

Production and potential escape of Lyman radiation in Extreme Emission-Line Galaxies from DESI

RICARDO AMORÍN
(IAA, GRANADA)



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Production and potential escape of Lyman radiation in Extreme Emission-Line Galaxies from DESI

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MAIN CONTRIBUTORS

J.A. Fernandez-Ontiveros, A. Giménez-Alcázar, J.M. Vílchez, L. Bonatto, B. Perez-Díaz, E. Pérez-Montero, A. Hernán-Caballero, A. Lumbreras-Calle, P. Papaderos

AGENDA

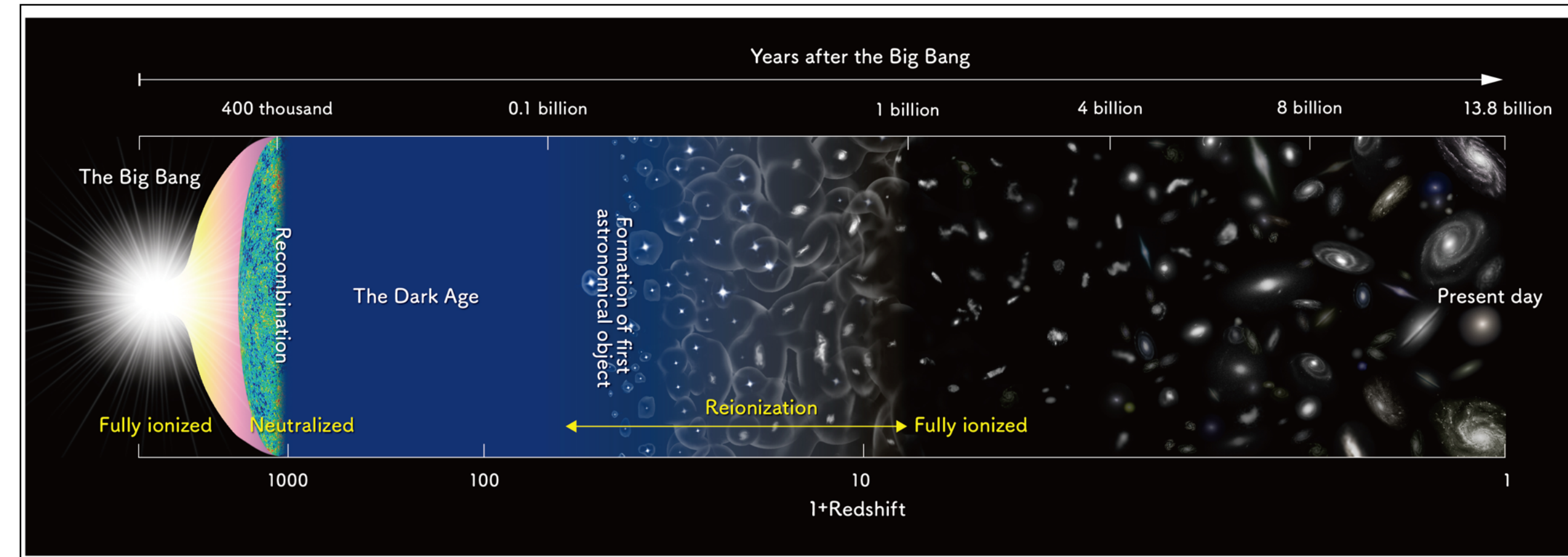
- * **INTRO: KEY QUESTIONS & DEFINITIONS:** Extreme emission-line galaxies (EELGs) through cosmic time
- * **OUR STUDY:**
 - **XTREM:** A large statistically significant sample of EELGs at $z < 1$. Properties and diagnostics
 - Selection of candidates to strong Ly α and LyC emitters:
 - Prediction from Cloudy models
 - Implications for high- z galaxies
 - **CONCLUSIONS AND FUTURE**

Key questions

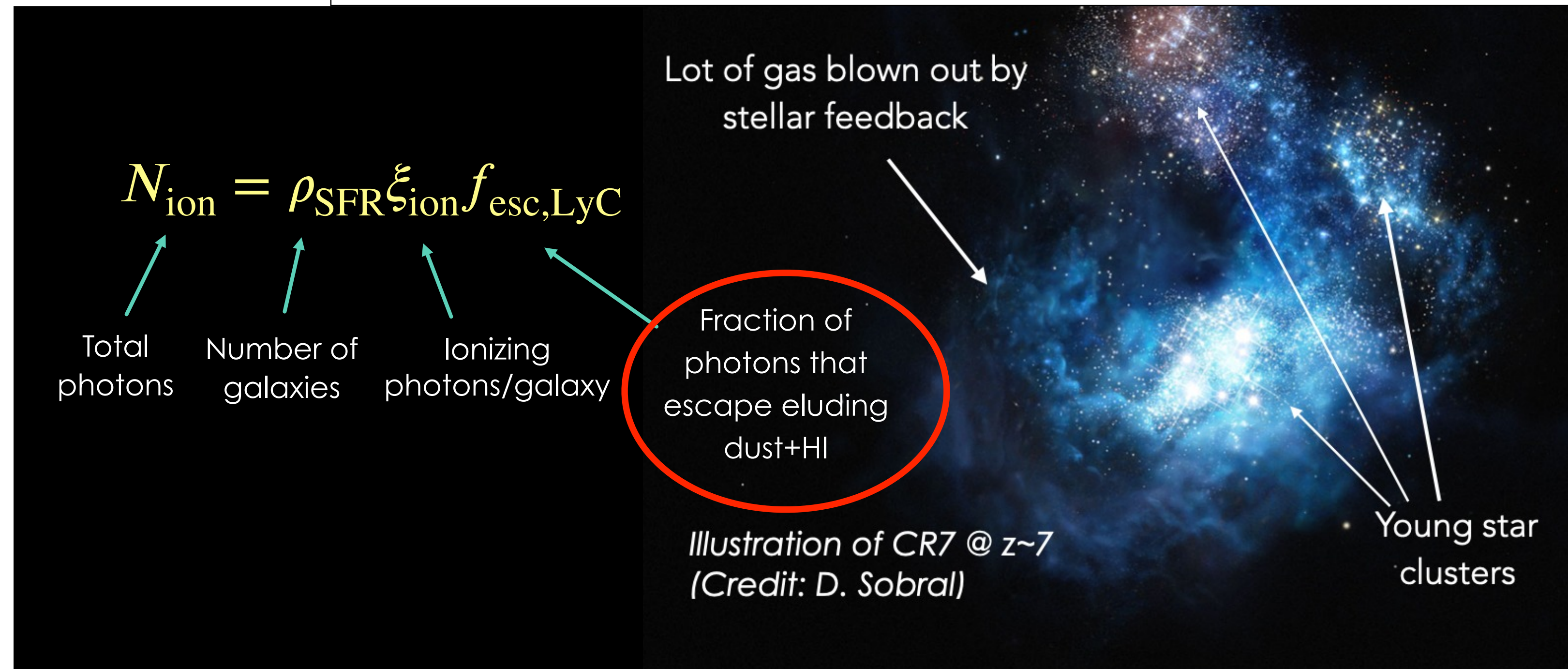
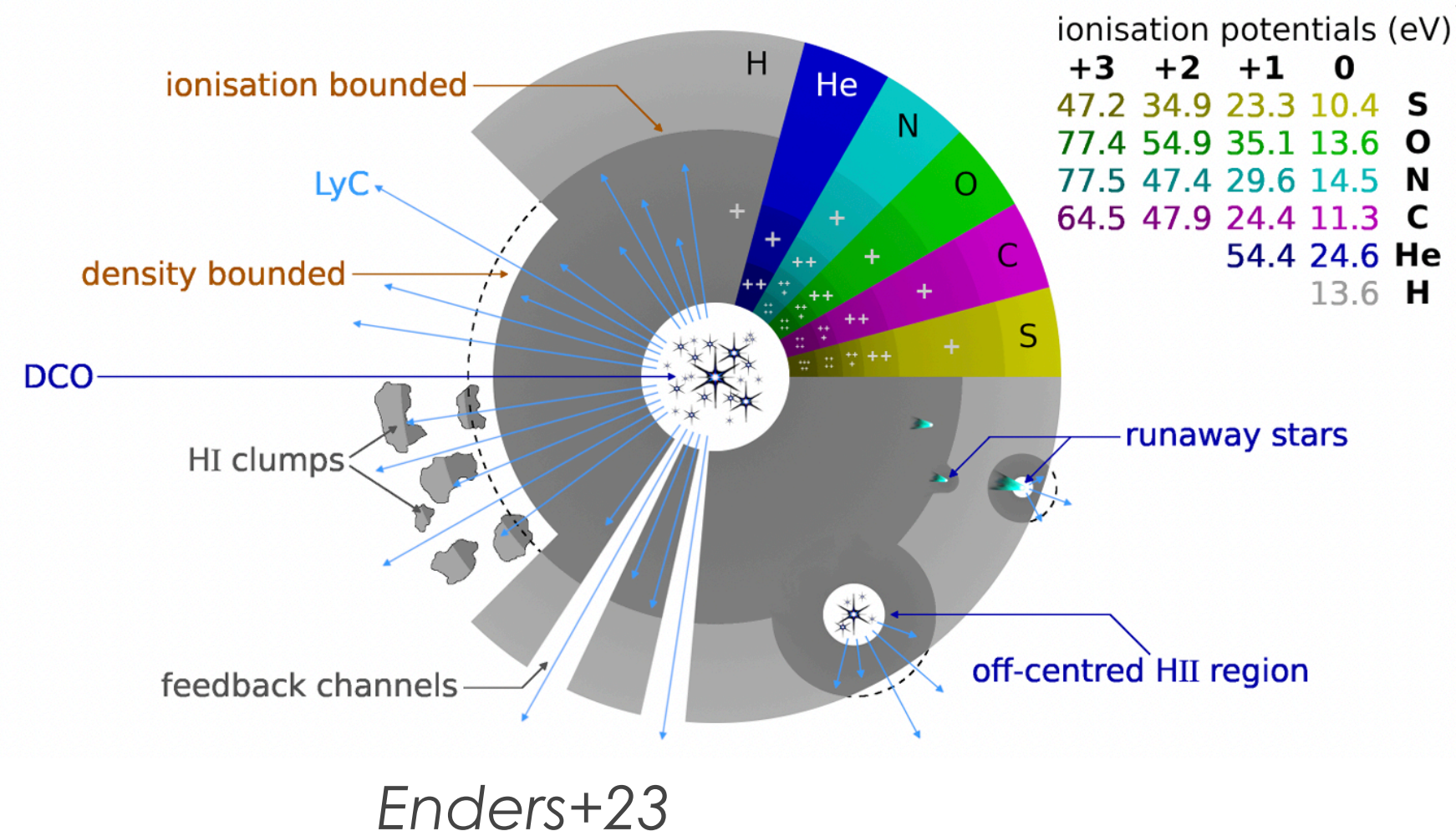
Escaping from galactic labyrinths

How do galaxies reionized the universe at $z > 6$?
How LyC escape from galaxies?

What physical properties and mechanisms favor
Lyman photon production and escape?



