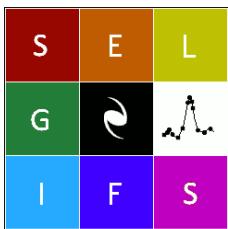




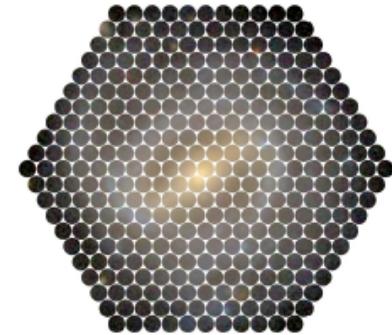
**FADO**  
FITTING  
ANALYSIS USING  
DIFFERENTIAL EVOLUTION  
OPTIMIZATION

A novel spectral population synthesis tool  
for the exploration of galaxy evolution



Gomes & Papaderos

[www.spectralsynthesis.org](http://www.spectralsynthesis.org)  
[www.iastro.pt/research/tools.html](http://www.iastro.pt/research/tools.html)



CALIFA Survey



UNIÃO EUROPEIA  
Fundo Social Europeu

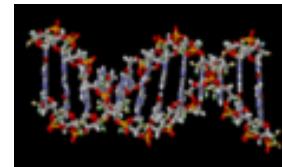
# HEADLINES

1. Overview



Population Synthesis

2. FADO



2.1. FADO in a nutshell

2.2. FADO pipeline

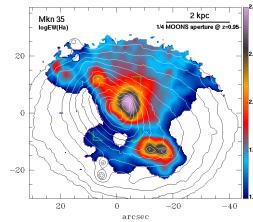
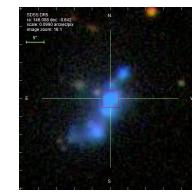
2.3. FADO comparison

3. FADO Applications

3.1. SDSS: BCD & GP

3.2. CALIFA IFU MRK 35

4. Final remarks





# 1. What is population synthesis?

- Equation is expressed in terms of light fractions

Light fractions of stellar populations

POPULATION VECTOR

$$F(\lambda)/F(\lambda_0) = \sum_j x_j B_j(\lambda) 10^{-0.4A_\lambda} \otimes G(v_\star, \sigma_\star)$$



YOUNG  
INT.  
OLD



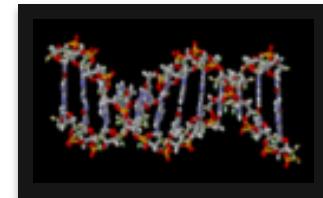


# 2. FADO

Fitting Analysis using Differential evolution Optimization

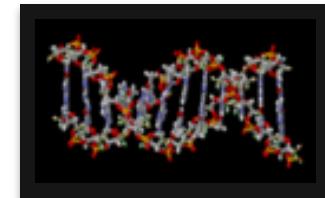
Gomes & Papaderos 2017 (A&A 603, 63)

- Next generation of population synthesis codes: motivated by Porto3D IFU post-processing pipeline & RemoveYoung
- Multi-objective mathematical programming: several conflicting objectives might be introduced in the formulation of an optimization problem (e.g., photometric bands, emission-lines, among others)
- Pareto optimal solutions



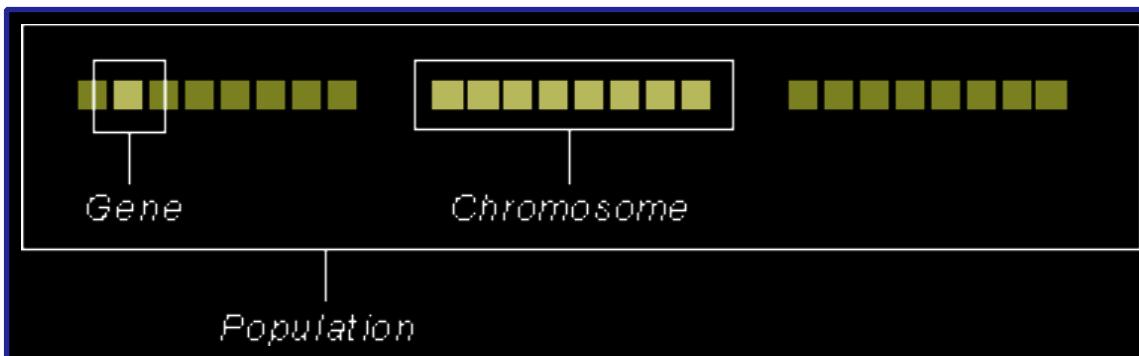
## 2. FADO

- Genetic optimization + Artificial Intelligence schemes
- Based on 3 main features:  
**Breeding, Mutation and Selection** Represented by Chromosomes, Biological inspiration. Ideal for multi-objective programming
- Differential evolution is a method that optimizes a problem by iteratively trying to improve a candidate solution
- Chromosome convergence test for Pareto optimal solutions



# 2. FADO

## Fitting Analysis using Differential evolution Optimization



Genes: Parameters

Chromosome: Solution/Fit

Population: Ensemble of Fits

### Crossover

parent 1



parent 2



offspring



### Mutation

before mutation

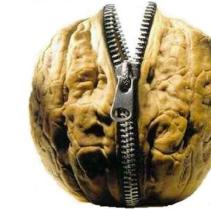


after mutation

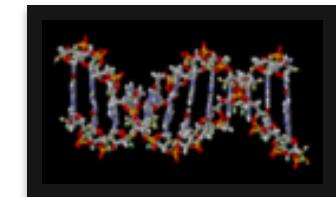




## 2.1. FADO in a nutshell

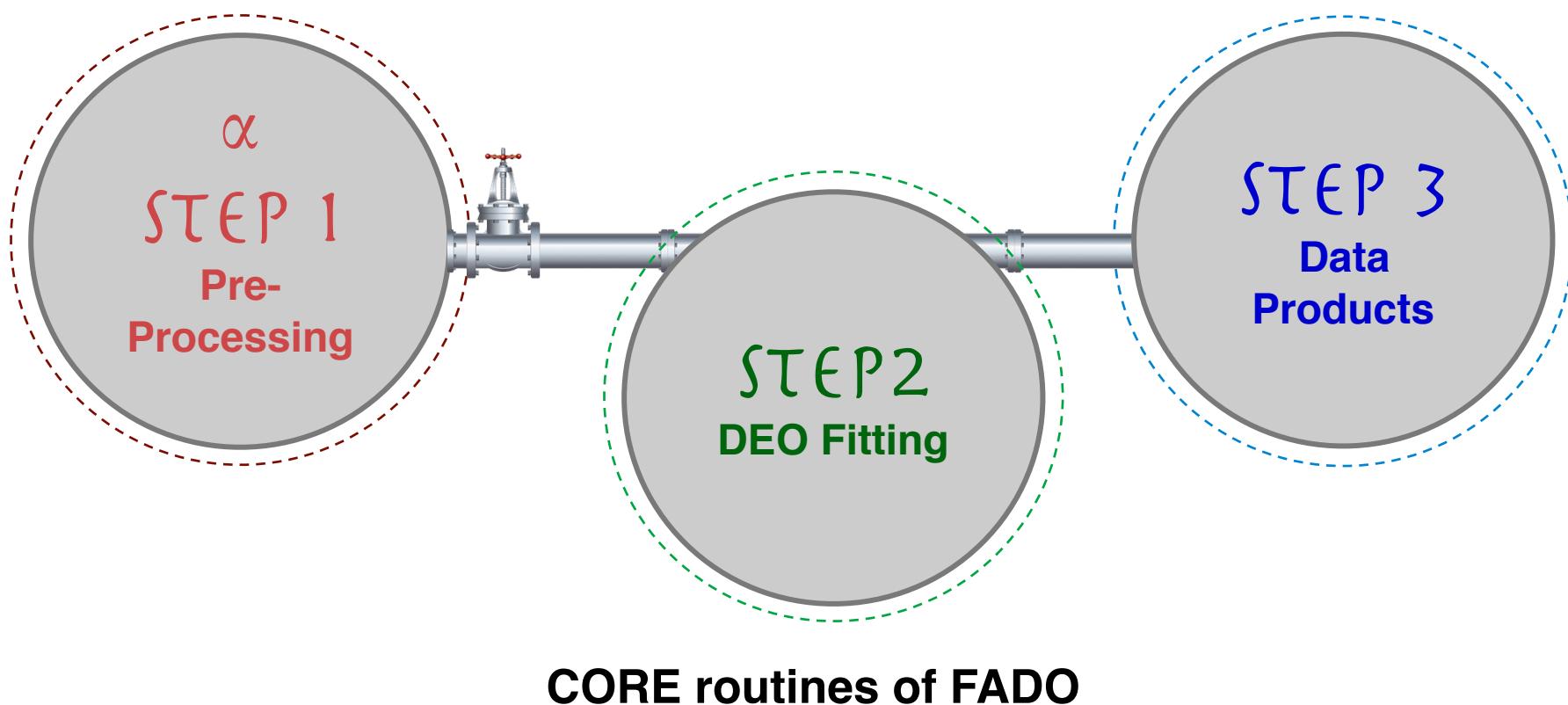


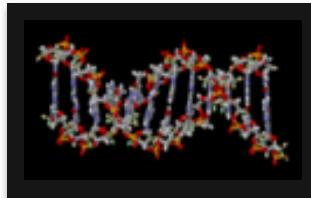
- 1- Computation and inclusion of the nebular continuum to the best-fitting SED;
- 2- PV that self-consistently accounts for the observed line luminosities and EWs (v.1 Balmer-line luminosities);
- 3- On-the-fly determination of the physical conditions in the ionized gas and determination/storage of emission-line fluxes, and their uncertainties;
- 4- Automatically pre-classification of the input spectrum and on-the-fly optimization of the spectral fitting strategy using Artificial Intelligence (AI) techniques;
- 5- Computation and storage of uncertainties for all primary (e.g., PV, extinction, kinematics) and secondary products (e.g., mean stellar age and metallicity) from the spectral fit.



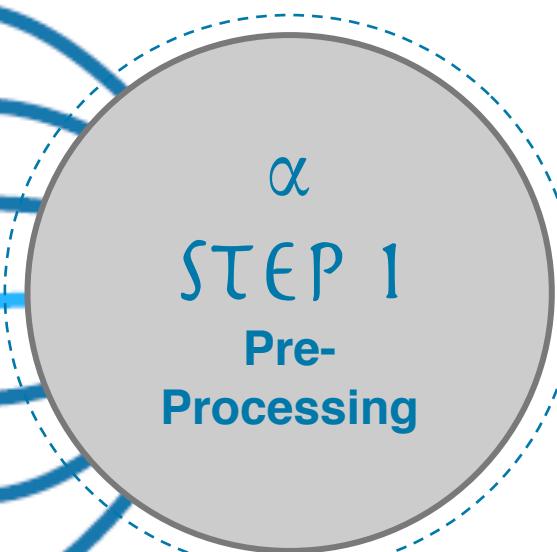
## 2.2. FADO pipeline

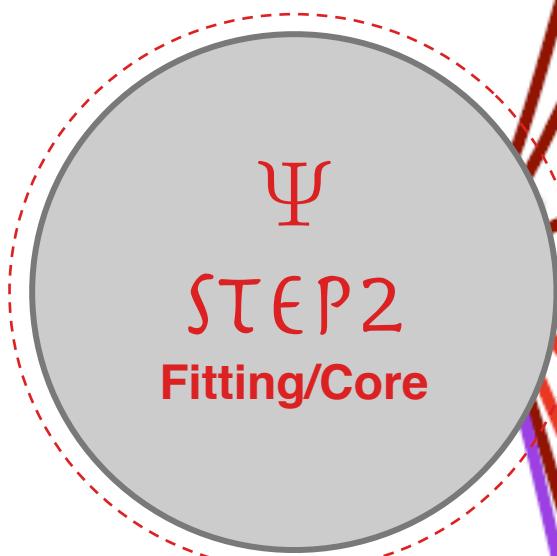
Single pipeline for analysis and having the data products





