

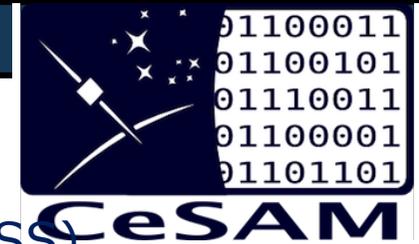
# AMAZED : Algorithms for Massive Automated Z(redshift) Estimation and Determination

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and the Euclid and PFS science working groups

## A versatile fully automated redshift measurement library



- Human participation up to now (VVDS, VIPERS, DEEP2, even SDSS)
  - No more than  $10^5$  spectra
  - Validation of software results :  
Redmonster (Hutchinson et al. 2016), EasyLife (Garilli et al. 20XX)
- Impossible for surveys in preparation (Euclid, PFS, Roman, ...) :
  - Several millions of objects
  - High observing rate
  - We don't want to do it anymore

Building on the heritage of VIMOS surveys

## A versatile fully automated redshift measurement library



- Adaptable to any instrumental configuration (UV/visible/IR/?)
- Takes into account instrumental effects : LSF, (co)variance
- Fully automated bayesian inference redshift measurement (and error)
- Bayesian object classification (Galaxy, quasars, stars)
- Quantification of reliability and ultimately quality of fit (detection of monsters)
- Core of Euclid, PFS and Roman pipelines



- A least-square fit of model parameters weighted by signal variance
  - Fixed redshift grid
  - Logarithmic sampling for FFT
  - Go back to Tonry & Davis (1979) for a fundamental description
- Redshift Probability Distribution Function calculation for each model
- Combination of all zPDFs into one
- The N best redshifts are identified from the PDF peaks
- Measurements of spectral features at the best redshifts solutions

## The galaxy model



- Continuum (including stellar absorption lines)
  - *21 templates built from BC03 models (Tremonti+ 2003)*
  - *The amplitude is fitted*
- Emission lines
  - *Predefined list of lines*
  - *Relative ratios predefined (and updated) from 13 VVDS stacked spectra*
  - *Redshift and width are free parameters*
- Interstellar absorption lines
  - *Velocity shift is fixed (-150 km/s), but could be free*
  - *Relative ratios predefined from 13 VVDS/Steidel stacked spectra*
- Intergalactic Medium absorption
  - *Tabulated from Meiksin (2002) : 7 curves at 11 redshifts between 2 and 7*
- Interstellar extinction
  - *Tabulated from Calzetti (2000)*

## The method – The model



- Continuum (including stellar absorption lines)

- 21 templates built from BC03 models
- The amplitude is fitted

- Emission lines

- Predefined list of lines
- Relative ratios
- Position

- Interstellar

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Bring your own if you don't like ours :

- All model components are handled as configuration files

- The user can decide to use them or not

Ultra

Model stacked spectra

curves at 11 redshifts between 2 and 7

Leiti (2000)

## The method – Redshift Determination



- PDF from each model are combined
  - *Marginalization (over all model parameters), final PDF delivered.*
- The best redshift is taken at the maximum of integrated probability
  - *Error on redshift estimated via Gaussian fit*
  - *Integral value under the PDF peak as Reliability level*
  - *To be improved with ML/DL Techniques*
- Secondary redshift values at following peaks
- Code is able to integrate priors
  - *Strong lines : greater probability for "Main Strong lines" (Ha, OII, OIII)*
  - *H $\alpha$  : greater probability to be an Ha line*
  - *N(z) : an a-priori redshift distribution of Ha emitters*

# The method – Redshift Determination



## The usage – Integration to a pipeline or standalone use



- Interaction with the input and output data : the python client
  - *Generic one with a given data model for public version*
  - *We can provide one adapted to the datamodel used in a pipeline*
  - *Both in input and output*
- Handles parallelization