Simple models: Nakajima & Ouchi 13,
Zackrisson+13; Jaskot & Oey 13, Ramambason+20

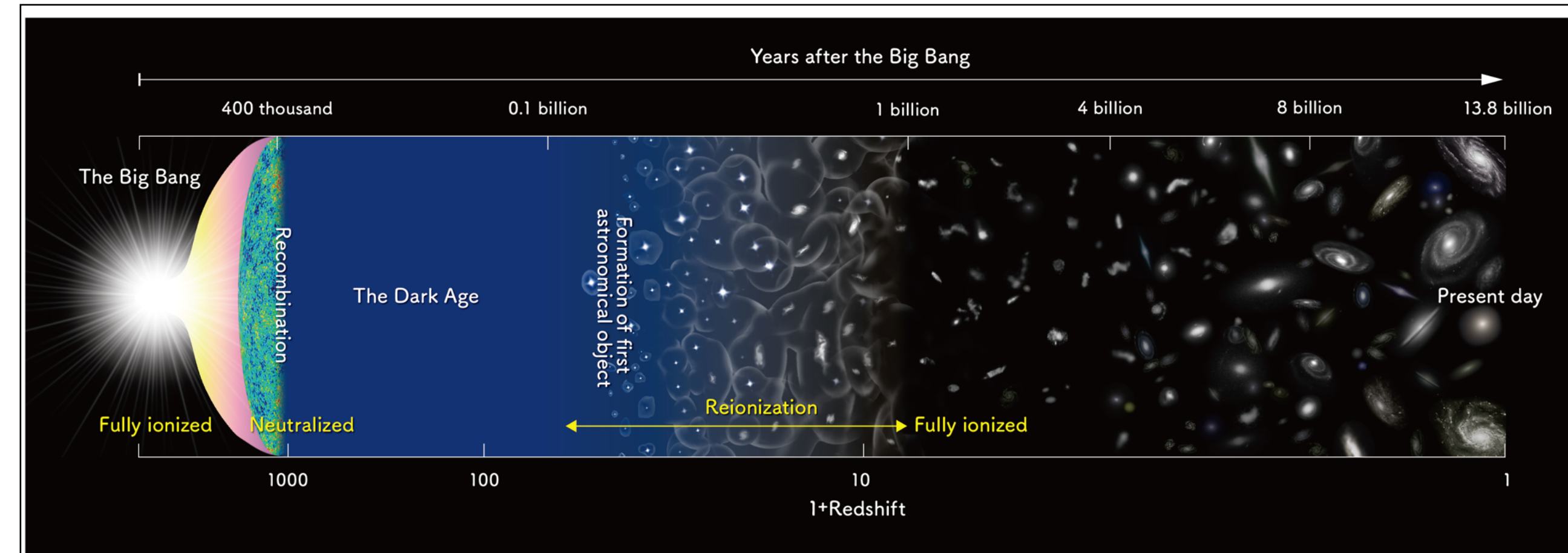


Key questions

Escaping from galactic labyrinths

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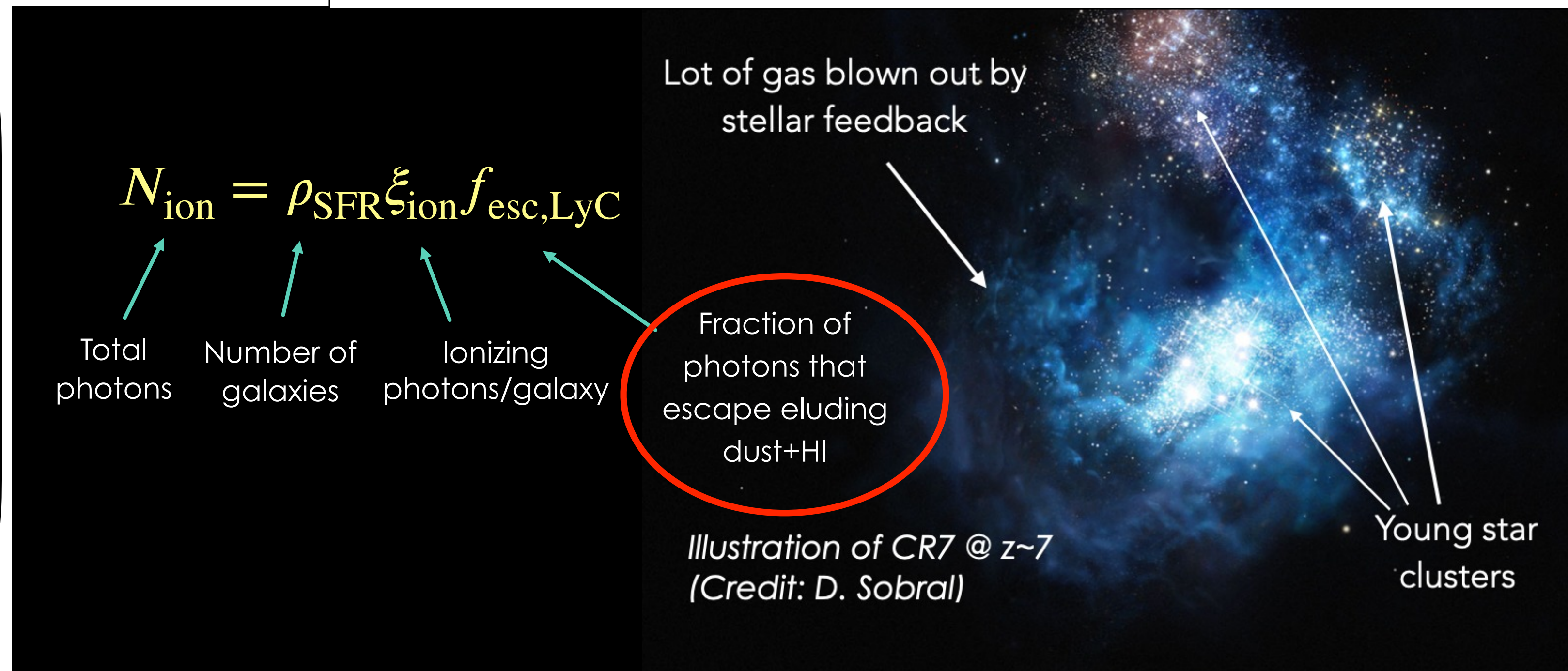


PROBLEM

At $z > 4$, the strong drop-down of the IGM transmission makes impossible the *direct* detection of the LyC photons responsible for reionization, even for JWST or ELTs

THE LOW-Z ANALOG APPROACH

At $z < 4$, LyC is directly observable with HST. Probing well-characterized analogs of reionization galaxies (LAEs, LBGs) may help to provide new insight on these questions



Key questions

Escaping from galactic labyrinths

What physical properties and mechanisms favor
Lyman photon production and escape?

THE LOW-Z ANALOG APPROACH: MAIN RESULTS

From super recent review of Anne Jaskot, ARA&A, 2025

See also e.g. Izotov+18, Flury+22, Saldana-Lopez+22, Chisholm+22

★ Growing samples of LyC emitting samples, especially at $z \sim 0.3$ and $z \sim 2-3$ from HST surveys and detailed multiwavelength observations of smaller samples

e.g. Low-z Lyman Continuum Survey (Flury+22), LaCOS (La Reste+25), Steidel+18, Siana+15, Vanzella+16, Rivera-Thorsen+19, Saha+20, Marques-Chaves+24,...

★ LyC emitters are diverse and multiple properties correlate with LyC escape, the most important are:

Neutral gas absorption

Dust attenuation

Nebular ionization

Concentrated star formation —> Feedback is key

(See e.g. Izotov+18, Verhamme+16; Flury+22b, Saldana-Lopez+22, Chisholm+22, Leclercq+24, Bait+24, Jaskot+24, Mascia+25)

★ Radiative feedback for the youngest starbursts with the highest LyC escape

★ SNe feedback also contributes and is possible crucial in not so young bursts

(See e.g. Komarova+19, Amorín+24, Bait+24, Jecmen & Oey 24; Carr+25)

★ Indirect diagnostics (e.g. O32, Lya, etc..) are promising but need to understand how the properties of LyC emitting galaxies evolve from low to high redshifts

Our favourite galactic labyrinth: Extreme emission line galaxies

Definitions and science motivations

Strong (and possibly short) episodes of ongoing star formation.

High equivalent widths (EWs $\gtrsim 200$ -2000Å in [OIII]5007 and H α) — Unusually large specific star formation rates (sSFRs) up to 10-100 Gyr⁻¹ (e.g. van del Wel+11, Amorin+15)

Galaxies with low stellar masses ($\lesssim 10^9 M_{\odot}$), with low metallicities ($\lesssim 20\%$), high ionization conditions and little dust attenuation / extinction—

Extremely rare at low redshifts (Green Pea - Blueberries- HII galaxies - BCD) — but increasingly common towards high-redshifts (e.g. Atek+14, Maseda+17 and others..)