- 1 Import of spectra (ascii or FITS)
- 2 Flux-conserving rebinning
- 3 Initial redshift determination (CC)
- 4 Auto-determination of  $1\sigma$  error spectrum
- 5 Initial spectroscopic classification
- 6 Initial guess for the fitting strategy
- 7 AI optimization of the SSP library





On-the-fly measurement of emission-line fluxes and EWs → quality check & BPT diagnostics

1

Determination of gas extinction and physical conditions in the gas ( $n_e, T_e$ )

FIVEL

2a

Standard

2b

Decision tree: fitting strategy & convergence scheme (CS)

Full / Partial / No Consistency

3

Multiple population threads  $P_i \rightarrow$  Breeding → initial assessment of the fit

4

Computation of the LyC output from the PV

5

Computation of predicted Balmer-line luminosities & nebular continuum (Case B)

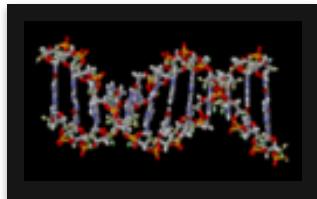
6

Multi-objective optimization & Pareto solution: stellar + nebular continuum (depending on CS)

7

Optimum fit & Computation of uncertainties in the individual SSP contributions

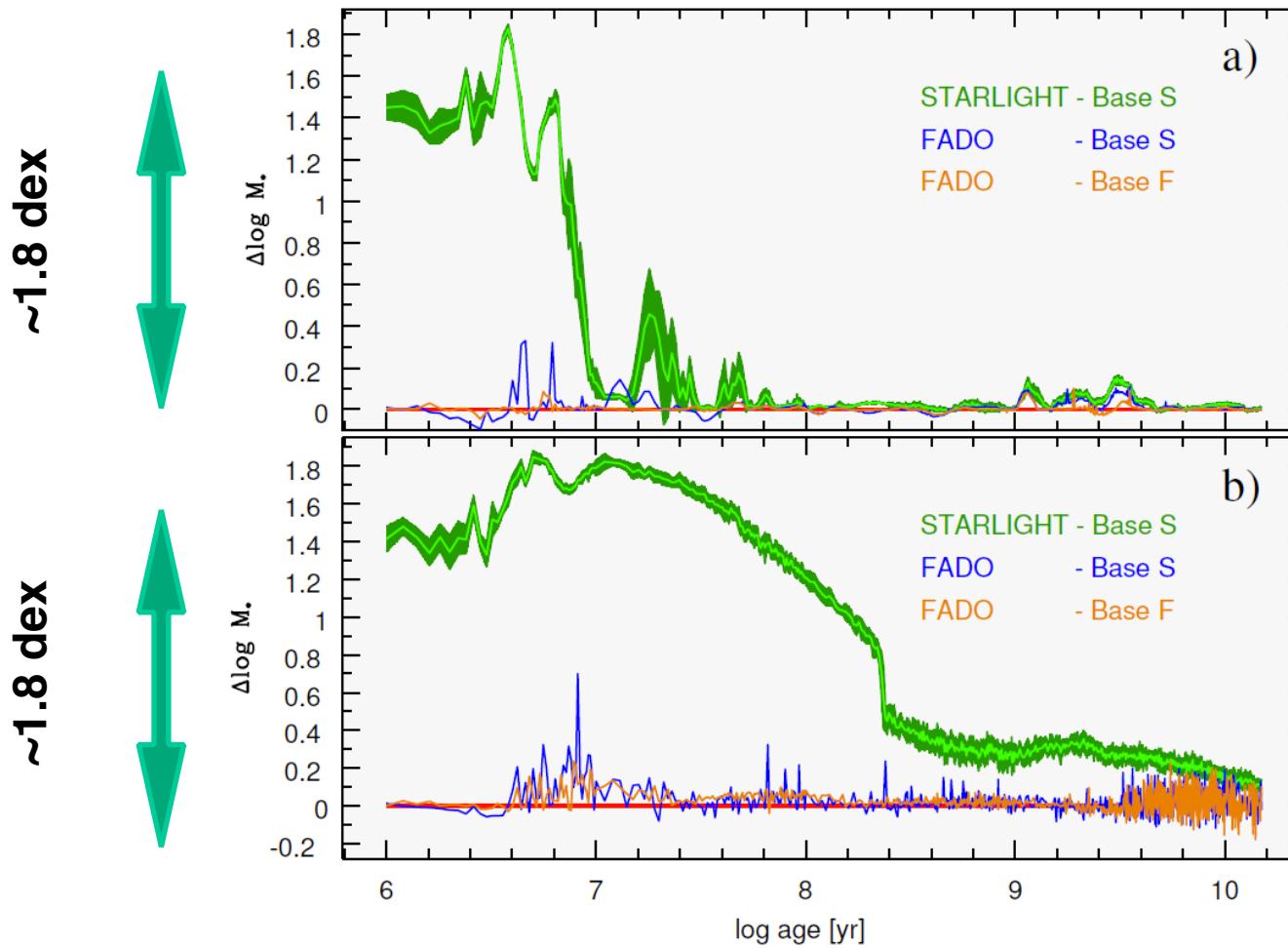
8



- 1 Final measurement of emission-line fluxes & EWs  
(and uncertainties) and spectral classification
- 2 Computation of physical and secondary evolutionary  
quantities and errors (  $M_*$ ;  $n_e$ ;  $\langle t_* \rangle_{L,M}$ ;  $\langle Z_* \rangle_{L,M}$ ; etc. )
- 3 Exportation of the relevant output in FITS data cubes &  
ascii tables
- 4 Graphical output (EPS)

$\omega$   
**STEP 3**  
**Data Products**

## 2.3. FADO comparison with purely stellar models



Instantaneous burst

Continuous SF

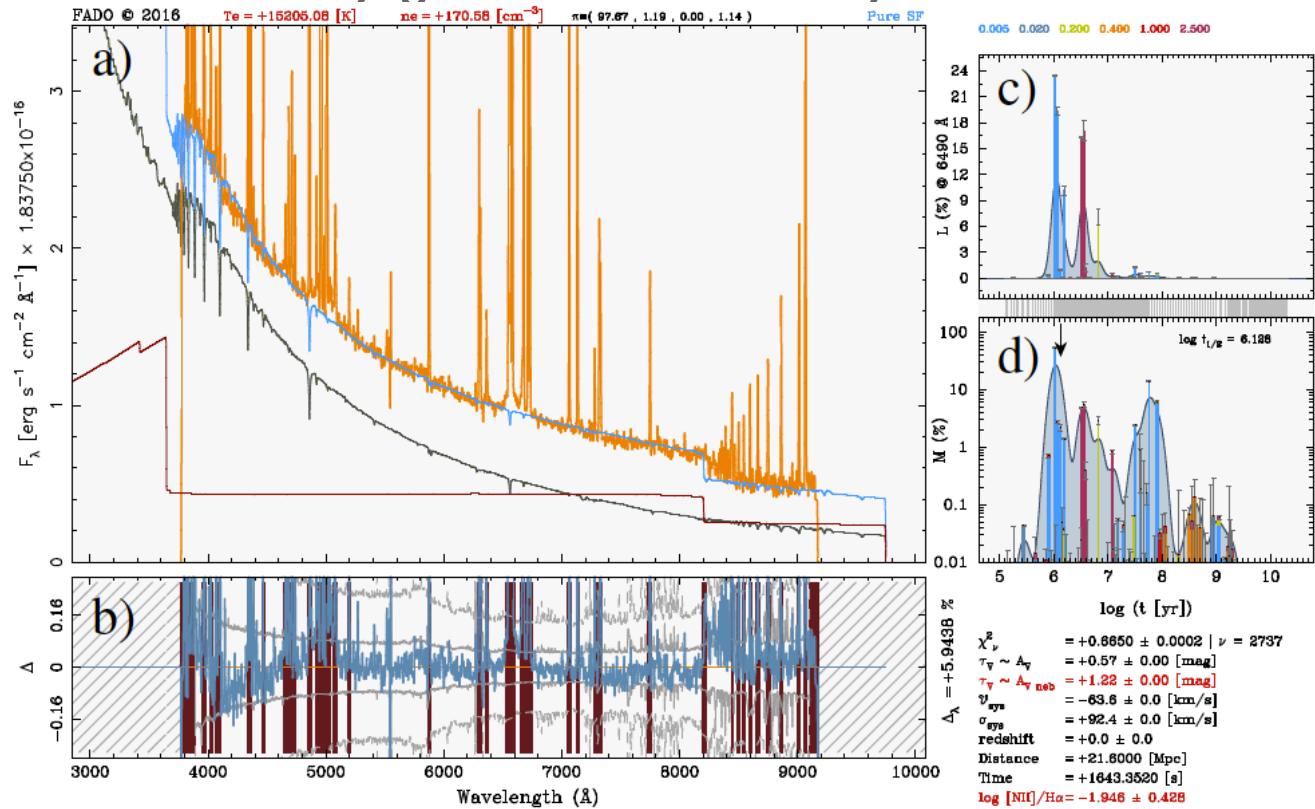
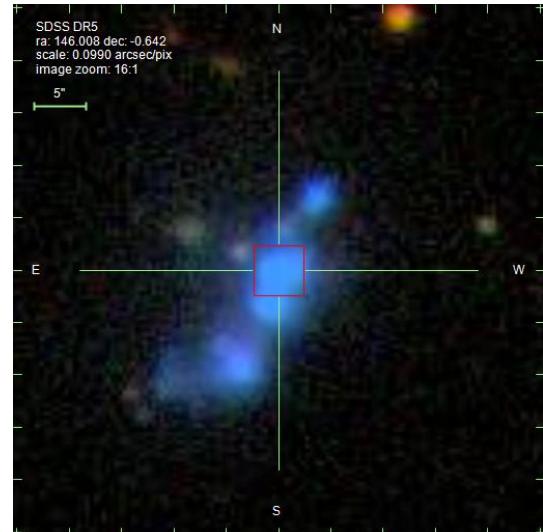


# 3. FADO applications



# 3.1. CGCG 007-025a

Example from SDSS: Extremely gas contaminated system - BCD



$\langle t \rangle_L = +0.004 \pm 0.0006 \text{ [Gyr]}$	$\langle t \rangle_M = +0.018 \pm 0.0035 \text{ [Gyr]}$	$F_{He}^{\text{obs}} = 3.4395 \times 10^4 \pm 1.4460 \times 10^2$
$\langle z \rangle_L = +0.898 \pm 0.0047 \text{ [Z}_\odot\text{]}$	$\langle z \rangle_M = +0.306 \pm 0.0021 \text{ [Z}_\odot\text{]}$	$F_{He}^{\text{mod}} = 3.4355 \times 10^4 \pm 3.5046$
$\langle \log t \rangle_L = +8.344 \pm 0.0036 \text{ [yr]}$	$\langle \log t \rangle_M = +6.549 \pm 0.0180 \text{ [yr]}$	$F_{He}^{\text{obs}} = 8.3780 \times 10^3 \pm 6.5800 \times 10^1$
$\log \langle x \rangle_L = -0.047 \pm 0.0023 \text{ [Z}_\odot\text{]}$	$\log \langle x \rangle_M = -0.514 \pm 0.0029 \text{ [Z}_\odot\text{]}$	$F_{He}^{\text{mod}} = 8.6139 \times 10^3 \pm 0.84470$
$\log M^* = +6.019 \pm 0.0054 \text{ [M}_\odot\text{]}$	$\log Q_{He} = +92.907 \pm 0.0002 \text{ [photons/s]}$	$EW_{He}^{\text{obs}} = 1924.38 \pm 18.83$
$\log M^P = +5.981 \pm 0.0054 \text{ [M}_\odot\text{]}$	$\log Q_{He} = +92.493 \pm 0.4141 \text{ [photons/s]}$	$EW_{He}^{\text{mod}} = 1922.10 \pm 0.46$
$\log M^*_{\text{MBB}} = +3.336 \pm 0.1748 \text{ [M}_\odot\text{]}$	$\log Q_{HeII} = +90.074 \pm 2.8366 \text{ [photons/s]}$	$EW_{HeII}^{\text{obs}} = 271.26 \pm 4.90$
$\log M^P_{\text{MBB}} = +3.090 \pm 0.1754 \text{ [M}_\odot\text{]}$	$\log Q_{HeII} = +90.368 \pm 0.0741 \text{ [L}_\odot\text{]}$	$EW_{HeII}^{\text{mod}} = 278.90 \pm 0.05$