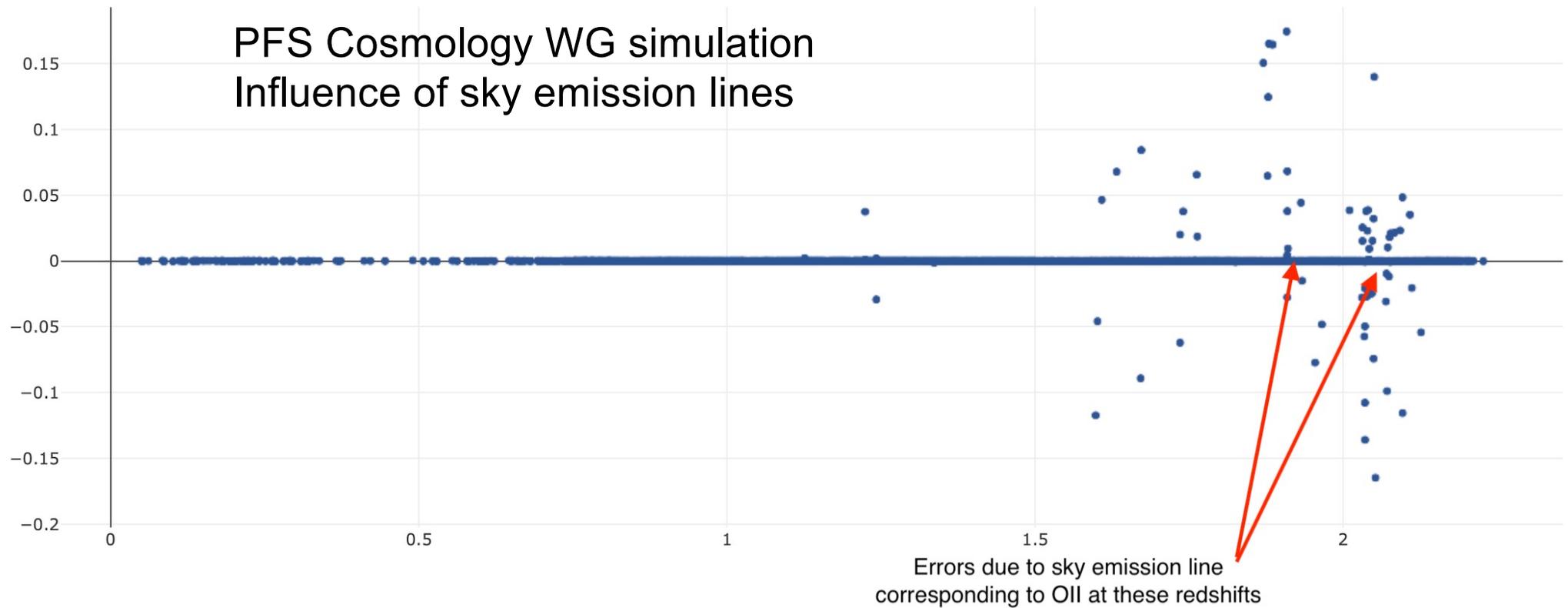
## Performances on simulated data



- Efforts from the PFS and Euclid Science Working Groups
- Within requirements so far but...
  - Not all instrumental effects included yet
  - Simulated continuum against simulated continuum templates  
*(because building coherent observed templates over 500-18000 Å is tough)*