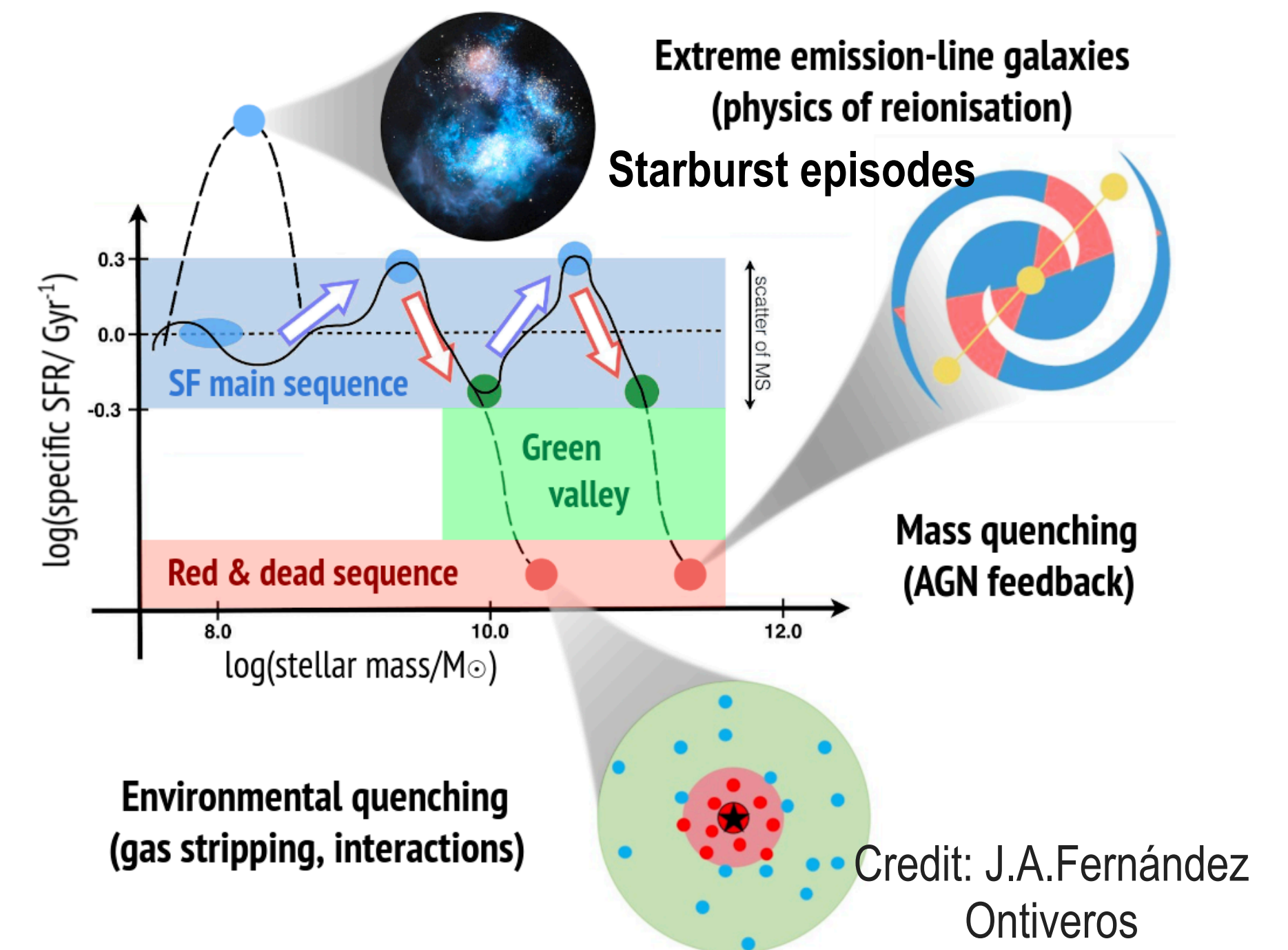
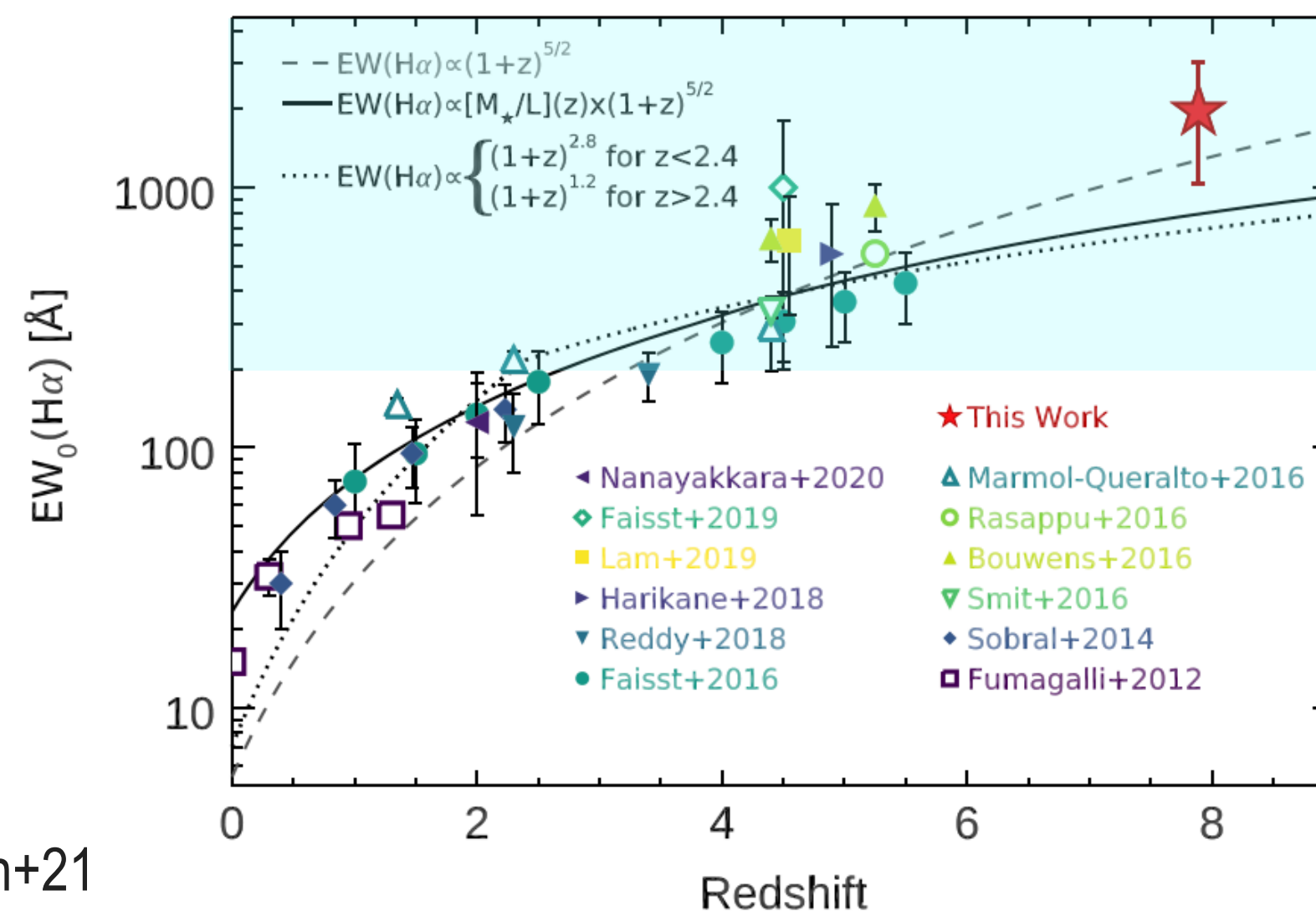
EELGs at $z > 4$ are ubiquitous in JWST surveys conducted so far (e.g Llerena+24; Davis+24; Boyett+24, Atek+24, Trump+23; Cameron+23; Saxena+24, Heintz+24, Matthee+24; etc..)

— Tracers of major phases of galaxy growth in low-mass systems

— Ideal laboratories to study star formation & feedback and chemical evolution

— EELGs are expected to be key contributors to cosmic reionization at $z > 5-6$

— EELGs appear to have similar ISM properties across cosmic time (e.g. Schaerer+22)

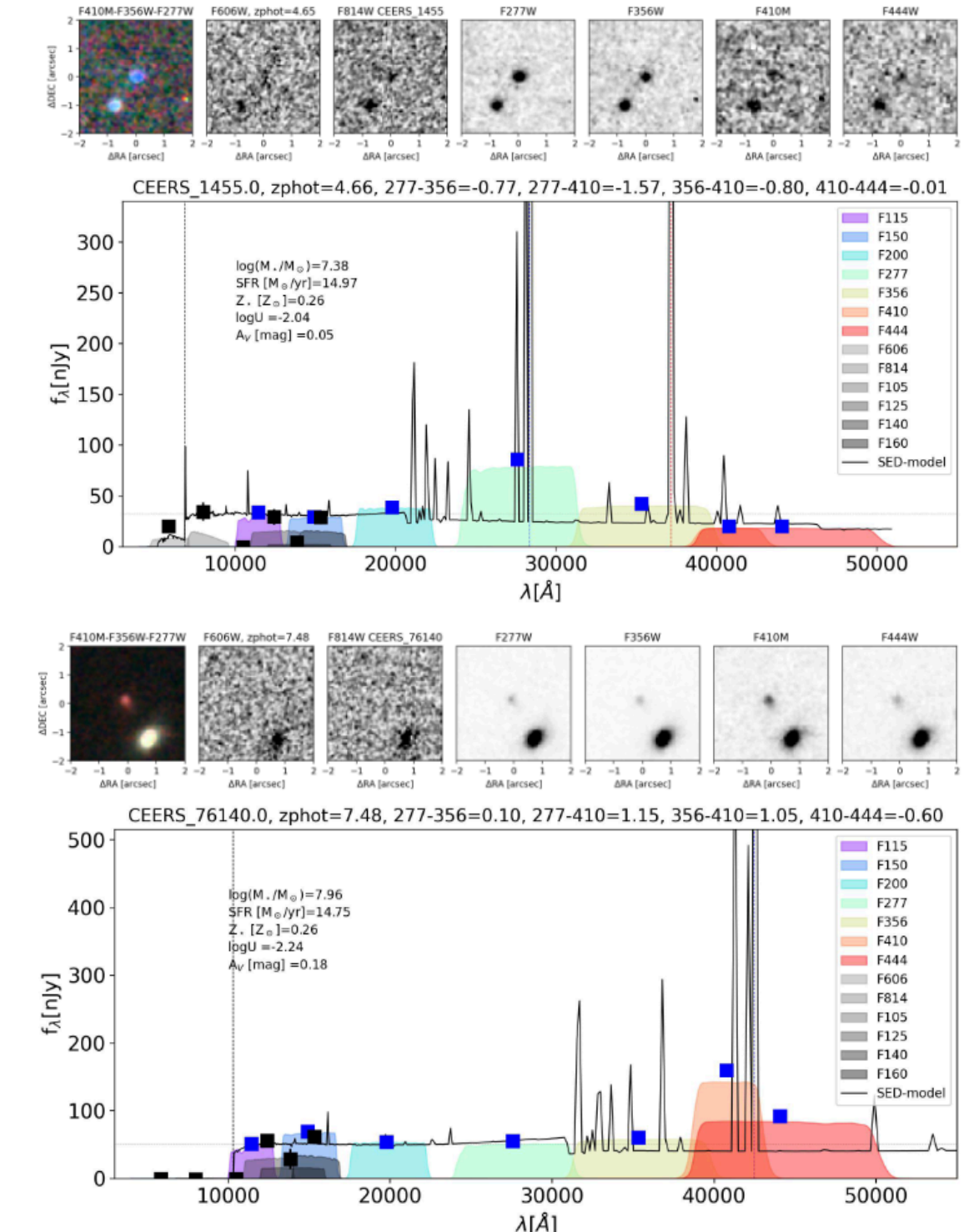
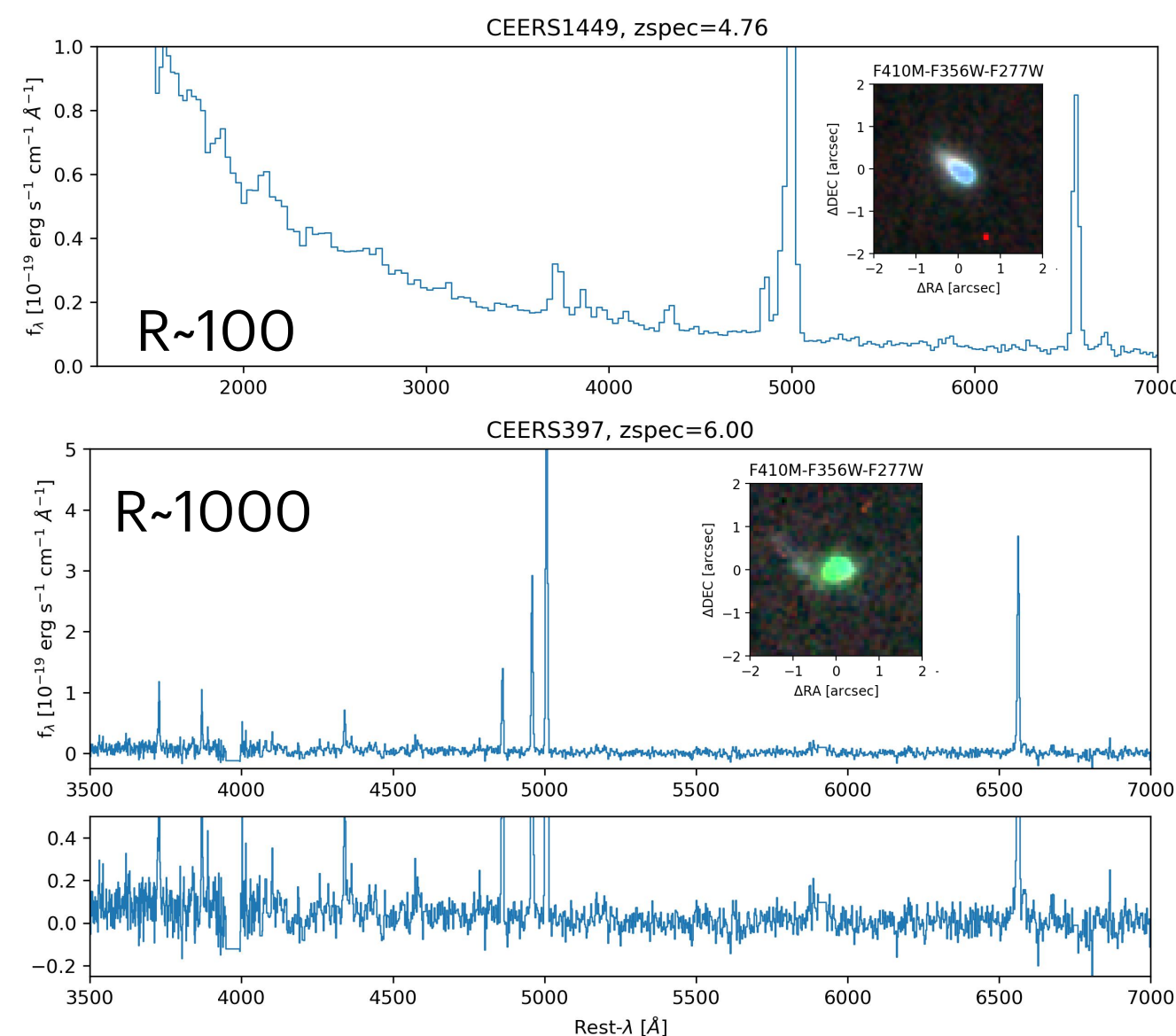