Gomes & Papaderos 2017

# 3.1. CGCG 007-025a

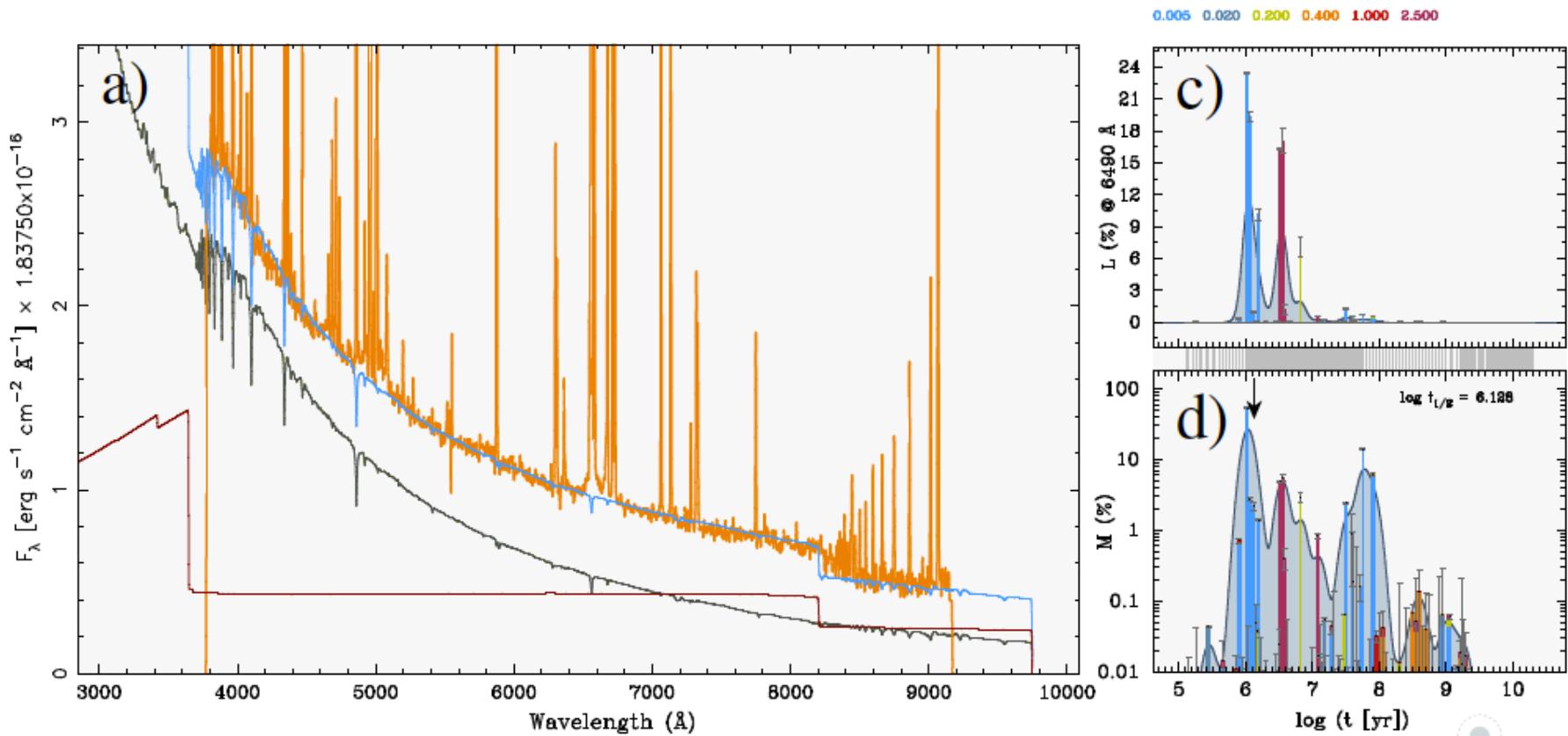
Example from SDSS: Extremely gas contaminated system - BCD

$T_e = +15205.08 \text{ [K]}$

$n_e = +170.58 \text{ [cm}^{-3}\text{]}$

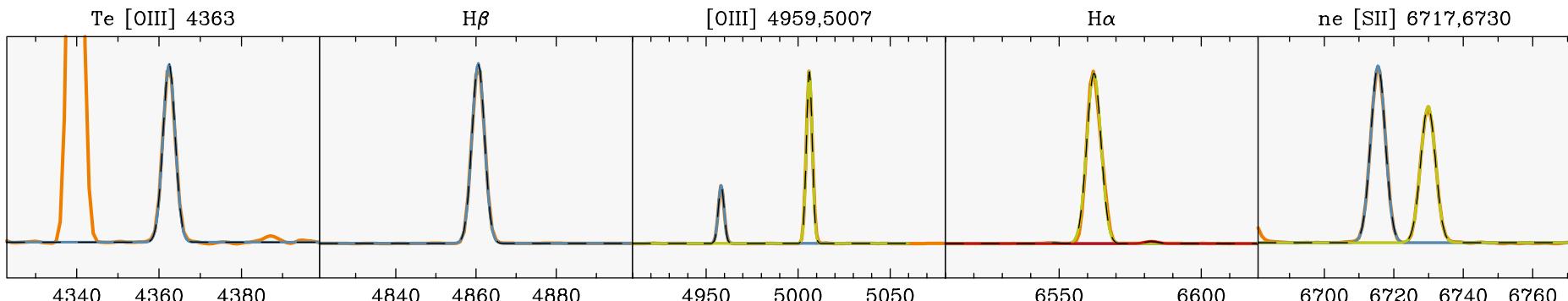
$\pi = (97.87, 1.19, 0.00, 1.14)$

Pure SF



# 3.1. CGCG 007-025a

Output example from SDSS: Gas contaminated system - BCD



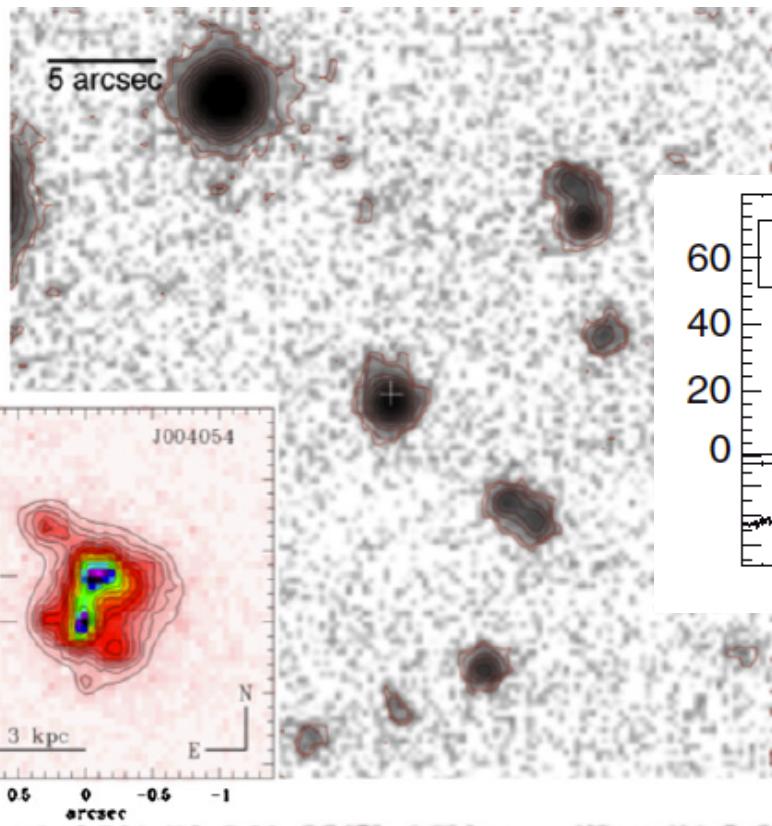
$$\begin{aligned}
 \langle t \rangle_L &= +0.004 \pm 0.0006 \text{ [Gyr]} \\
 \langle z \rangle_L &= +0.898 \pm 0.0047 \text{ [Z}_\odot\text{]} \\
 \langle \log t \rangle_L &= +8.344 \pm 0.0036 \text{ [yr]} \\
 \log \langle z \rangle_L &= -0.047 \pm 0.0023 \text{ [Z}_\odot\text{]} \\
 \log M^e &= +8.019 \pm 0.0054 \text{ [M}_\odot\text{]} \\
 \log M^p &= +5.981 \pm 0.0054 \text{ [M}_\odot\text{]} \\
 \log M_{\text{pAGB}}^e &= +3.336 \pm 0.1748 \text{ [M}_\odot\text{]} \\
 \log M_{\text{nAGB}}^p &= +3.090 \pm 0.1754 \text{ [M}_\odot\text{]}
 \end{aligned}$$

$$\begin{aligned}
 \langle t \rangle_M &= +0.019 \pm 0.0035 \text{ [Gyr]} \\
 \langle z \rangle_M &= +0.306 \pm 0.0021 \text{ [Z}_\odot\text{]} \\
 \langle \log t \rangle_M &= +8.549 \pm 0.0188 \text{ [yr]} \\
 \log \langle z \rangle_M &= -0.514 \pm 0.0029 \text{ [Z}_\odot\text{]} \\
 \log Q_H &= +92.907 \pm 0.0002 \text{ [photons/s]} \\
 \log Q_{HeI} &= +92.493 \pm 0.4141 \text{ [photons/s]} \\
 \log Q_{HeII} &= +90.074 \pm 2.8356 \text{ [photons/s]} \\
 \log L_{\text{bol}} &= +9.368 \pm 0.0741 \text{ [L}_\odot\text{]}
 \end{aligned}$$

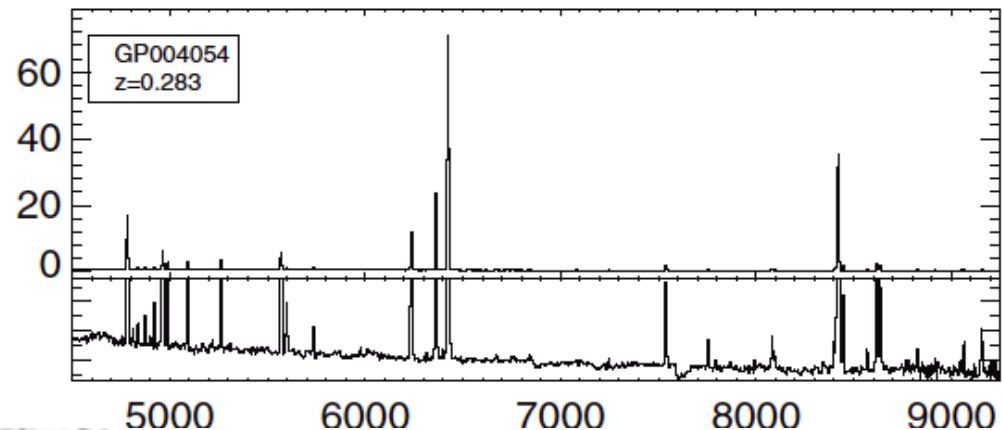
$$\begin{aligned}
 F_{H\alpha}^{\text{obs}} &= 3.4395 \times 10^4 \pm 1.4880 \times 10^2 \\
 F_{H\alpha}^{\text{mod}} &= 3.4365 \times 10^4 \pm 3.5046 \\
 F_{H\beta}^{\text{obs}} &= 8.3780 \times 10^3 \pm 8.5808 \times 10^1 \\
 F_{H\beta}^{\text{mod}} &= 8.6139 \times 10^3 \pm 0.84470 \\
 EW_{H\alpha}^{\text{obs}} &= 1924.32 \pm 18.82 \\
 EW_{H\alpha}^{\text{mod}} &= 1922.10 \pm 0.46 \\
 EW_{H\beta}^{\text{obs}} &= 271.26 \pm 4.90 \\
 EW_{H\beta}^{\text{mod}} &= 278.90 \pm 0.05
 \end{aligned}$$

