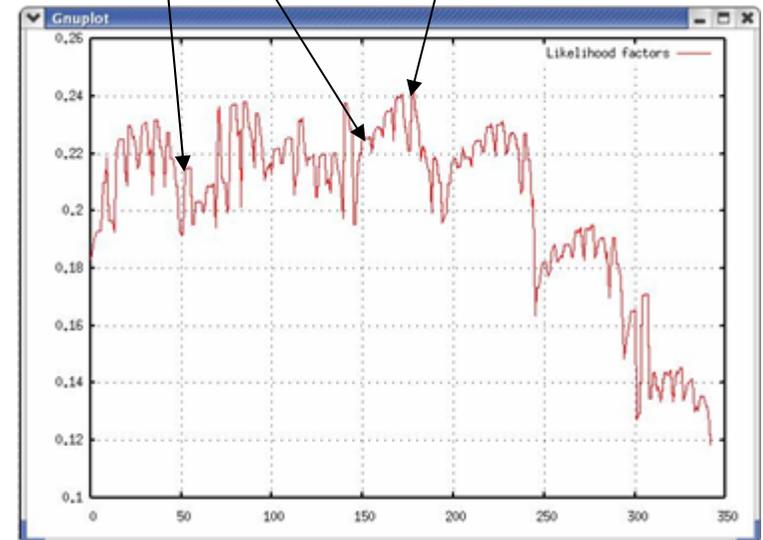
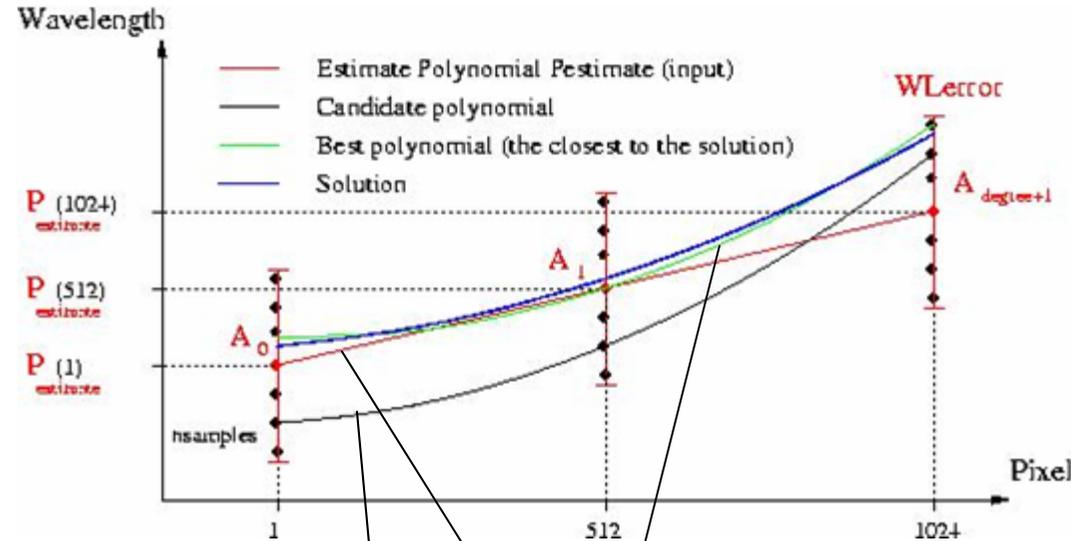
# The CRIRES data reduction challenges

## Inputs:

- The Estimate Polynomial
- The Wavelength Error of the estimate (WLError)
- The degree of the searched polynomial (degree)
- The number of samples (nsamples)
- The lines catalogue (OH, Gas cell, Lamps, Hitran)
- The signal to calibrate (in pixels)

## Algorithm:

- Consider degree+1 positions  $A_i$  regularly spaced, and nsamples points spread within WLError around these positions
- For each possible sequence of points ( $nsamples^{(degree+1)}$  possibilities), the interpolation polynomial is created and considered as candidate
- The candidate polynomial is used to convert the signal to calibrate from pixels to wavelengths. This signal is compared to the signal generated from the catalogue. A likelihood coefficient is computed
- The best likelihood parameter gives the best candidate, i.e. the polynomial that is the closest to the solution
- A second pass (or more) is used to refine the solution with the first pass solution used as estimate, with a smaller WLError and a higher degree.





**Thanks to:**

**Lars Lundin (ESO/SDD)**

**Kieran O'Brien (ESO/PSO)**

**Emmanuel Jehin (ESO/PSO)**

**Ralf Palsa (ESO/SDD)**

**Marguerite Pierre (CEA, Saclay, France)**

**Stefano Cristiani (INAF, Trieste, Italy)**

**Christophe Adami (LAM, Marseille, France)**

**Harald Kuntschner (ESO/ST-ECF)**

**Martino Romaniello (ESO/DFO)**

**Vanessa Doublier (ESO)**

**Sandro Villanova (DdA, Padova, Italy)**

**Stefano Bagnulo (ESO/PSO)**

**Burkhard Wolff (ESO/DFO)**

**Emanuela Pompei (ESO/LSO)**

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**Ivo Saviane (ESO/LSO)**



# Looking for patterns

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# Looking for peaks