*Others already said it, but early full E2E simulations are fundamental*

# Performances on simulated data

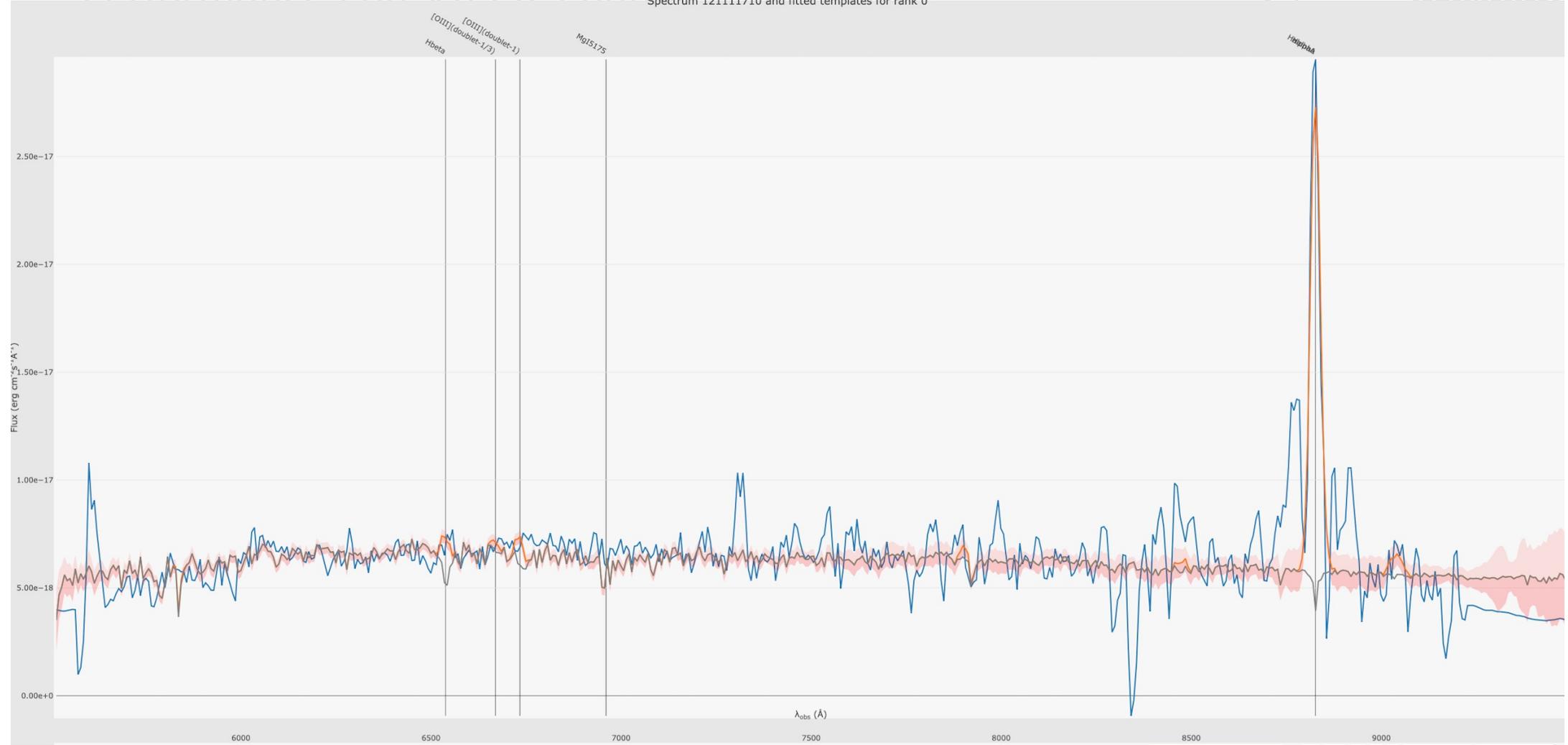


## Performances on VIPERS data

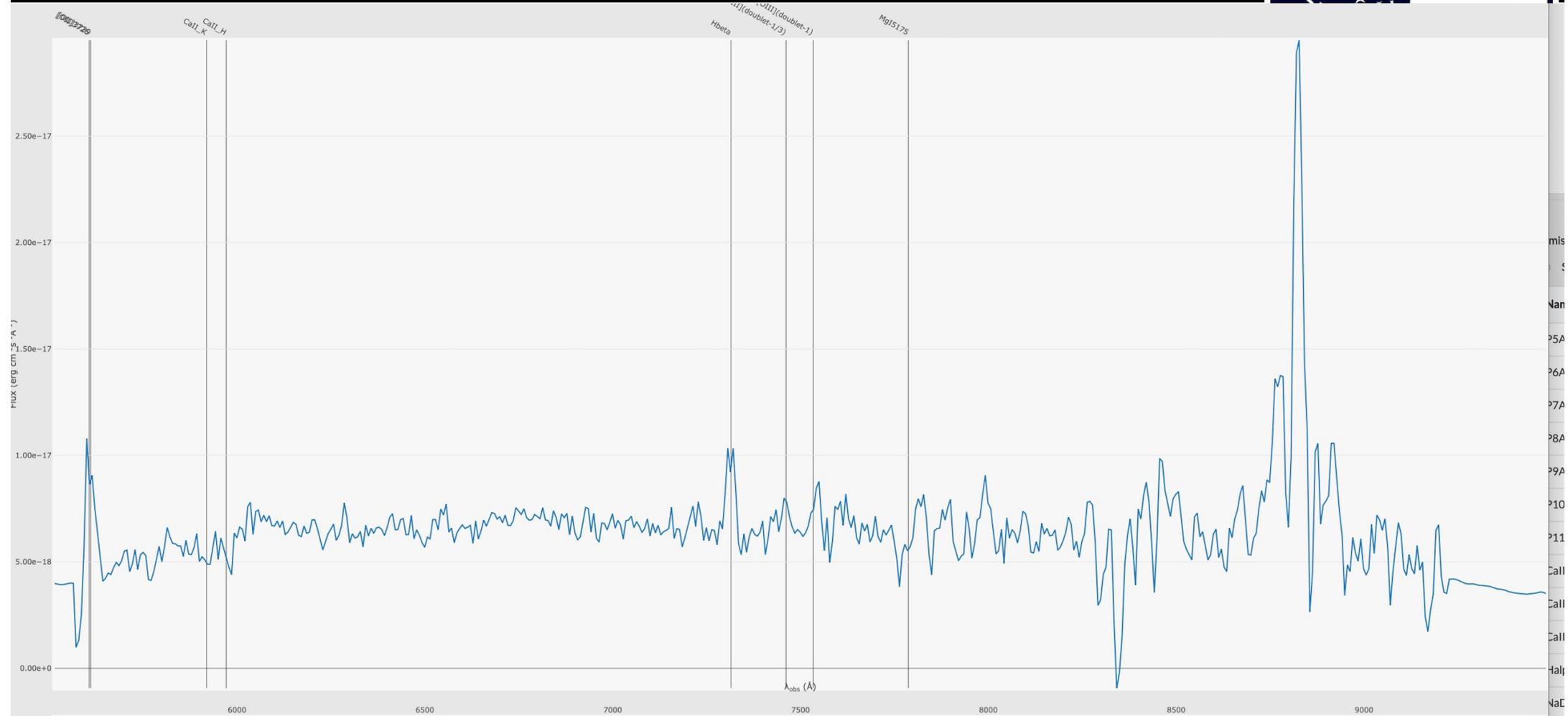


- Results on the flag 4 spectra : 19658 galaxy spectra
- Caveats
  - Variance in VIPERS spectra is 'not perfectly' evaluated
  - There can be superposition of spectra
  - Flags (sometime strongly) depend on the personality/experience
  - Human measurement based on features not available
    - 2D spectrum
    - Feature on the edge of spectrum