# 3.2. GP 004054

Green Pea example from Amorín et al. 2012



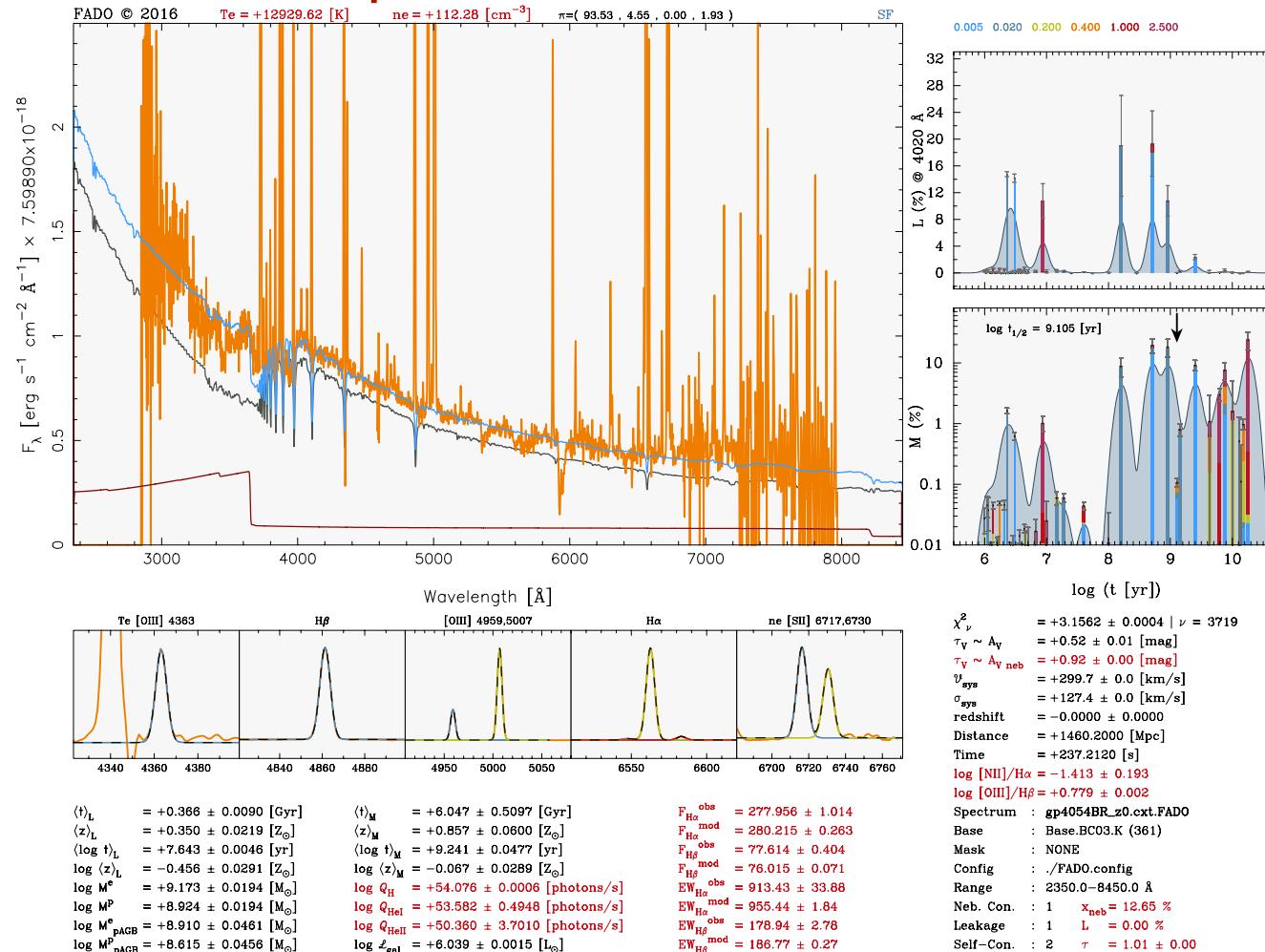
$z = 0.283$



$$\begin{aligned} n_e(\text{[SII]}) \text{ (cm}^{-3}\text{)} &< 260 \\ T_e(\text{[OIII]}) \text{ (10}^4 \text{ K)} &\sim 1.34 \pm 0.02 \end{aligned}$$