Extreme emission line galaxies

Definitions and science drivers

Many of the searches for EELGs select samples using either **narrow**- (e.g. Sobral+2013; Iglesias-Páramo+2022; Lumbreras-Calle+2022) **broad**- (e.g. van der Wel+2011; Onodera+2020; Kojima+2020; Chen+2023; Davis+2023) or **medium**-band **photometry** (e.g. Cohn+2018; Withers+2023; Simmonds+2023), and **slitless** (e.g. Atek+14; Maseda+2018; Kashino+2023) and **IFU** (e.g. del Moral-Castro+2024) **spectroscopy**.

Now feasible up from $z \sim 2$ to $z \sim 12$ with JWST



EELGs $z \sim 4-9$ from JWST NIRCам & NIRSрec in CEERS
 Llerena, Amorín & CEERS team (A&A, 2024)

Large samples are required to characterize EELG population and understand their physical properties at different redshifts

XTREM-DESI: EELG selection from ASK classification

Automatic Spectroscopic K-means clustering using EDR spectra

Inspired in the works by Sanchez Almeida et al. (2010, 2011, 2012) for SDSS-DR7 ASK spectral classification leading to a large sample of 2000 EELGs by Pérez-Montero, Amorín+2021

1. Dataset selection and pre-processing: 2M spectra; ~550k Galaxy spectra ($z < 0.96$)

2. Initialization method of ASK classification (250k spectra; $z < 0.25$)

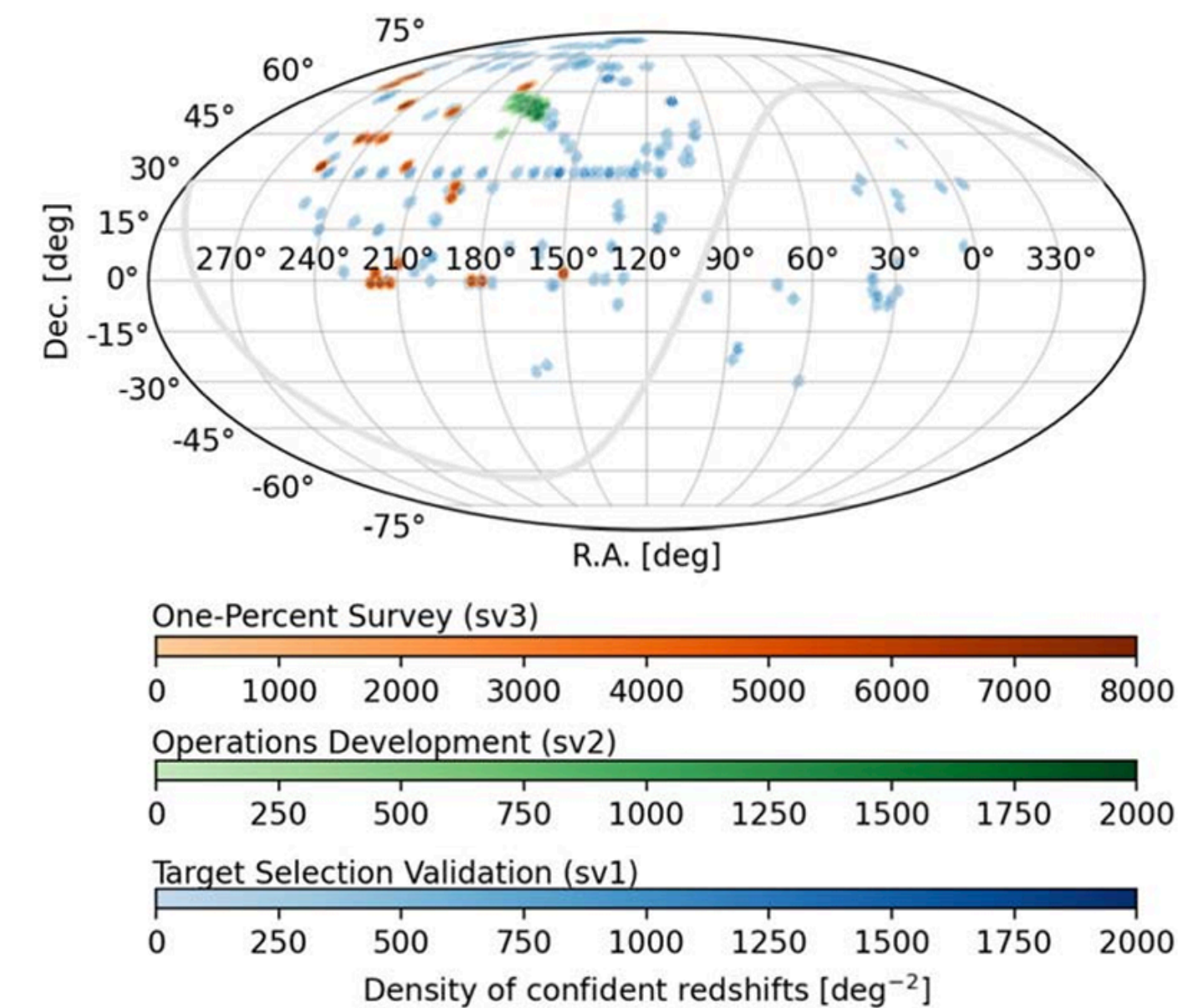
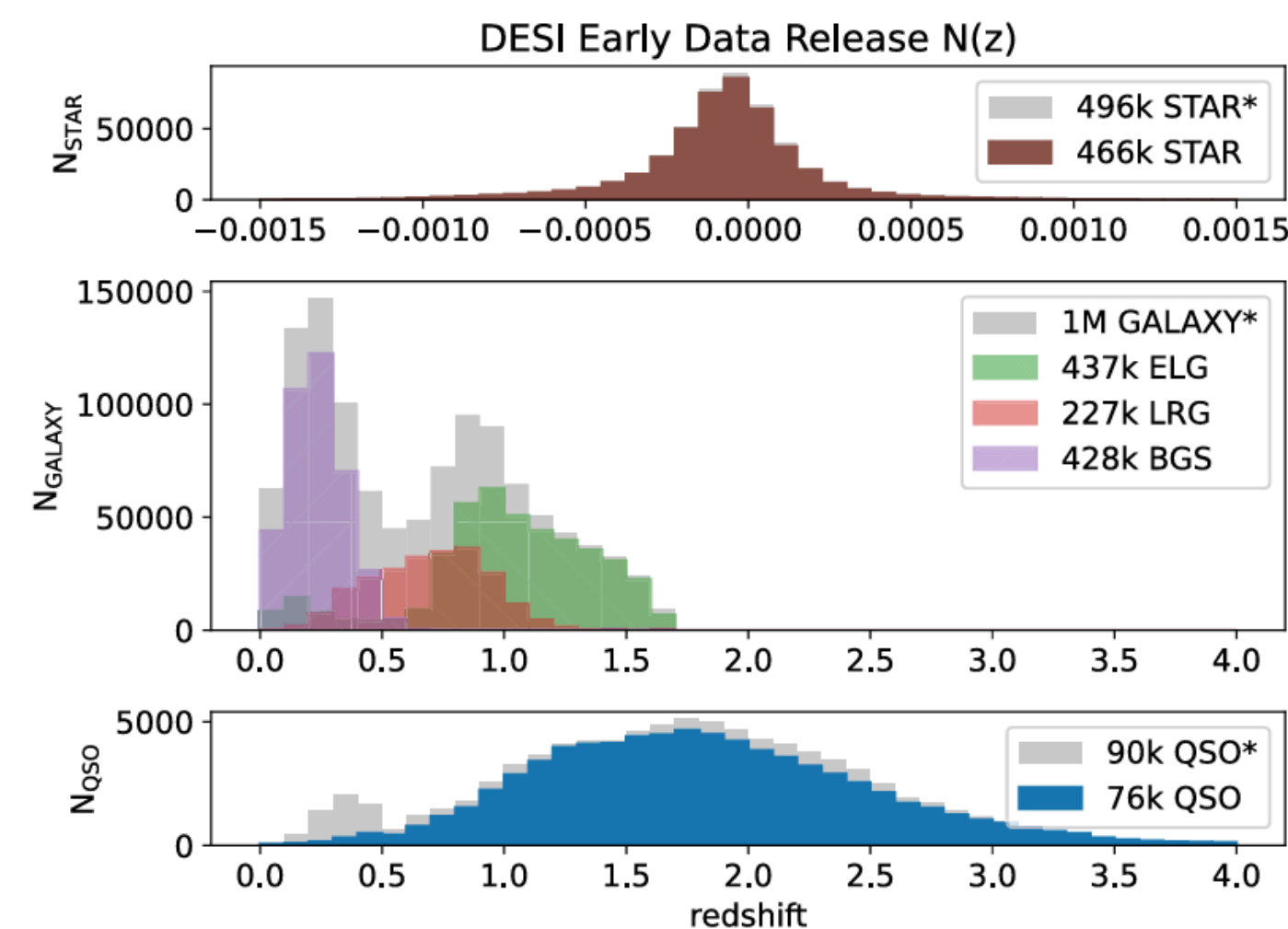
3. ASK classification using initial centroids as starting centers of classes

4. Quality assignation: assigning several classes to each galaxy

Amorín & Bonatto+25, in prep

Idea: How to efficiently select rare populations, such as EELGs, without having to measure the whole release

Solution: Our K-means method is good to filter out outliers, i.e. galaxies that fall off the main spectral classes