# Performances on VIPERS data



# Performances on VIPERS data



## Performances on VIPERS data

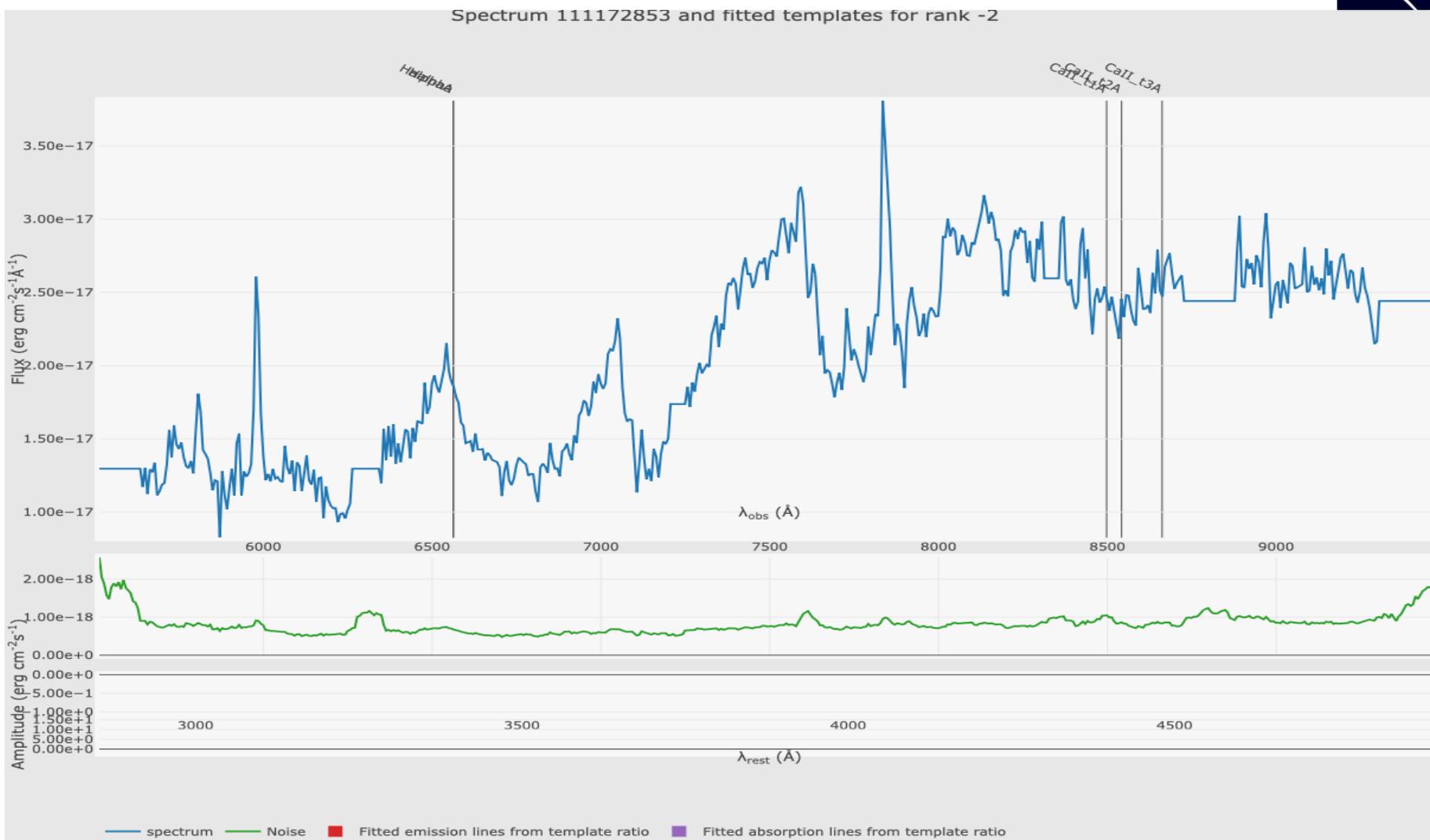


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# Performances on VIPERS data