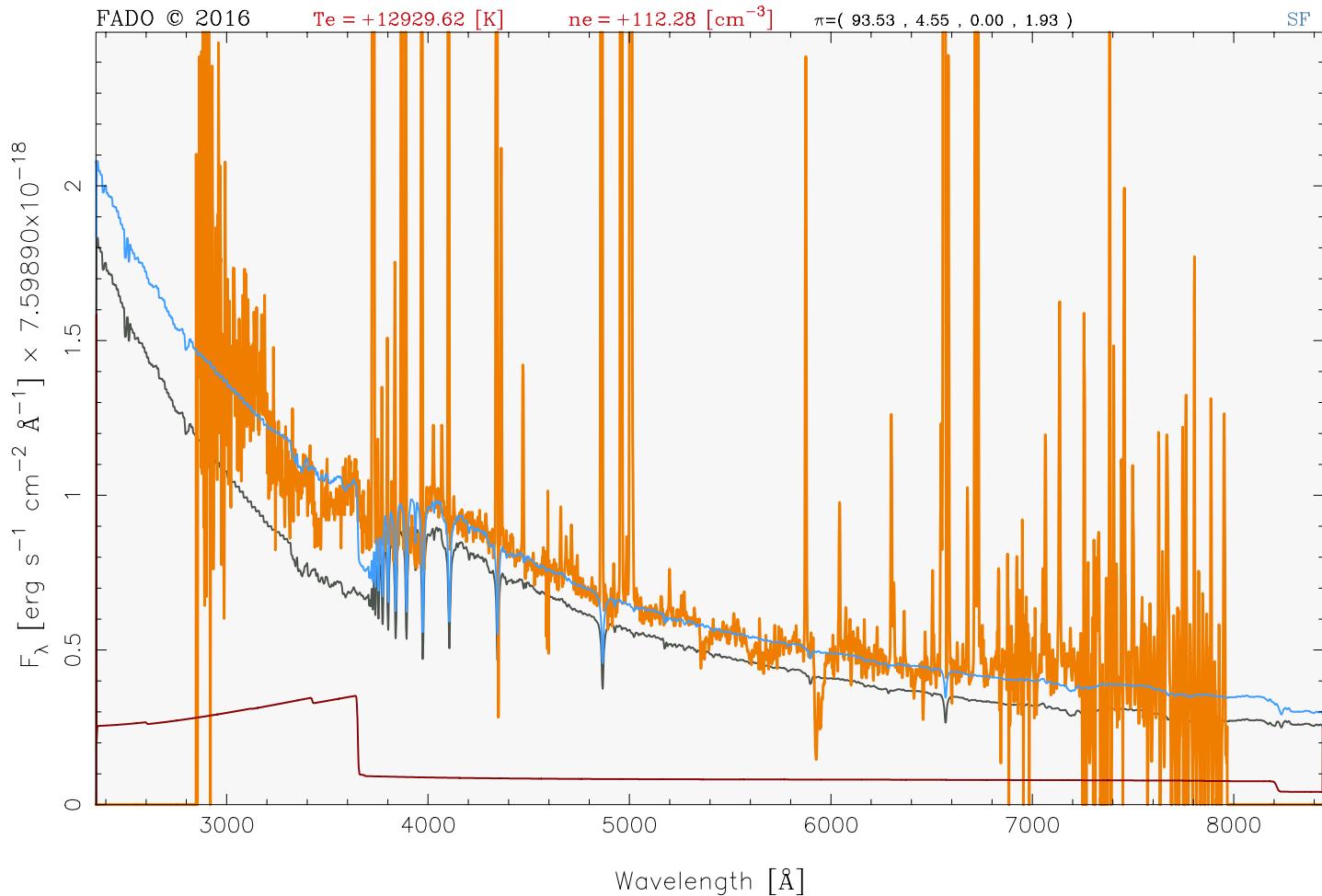
# 3.2. GP 004054

Green Pea example from Amorín et al. 2012



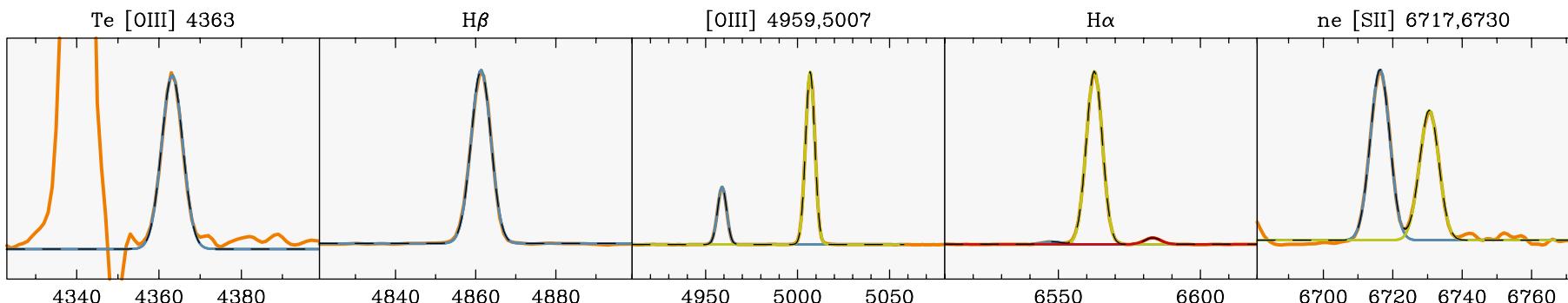
# 3.2. GP 004054

Green Pea example from Amorín et al. 2012



# 3.2. GP 004054

Green Pea example from Amorín et al. 2012

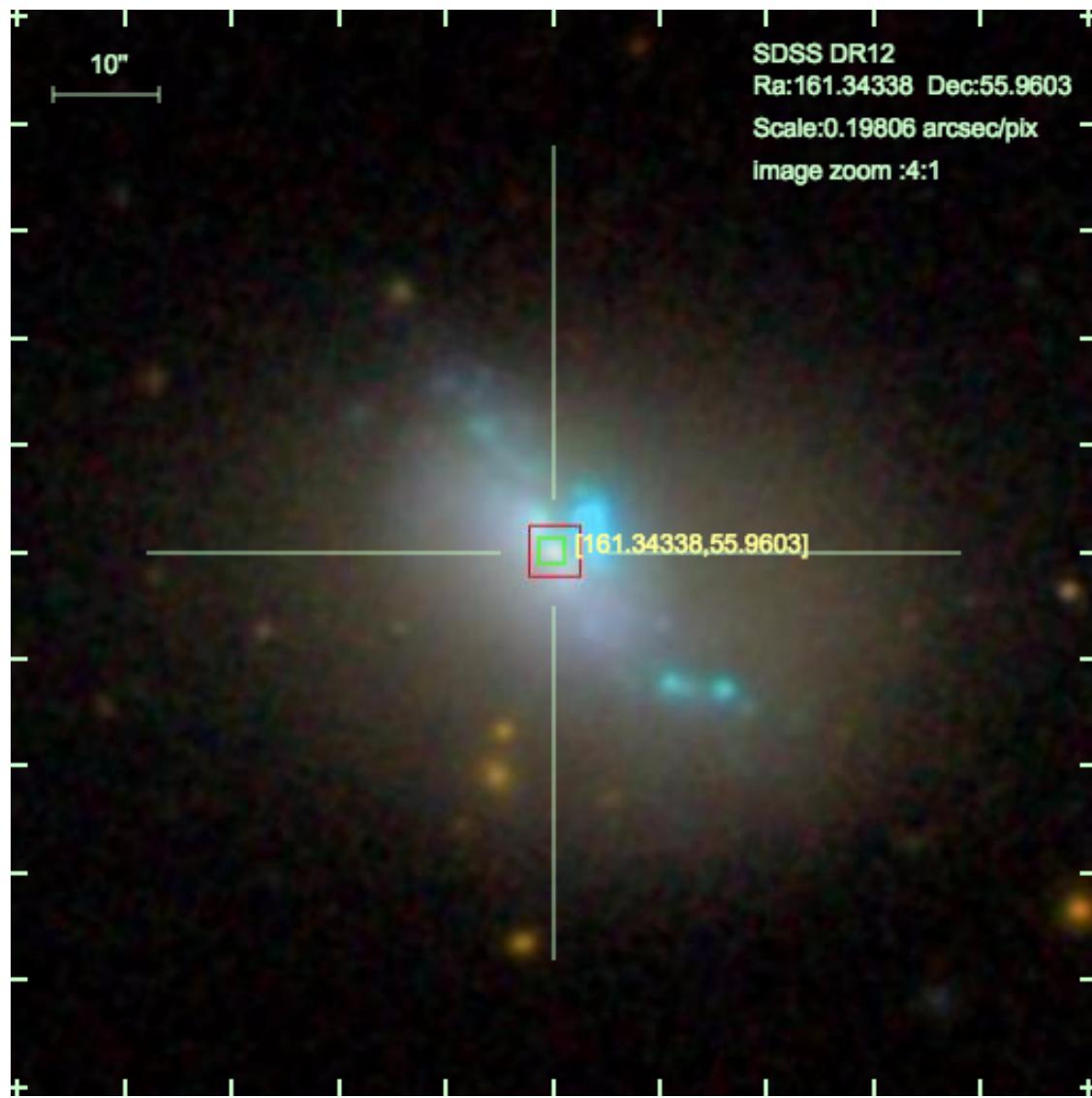


$$\begin{aligned}
 \langle t \rangle_L &= +0.366 \pm 0.0090 \text{ [Gyr]} \\
 \langle z \rangle_L &= +0.350 \pm 0.0219 \text{ [Z}_\odot\text{]} \\
 \langle \log t \rangle_L &= +7.643 \pm 0.0046 \text{ [yr]} \\
 \log \langle z \rangle_L &= -0.456 \pm 0.0291 \text{ [Z}_\odot\text{]} \\
 \log M^e &= +9.173 \pm 0.0194 \text{ [M}_\odot\text{]} \\
 \log M^p &= +8.924 \pm 0.0194 \text{ [M}_\odot\text{]} \\
 \log M_{\text{pAGB}}^e &= +8.910 \pm 0.0461 \text{ [M}_\odot\text{]} \\
 \log M_{\text{pAGB}}^p &= +8.615 \pm 0.0456 \text{ [M}_\odot\text{]}
 \end{aligned}$$

$$\begin{aligned}
 \langle t \rangle_M &= +6.047 \pm 0.5097 \text{ [Gyr]} \\
 \langle z \rangle_M &= +0.857 \pm 0.0600 \text{ [Z}_\odot\text{]} \\
 \langle \log t \rangle_M &= +9.241 \pm 0.0477 \text{ [yr]} \\
 \log \langle z \rangle_M &= -0.067 \pm 0.0289 \text{ [Z}_\odot\text{]} \\
 \log Q_H &= +54.076 \pm 0.0006 \text{ [photons/s]} \\
 \log Q_{\text{HeI}} &= +53.582 \pm 0.4948 \text{ [photons/s]} \\
 \log Q_{\text{HeII}} &= +50.360 \pm 3.7010 \text{ [photons/s]} \\
 \log \mathcal{L}_{\text{gal}} &= +6.039 \pm 0.0015 \text{ [L}_\odot\text{]}
 \end{aligned}$$

$$\begin{aligned}
 F_{H\alpha}^{\text{obs}} &= 277.956 \pm 1.014 \\
 F_{H\alpha}^{\text{mod}} &= 280.215 \pm 0.263 \\
 F_{H\beta}^{\text{obs}} &= 77.614 \pm 0.404 \\
 F_{H\beta}^{\text{mod}} &= 76.015 \pm 0.071 \\
 EW_{H\alpha}^{\text{obs}} &= 913.43 \pm 33.88 \\
 EW_{H\alpha}^{\text{mod}} &= 955.44 \pm 1.84 \\
 EW_{H\beta}^{\text{obs}} &= 178.94 \pm 2.78 \\
 EW_{H\beta}^{\text{mod}} &= 186.77 \pm 0.27
 \end{aligned}$$