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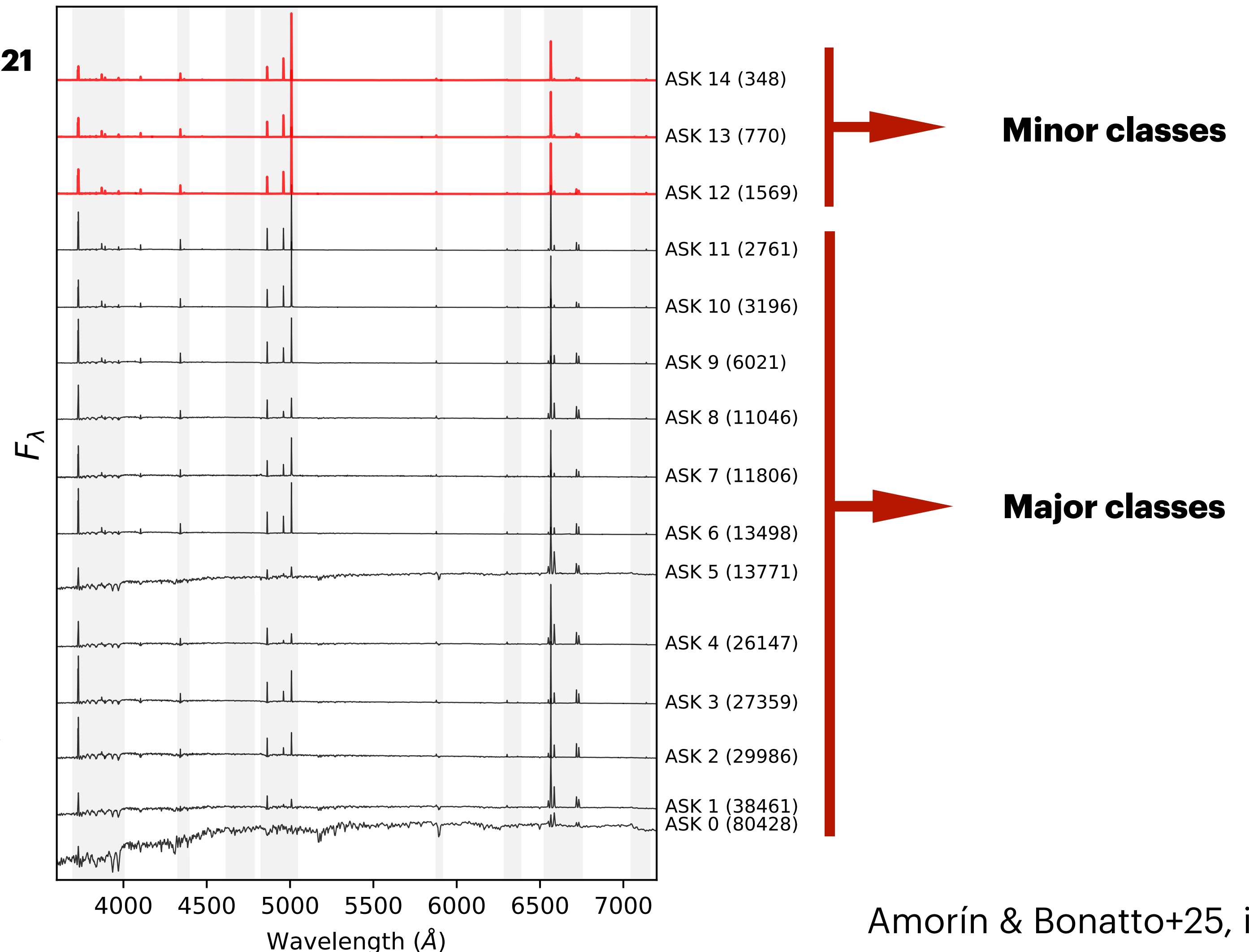
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Original k-means clusters: When the clusters were defined, the k-means algorithm partitioned the training dataset (redshift range 0-0.25) into k clusters.

Membership assignment: Each galaxy outside the redshift range must be evaluated against all k cluster centers to compute its distance and resulting merit function $Q(c, s, c_k)$.

Interpretation: Each Q value represents the merit (or membership probability) of the galaxy belonging to one of the k clusters.



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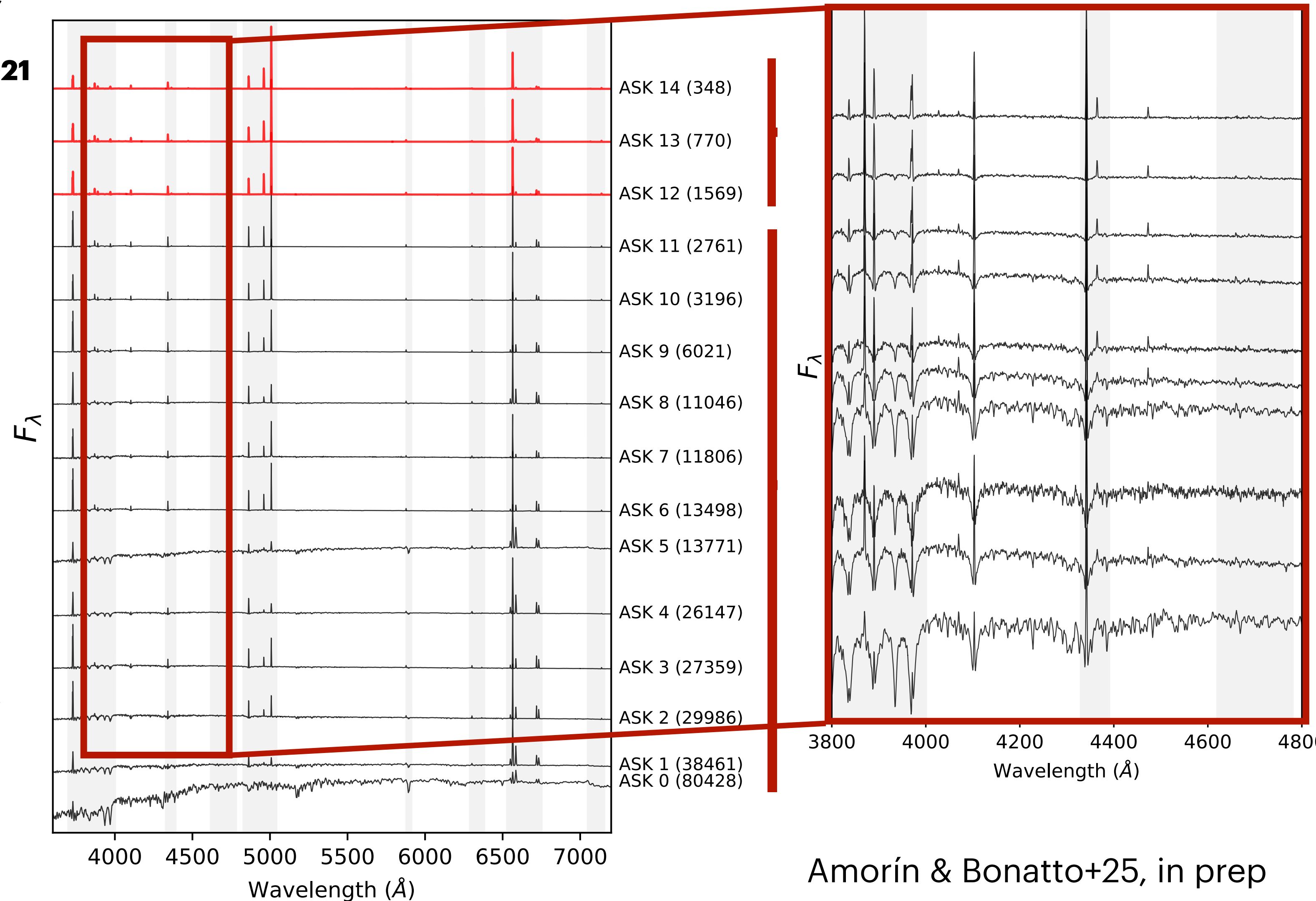
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Amorín & Bonatto+25, in prep

XTREM-DESI: EELG selection from ASK spectral analysis

Automatic Supervised K-means clustering method using EDR spectra

Inspired in the works by Sanchez Almeida et al. (2010, 2011, 2012) for SDSS-DR7 ASK spectral classification leading to a large sample of 2000 EELGs by Pérez-Montero, Amorín+2021

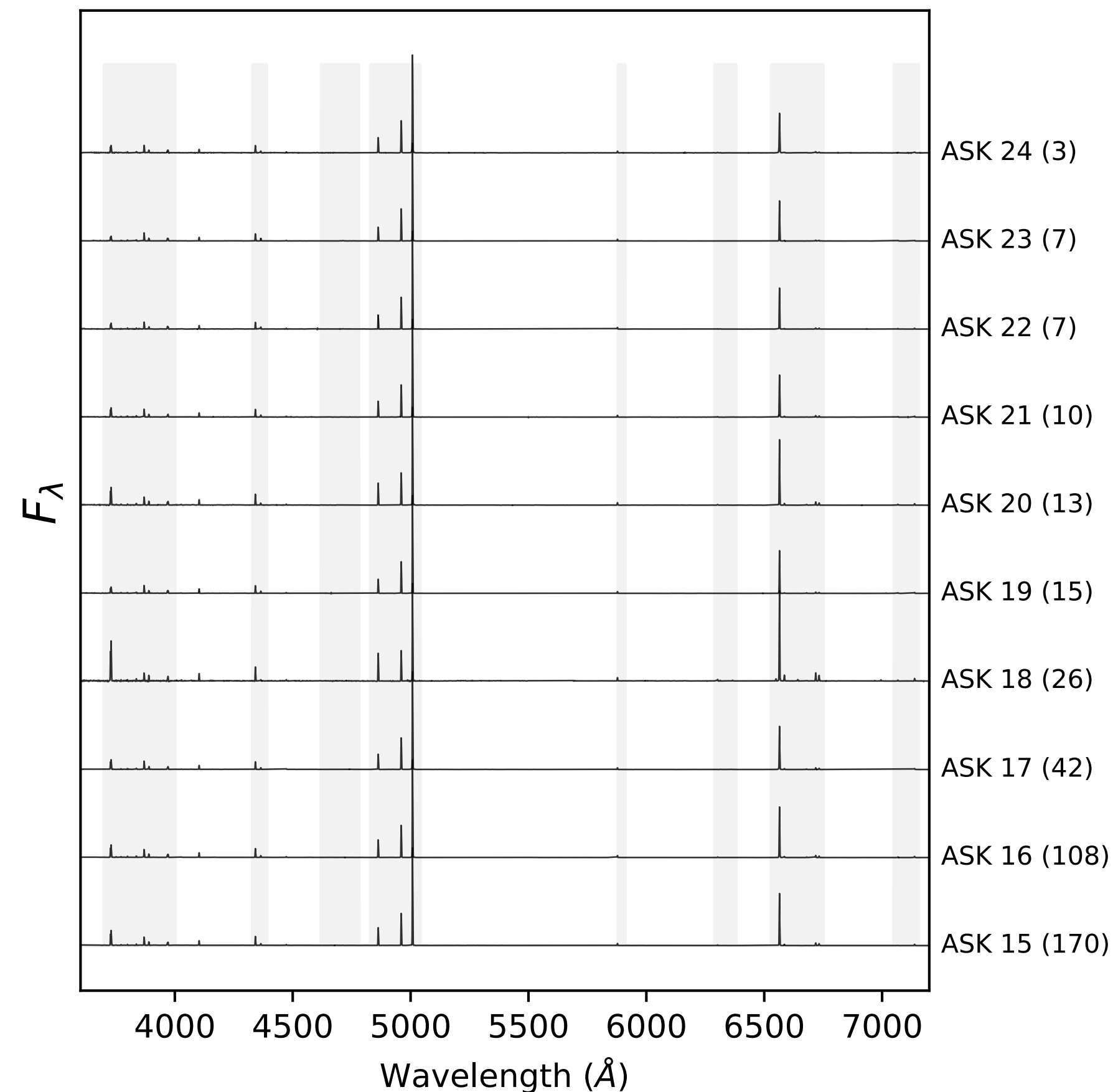
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OUR ASK METHOD IS AN EXCELLENT TOOL FOR DETECTION OF **OUTLIERS**, I.E. GALAXIES WITH RARE SPECTRAL FEATURES