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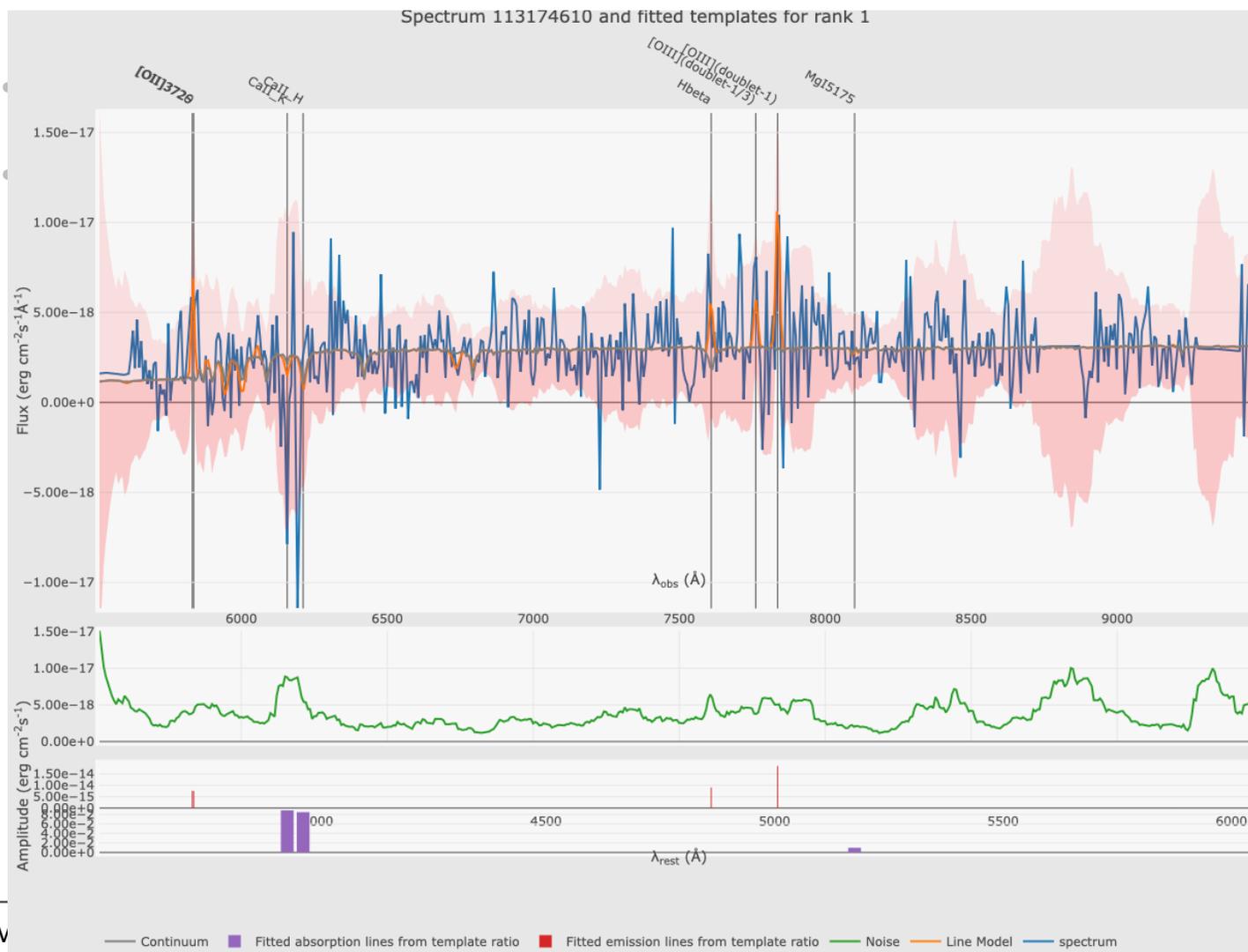


## Performances on VIPERS data

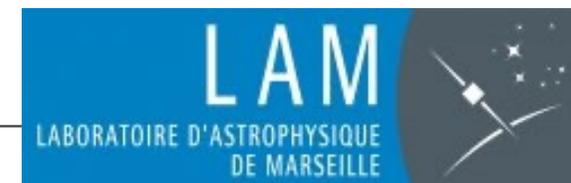


- Results on the flag 4 spectra : 19658 galaxy spectra
- Caveats
  - Variance in VIPERS spectra is 'not perfectly' evaluated
  - Not a simulation, even with double human check, errors remain
  - Flags (sometime strongly) depend on the personality/experience
  - Human measurement based on features not available
    - 2D spectrum
    - Feature on the edge of spectrum

# Performances on VIPERS data



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 available



## Performances on VIPERS data



- 96.3% success with  $|dz/(1+z)| < 0.002$  (300 km/s at  $z=1$ )
- $0.4 < z < 0.53$  galaxies represent 20% of sample but 35% of errors
  - Lack of adequate template ?  
(Red+ templates were built during VVDS)
- Merit (measures confidence, )
  - Cutting merit  $> 0.99$  excludes 7.5% of the sample but 1/3 of errors
  - Dynamics to be refined

## Next steps



- Improve reliability
- Validate object classifier
- Provide homogeneous measurements on public data available at
  - <https://cesam.lam.fr/aspic>
- First public release in 2022
- Open to collaborate on your favorite project

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