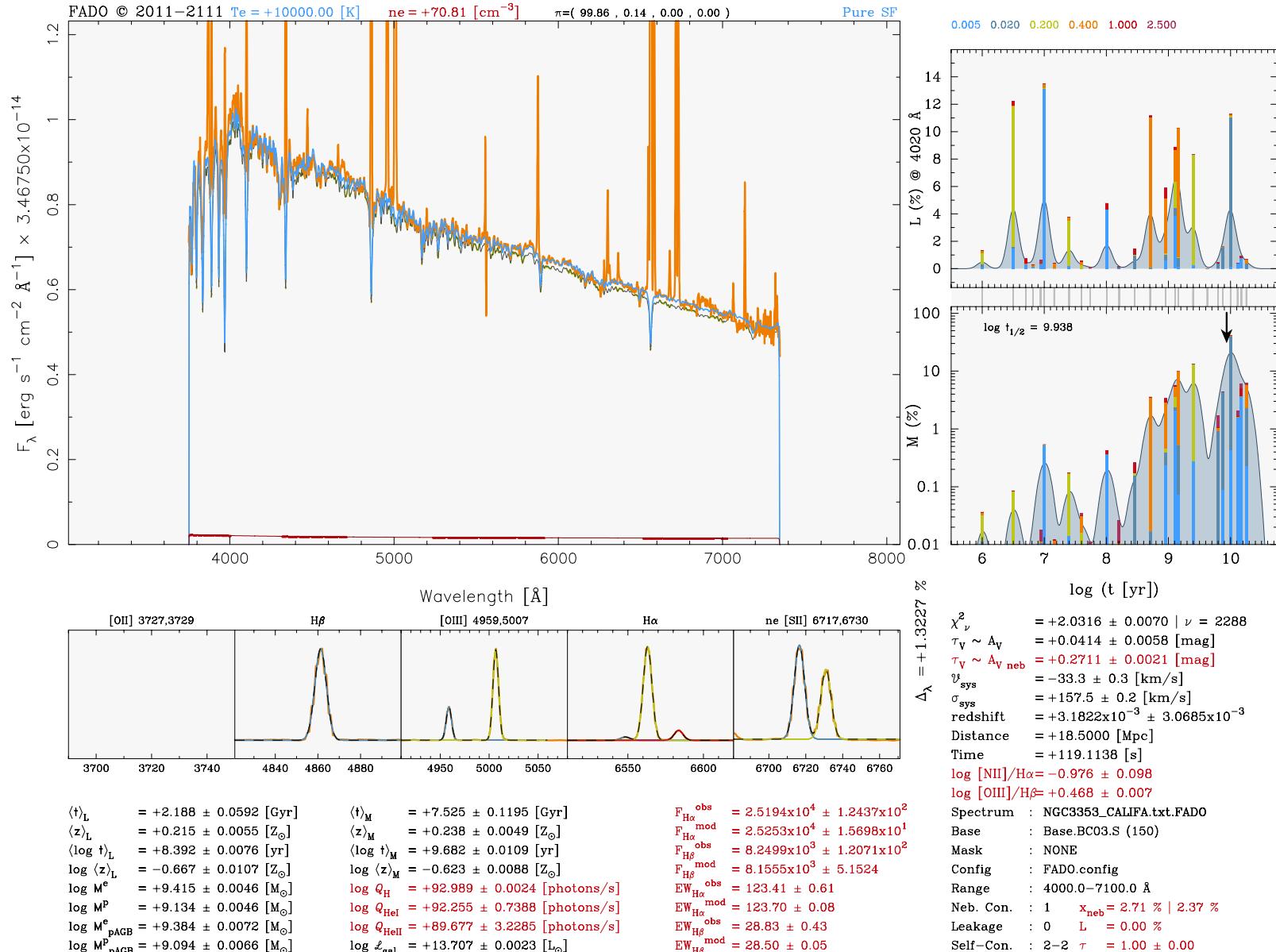
## 3.2 CALIFA MRK 35 / HARO 3

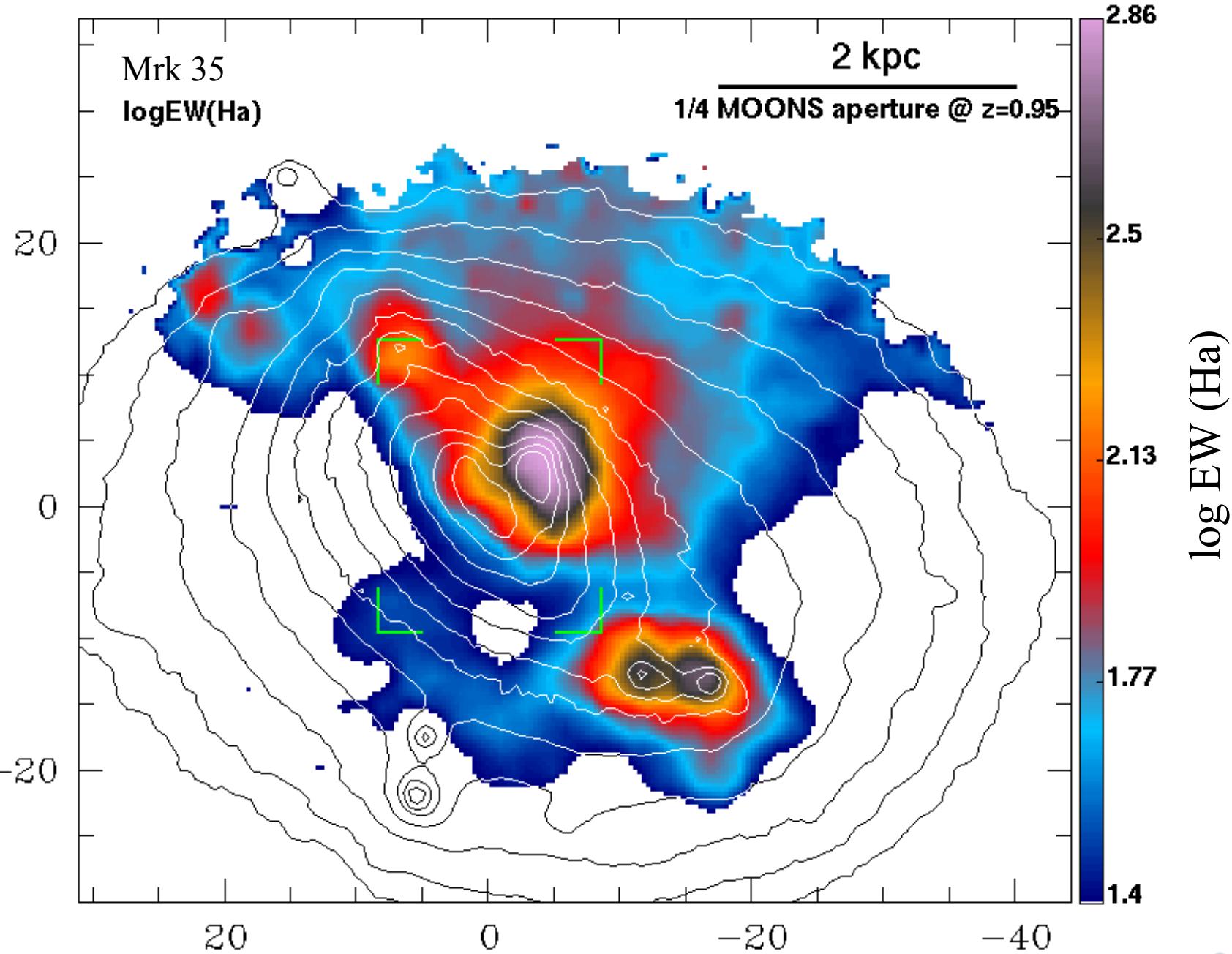


Preliminary results

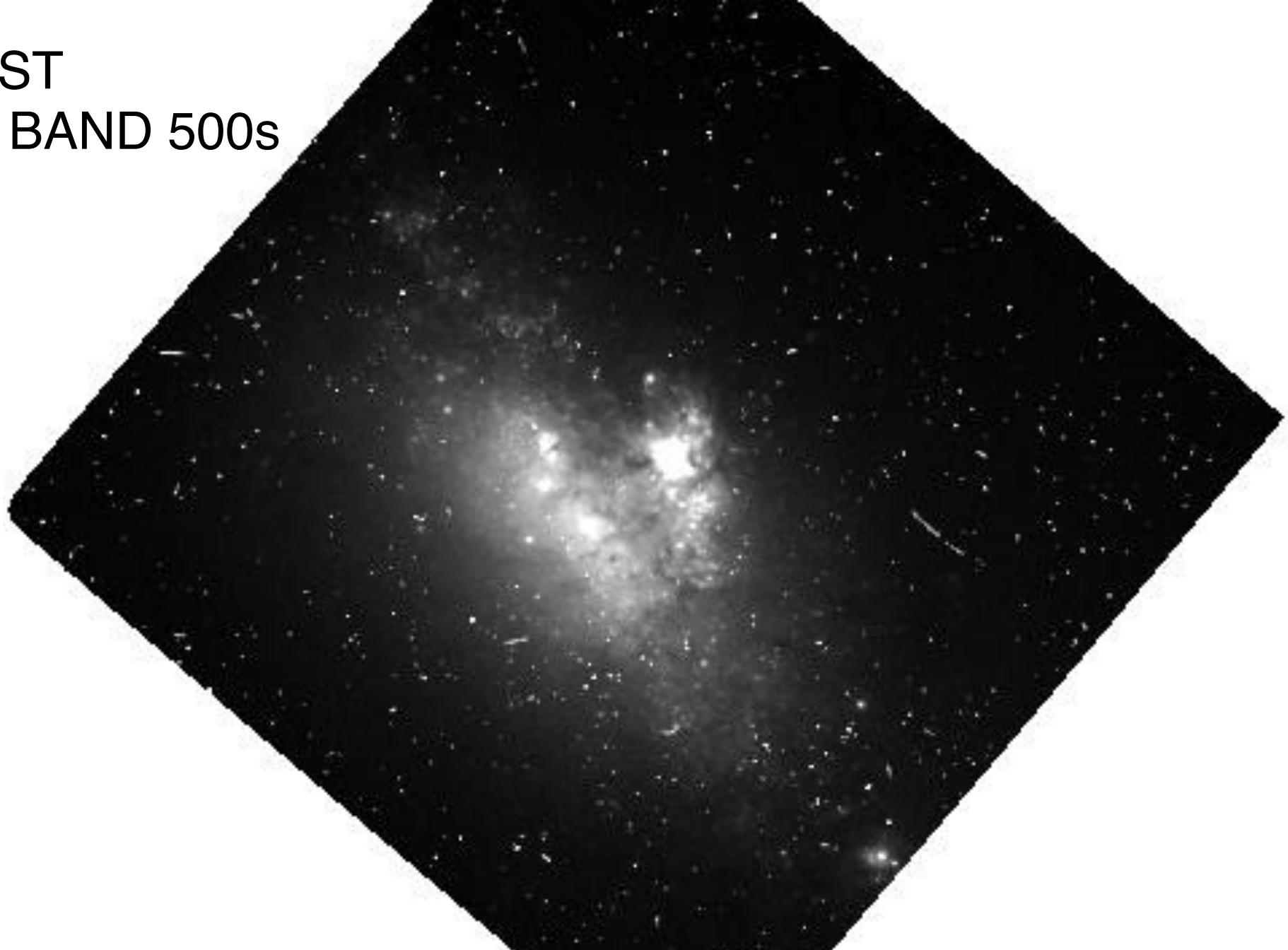
An article to be presented in  
Gomes & Papaderos in prep.

# INTEGRATED spectrum from CALIFA

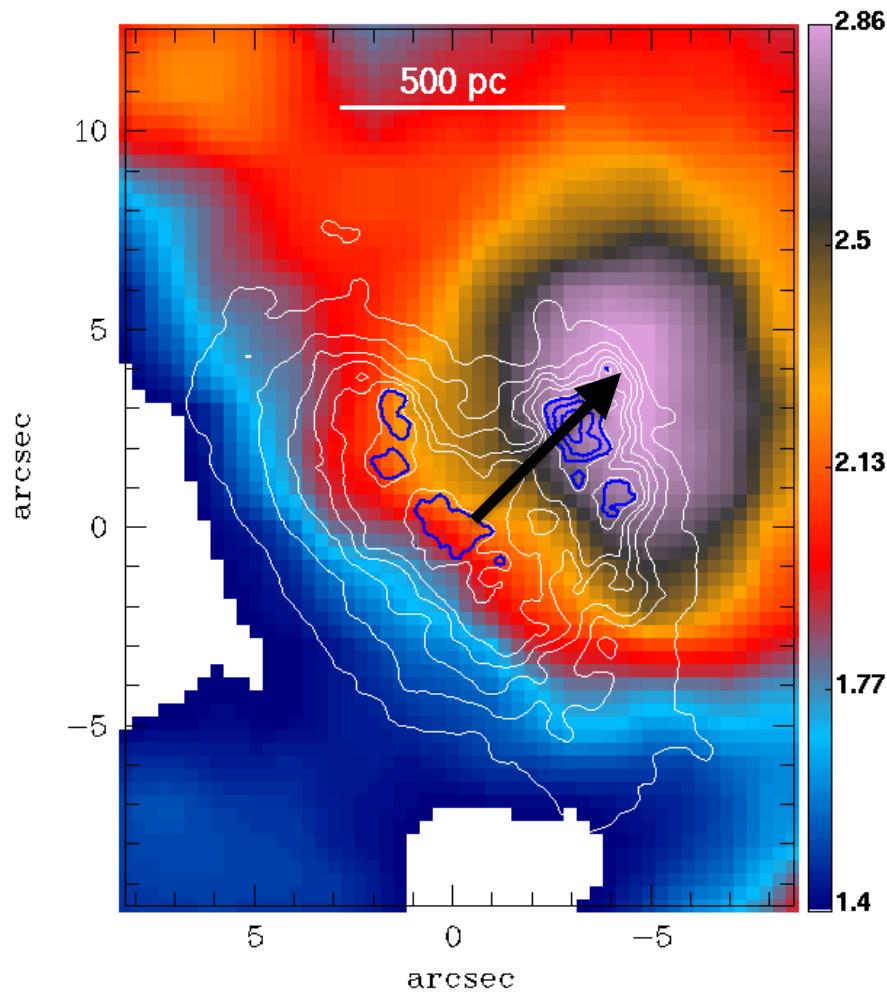




HST  
V BAND 500s



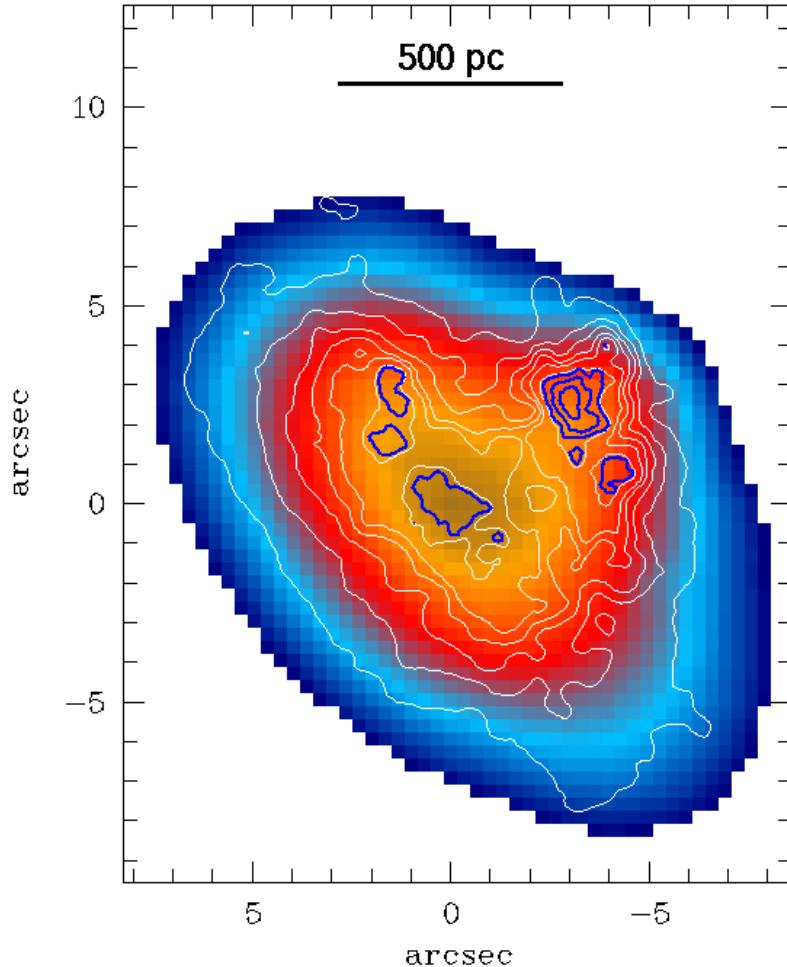
# HST V BAND 500s



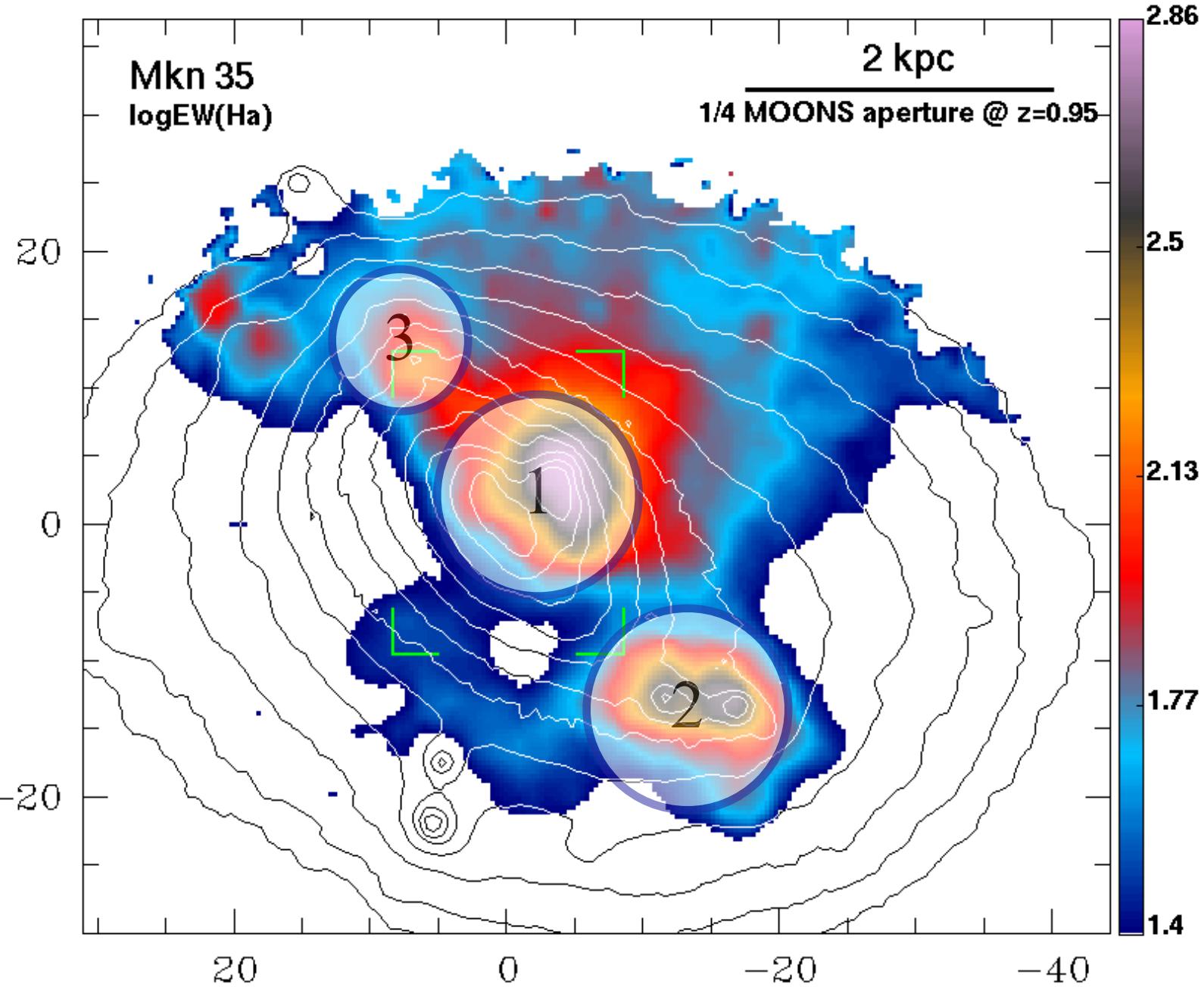
Non-cospatiality  
between  
stars and gas