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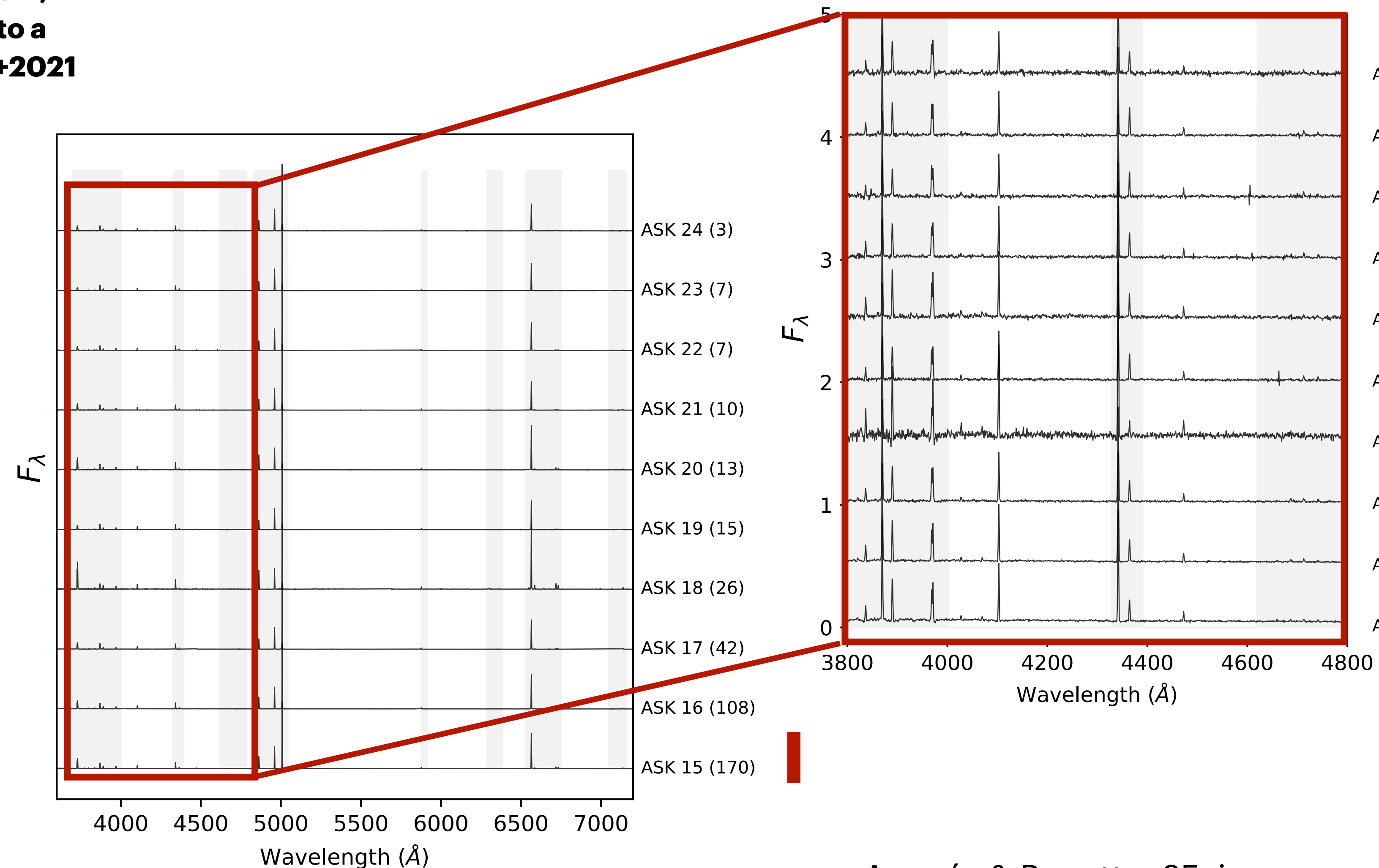
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DESI ASK spectral analysis

K-means clustering using EDR spectra

Inspired in the works by Sanchez Almeida et al. (2010, 2011, 2012) for SDSS-DR7 ASK spectral classification leading to a large sample of 2000 EELGs by Pérez-Montero, Amorín+2021

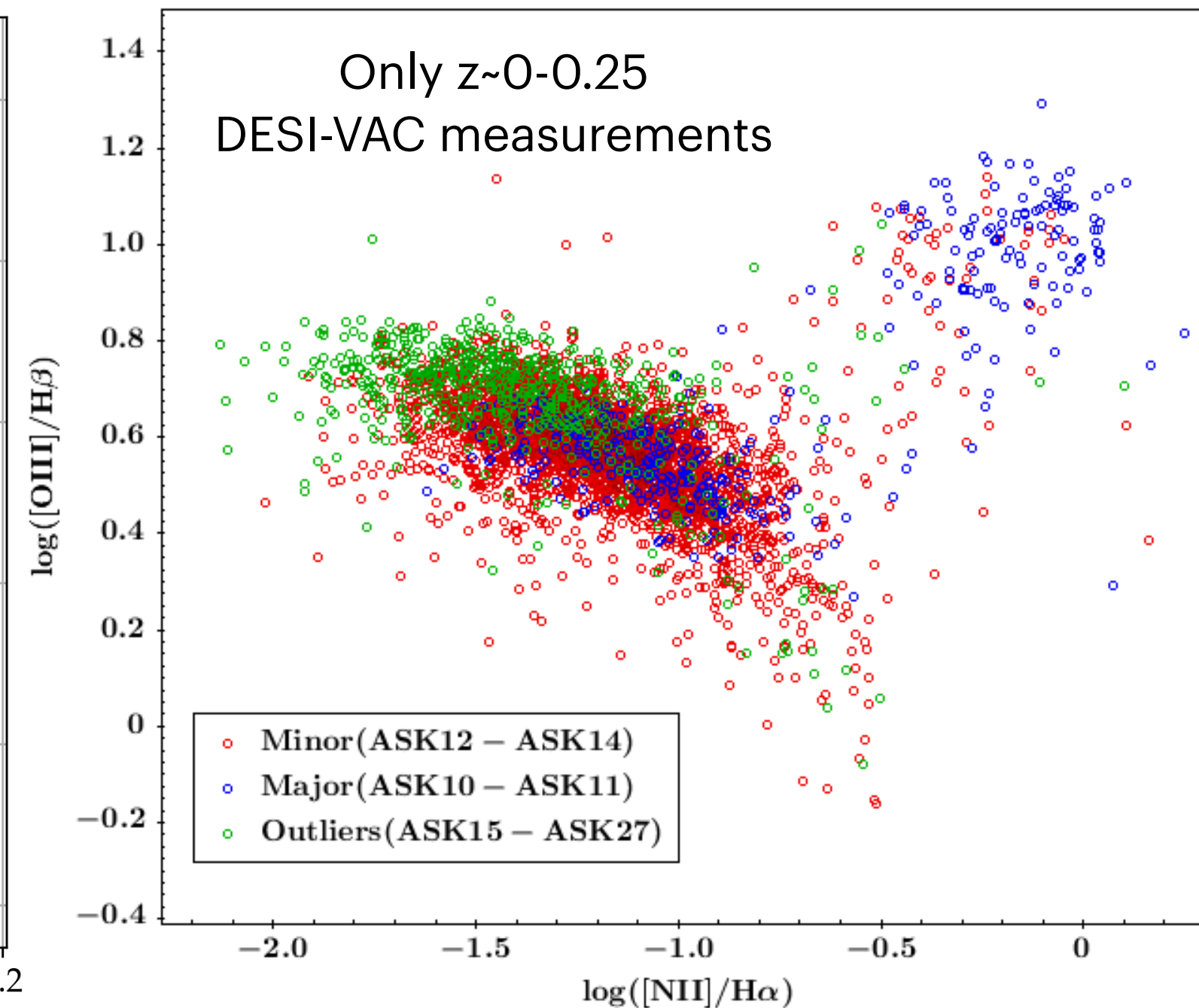
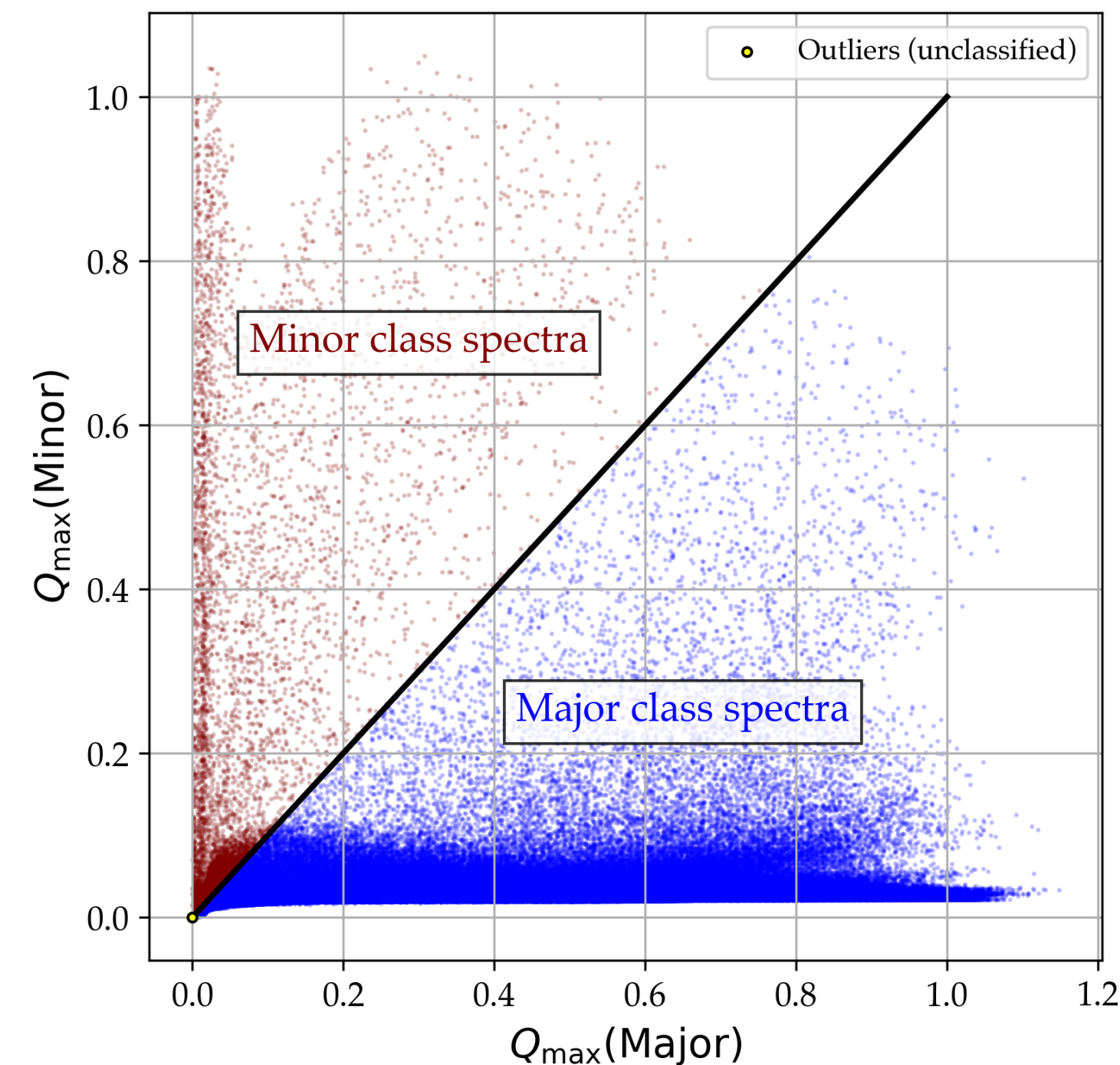
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OUR ASK METHOD IS AN EXCELLENT TOOL FOR DETECTION OF **OUTLIERS**, I.E. GALAXIES WITH RARE SPECTRAL FEATURES
→ $Q_{\text{MAX}}=0$