# Simple Test

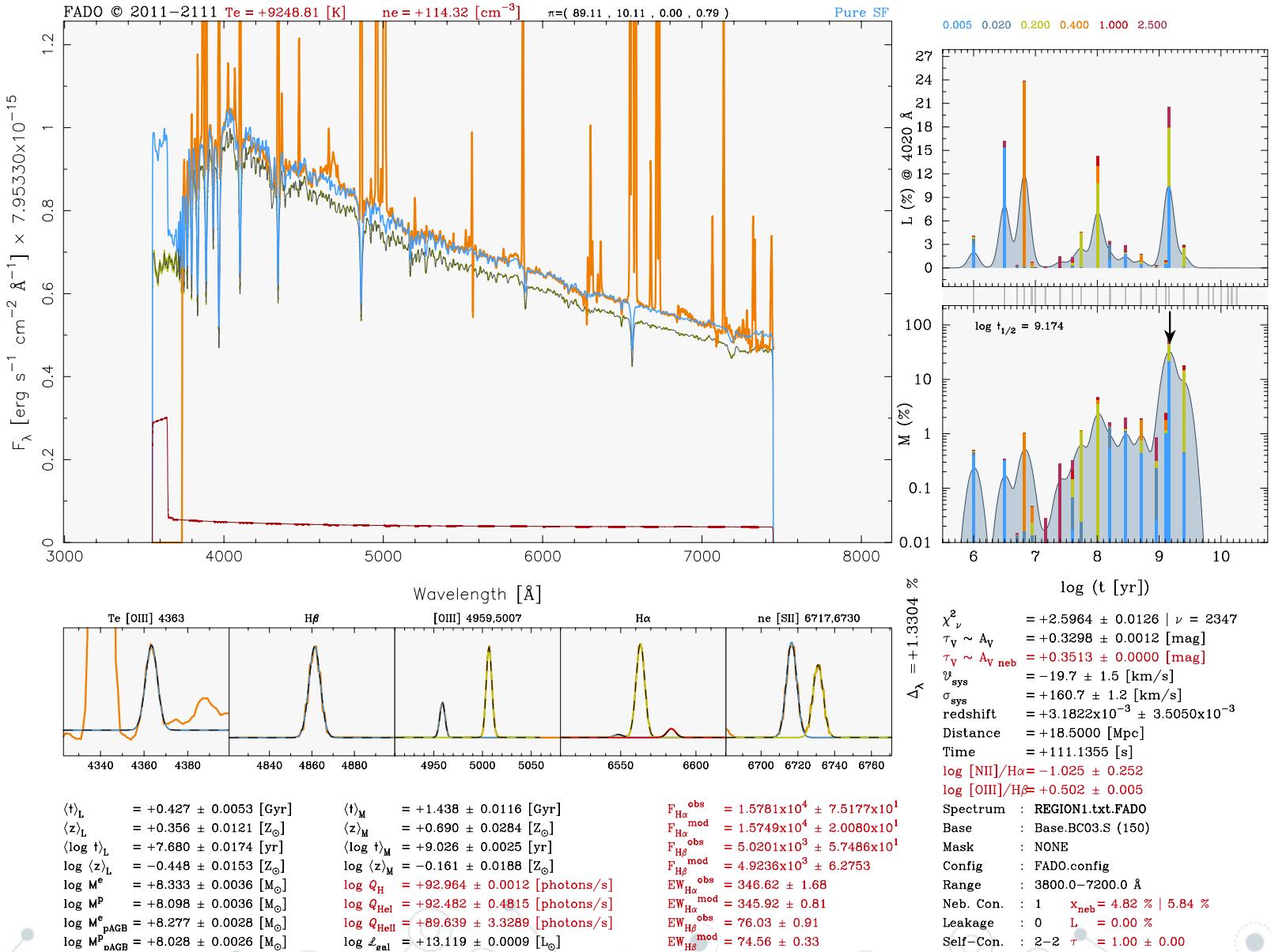
0.1" per pixel crossmatched astrometrically precision 0.1-0.15"



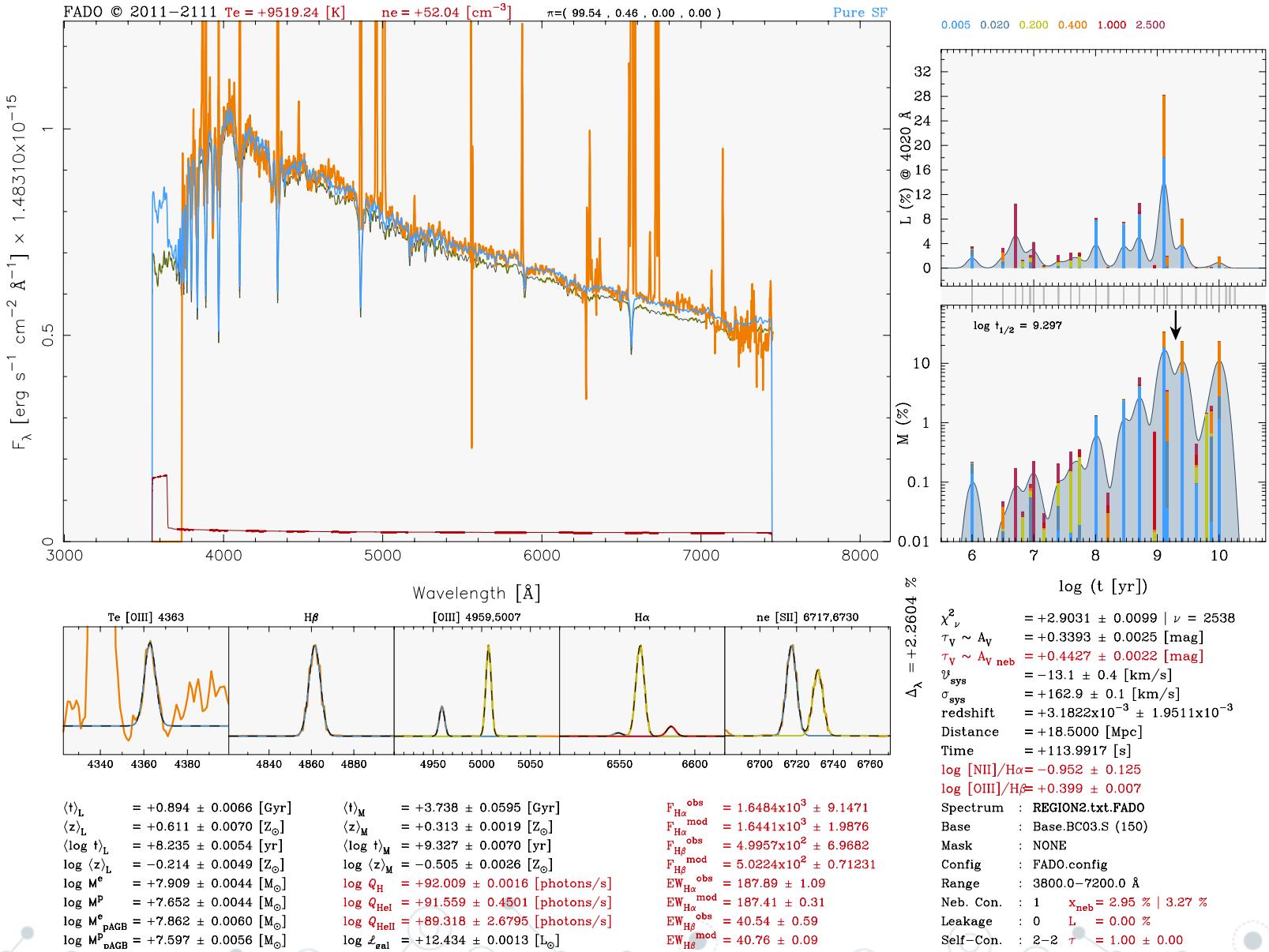
~6490-6590 Å  
Cont. CALIFA



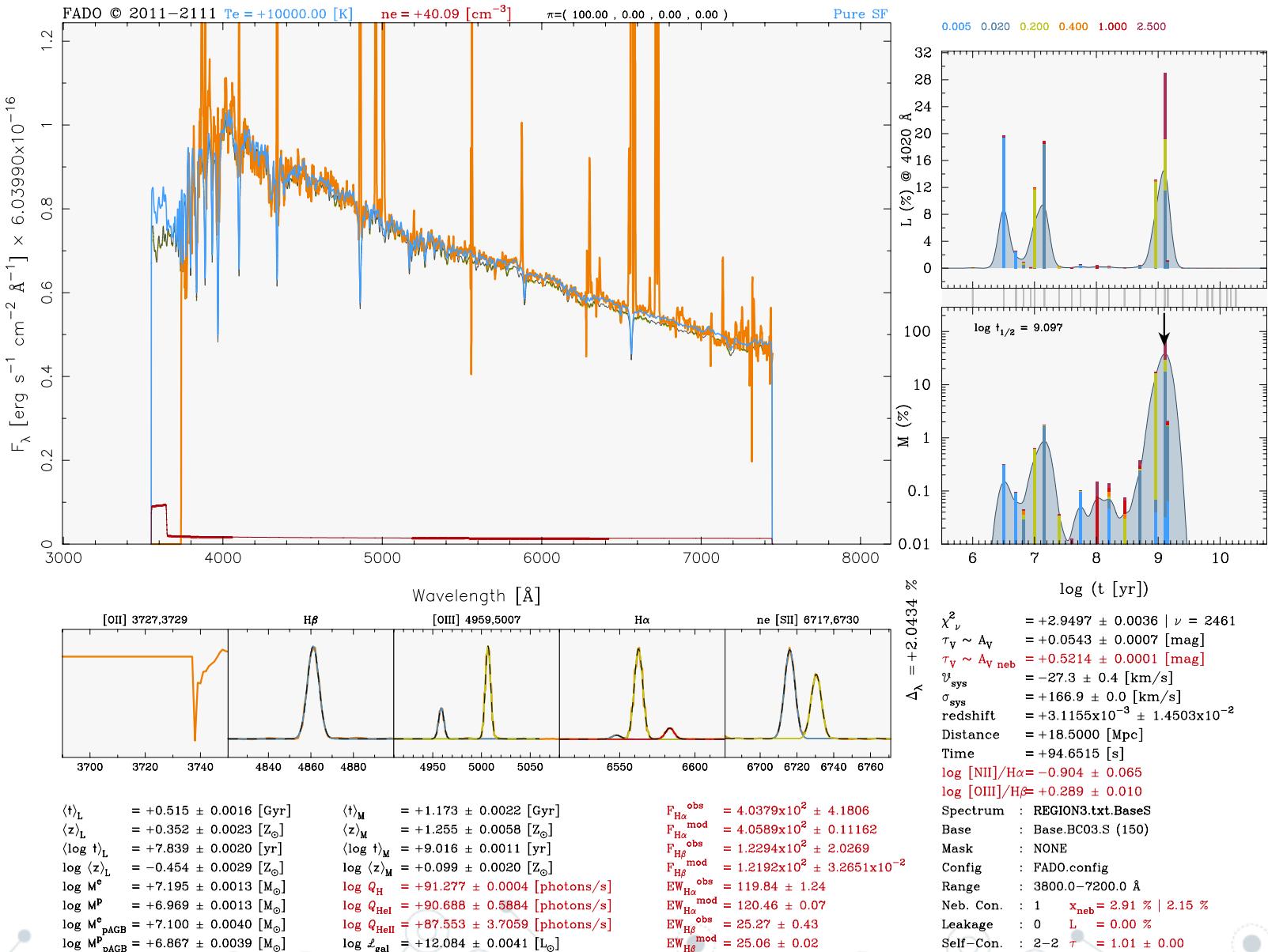
# REGION 1



# REGION 2



# REGION 3



# Summarizing - Comparison

## REGION 1

$\text{EW} \sim 345 \text{ \AA}$   
 $T_e = 9248 \text{ K}$   
 $n_e = 114 \text{ cm}^{-3}$

$\log M_\star = 8.741$   
 $\log M_\star = 8.098$

$\langle t_\star \rangle_L = 3.27$   
 $\langle t_\star \rangle_L = 0.43$

$\langle t_\star \rangle_M = 11.43$   
 $\langle t_\star \rangle_M = 1.438$

## REGION 2

$\text{EW} \sim 188 \text{ \AA}$   
 $T_e = 9519 \text{ K}$   
 $n_e = 52 \text{ cm}^{-3}$

$\log M_\star = 8.048$   
 $\log M_\star = 7.652$

$\langle t_\star \rangle_L = 4.28$   
 $\langle t_\star \rangle_L = 0.89$

$\langle t_\star \rangle_M = 11.35$   
 $\langle t_\star \rangle_M = 3.738$

## REGION 3

$\text{EW} \sim 120 \text{ \AA}$   
 $T_e = 10000 \text{ K}$   
 $n_e = 40 \text{ cm}^{-3}$

$\log M_\star = 7.558$   
 $\log M_\star = 6.969$

$\langle t_\star \rangle_L = 3.41$   
 $\langle t_\star \rangle_L = 0.52$

$\langle t_\star \rangle_M = 13.66$   
 $\langle t_\star \rangle_M = 1.173$

## Integrated

$\text{EW} \sim 120 \text{ \AA}$   
 $T_e = 10000 \text{ K}$   
 $n_e = 70 \text{ cm}^{-3}$

$\log M_\star = 9.968$   
 $\log M_\star = 9.679$

$\langle t_\star \rangle_L = 4.19$   
 $\langle t_\star \rangle_L = 2.18$

$\langle t_\star \rangle_M = 10.49$   
 $\langle t_\star \rangle_M = 7.525$

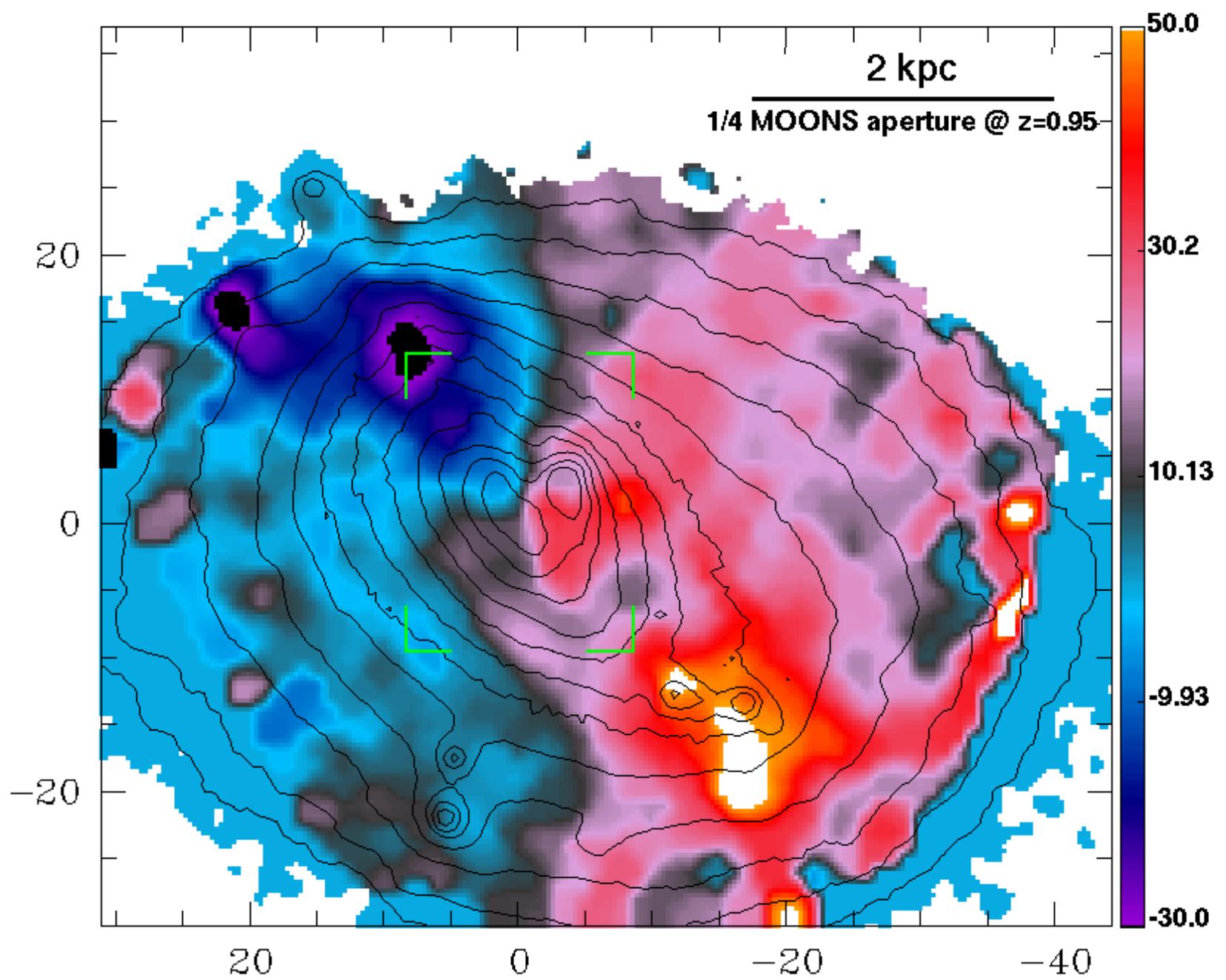
Purely stellar fitting biases

# 4. Final Remarks

## Fitting Analysis using Differential evolution Optimization

- Examples representative of the peak of the cosmic SFR;
- Non-cospatiality shown in IFU data for MRK 35, care with self-consistent modeling;
- Predicted overestimation of the stellar masses confirmed on real data when using purely stellar models (MRK 35);
- Overestimation of the mean stellar ages when using purely stellar models;





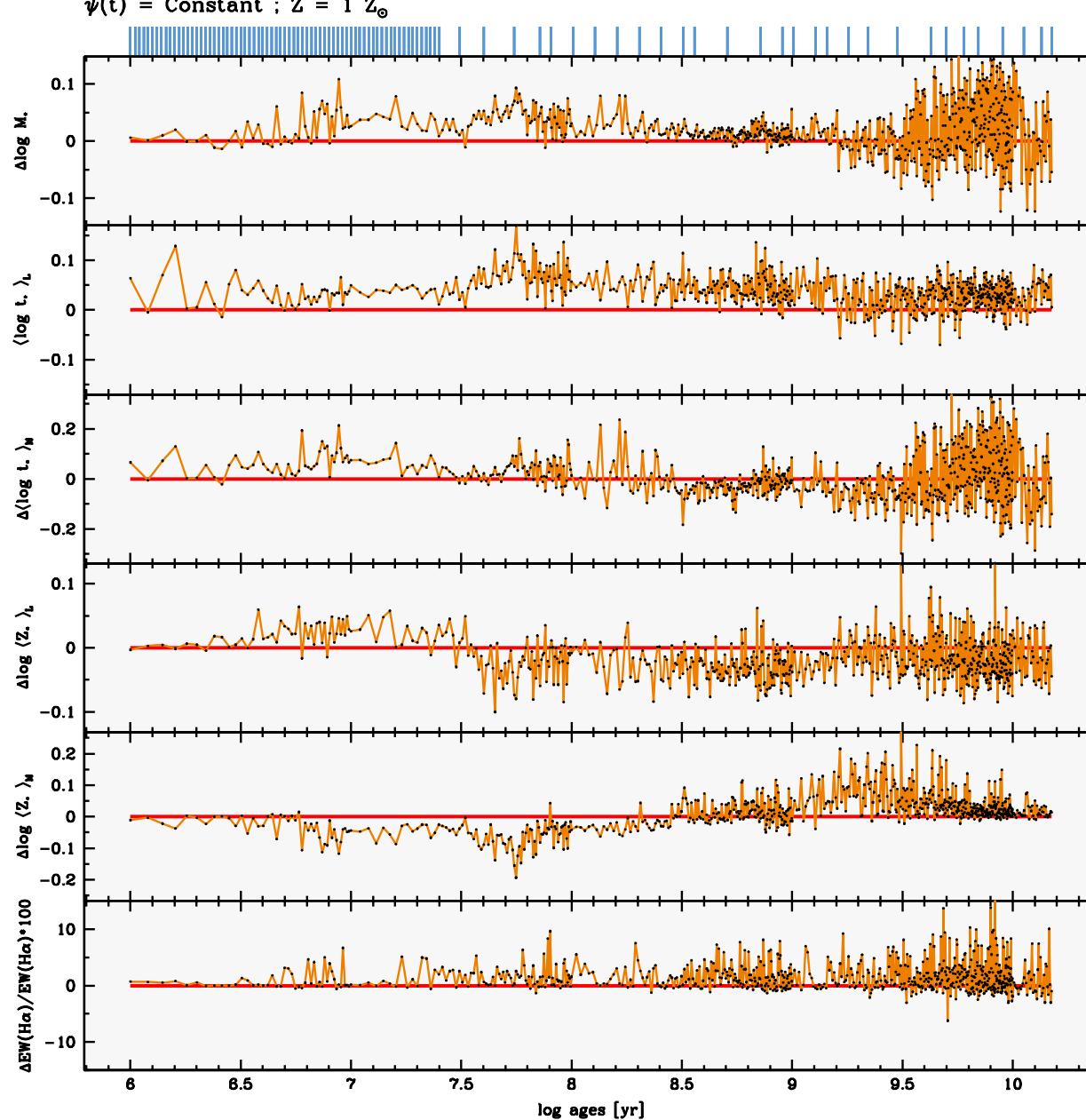


## Population Synthesis

### OUTPUT - INPUT

EW % Met M Met L Age M Age L Mass

$$\psi(t) = \text{Constant} ; Z = 1 Z_{\odot}$$



Mass  
~0.1 dex

Age L  
~0.1 dex

Age M  
~0.2 dex

Met L  
~0.1 dex

Met M  
~0.2 dex

EW %  
~ 10 %