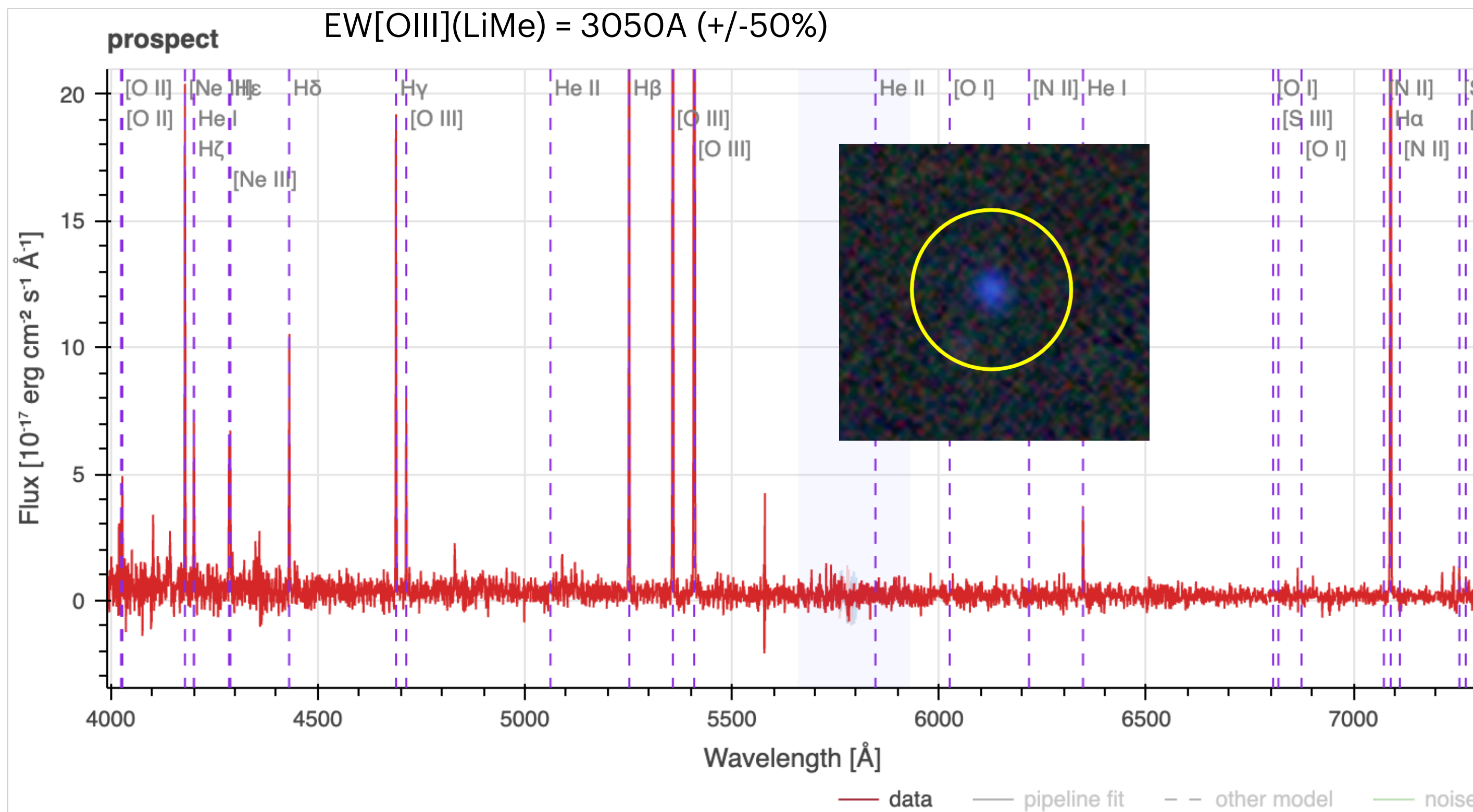
The XTREM-20k: a sample of 20000 EELGs in DESI EDR

Compact low-mass starbursts

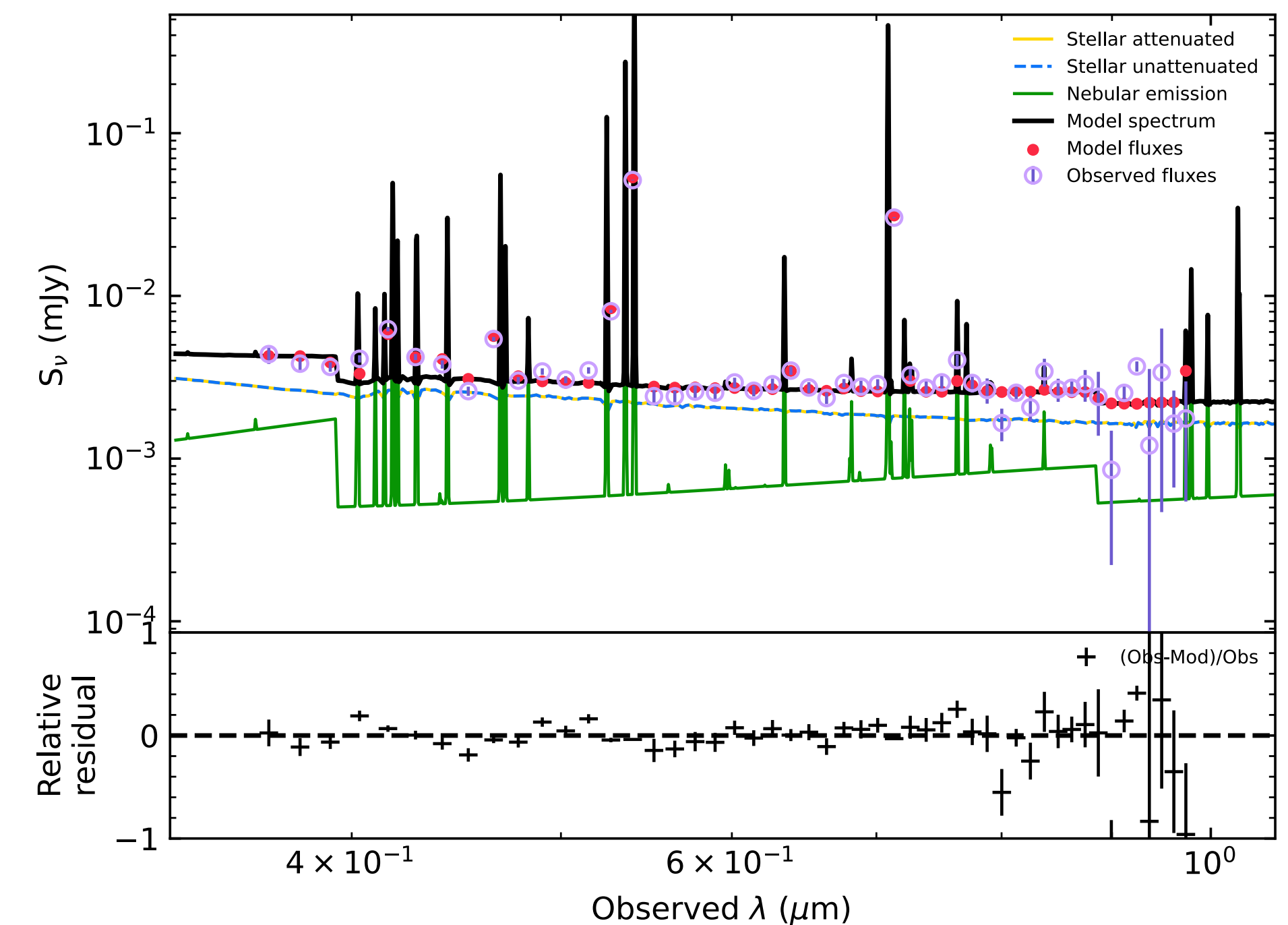
- A sample of ~20000 EELGs selected from our K-means method — ~10x larger than SDSS-DR17
- Emission line measurements using LiMe (Fernández et al. 2024)
 - Allows multi-gaussian line fitting
- Synthetic photometry from DESI spectra and SED fitting measurements using CIGALE
 - input model following Lumbreras+2022

$$\log(M^*/M_\odot) = 6.8, M_u = -15.2, M_{W1} = -13.6$$
$$\text{EW}([\text{OIII}]) \text{ (CIGALE)} = 1576 \text{ \AA}$$

EW[OIII](LiMe) = 3050A (+/-50%)



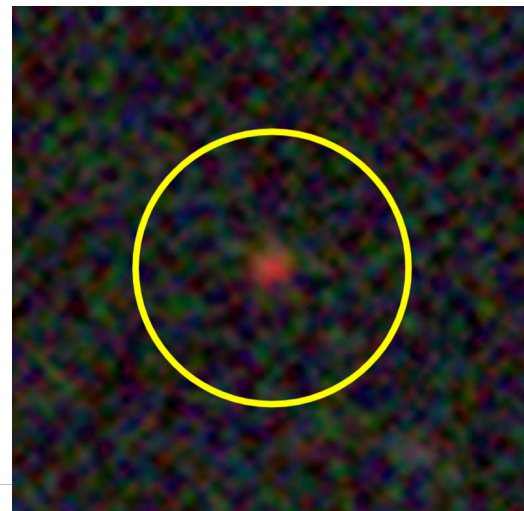
Best model for 39633286355487272
(z=0.08, reduced $\chi^2=1.0$)



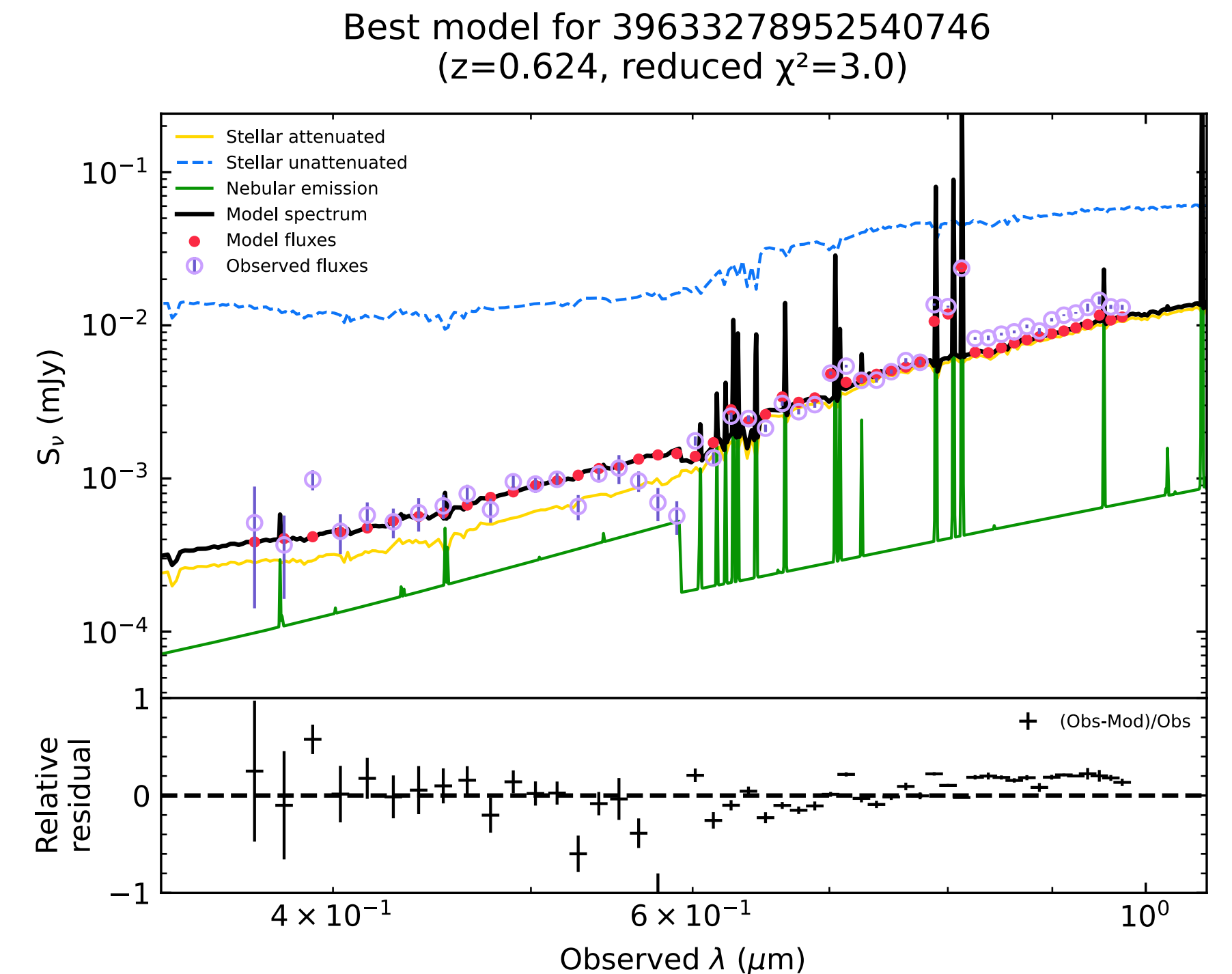
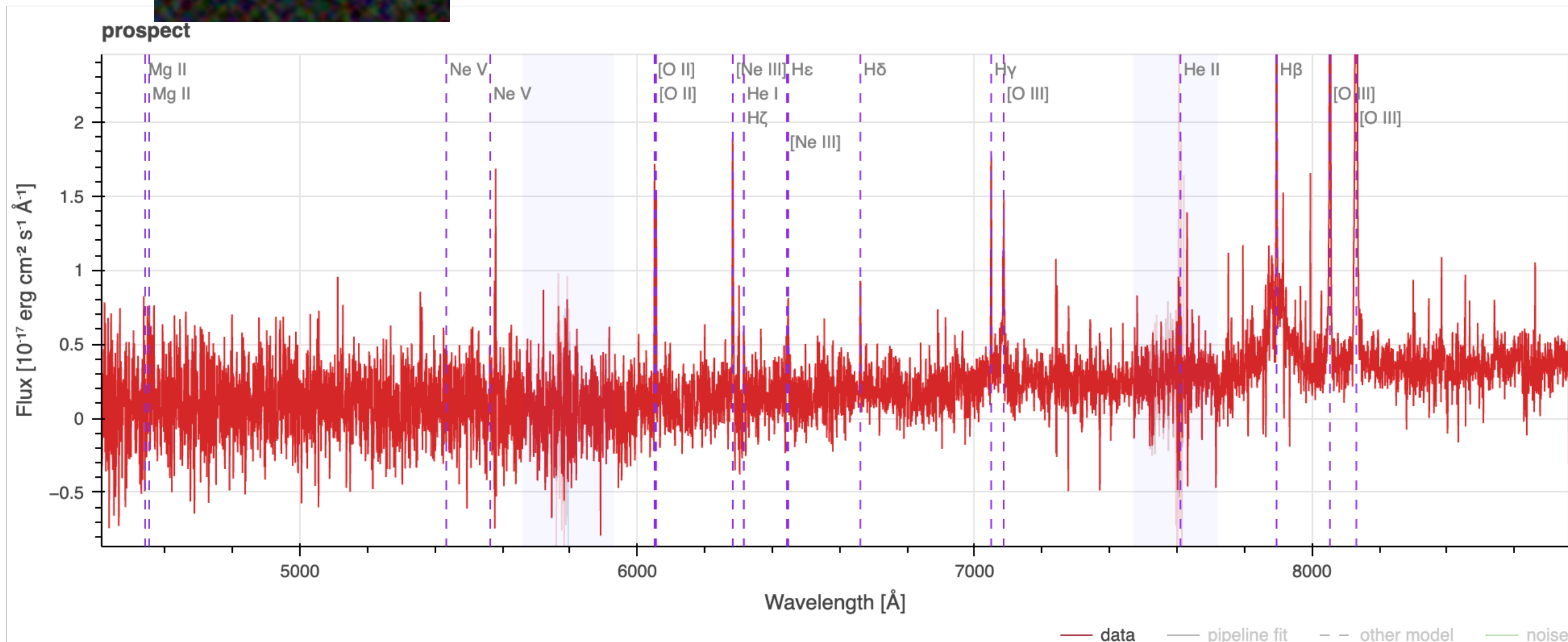
The XTREM-20k: a sample of 20000 EELGs in DESI EDR

Rare (low-mass?) AGN types

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$\log(M^*/M_\odot) = 10.2$, $M_u = -18.3$, $M_{W1} = -22.1$
 $EW([OIII]) \text{ (CIGALE)} = 220\text{\AA}$
 $EW[OIII](LiMe) = 150\text{\AA} (+/-30\%)$

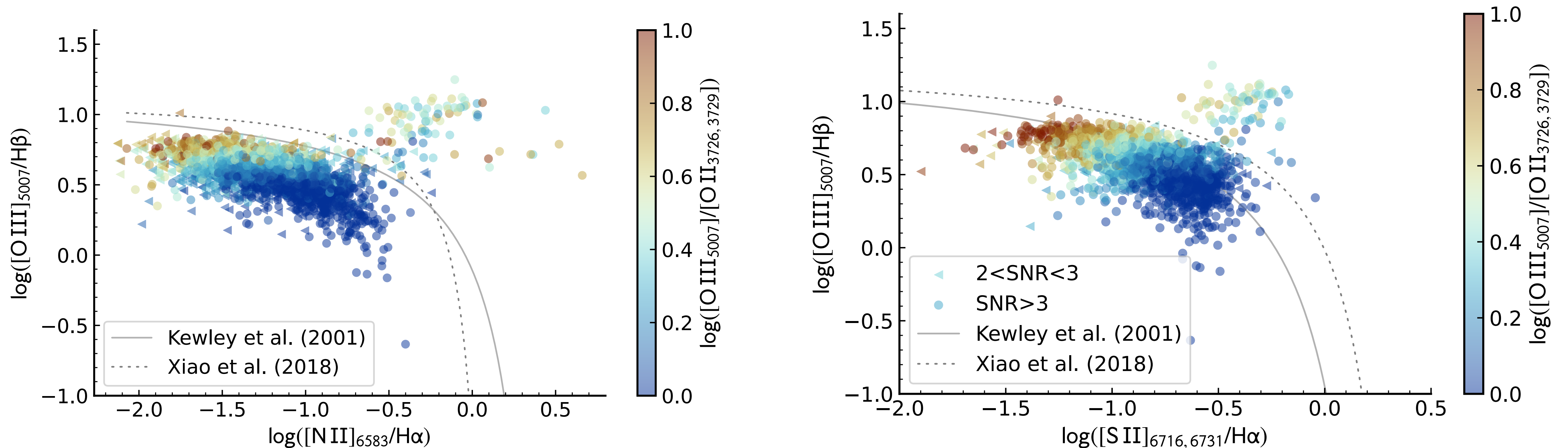


The XTREM-20k: a sample of 20000 EELGs in DESI EDR

Classic diagnostics

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 - input model following Lumbreras+2022

BPT diagrams for galaxies (only for $z < 0.4$)



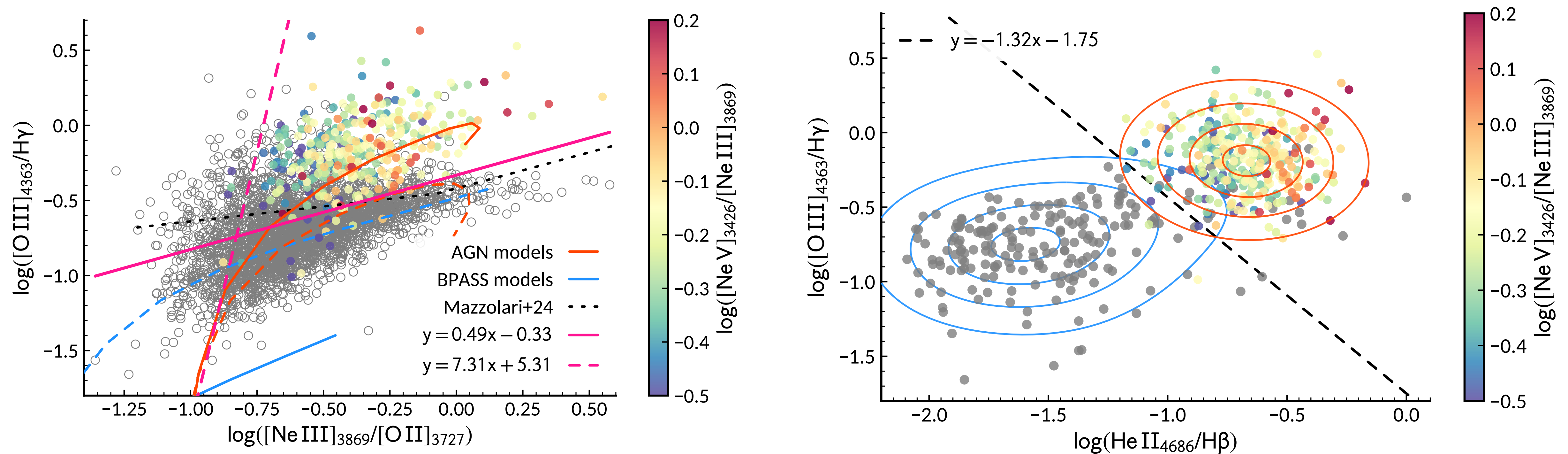
EELGs in DESI EDR

Disentangling hard radiation fields from NeV and HeII emitters

New diagnostics particularly useful for JWST high-z galaxies

e.g. Cleri+23; Mazzolari+24; Backhaus+25

OHNO and O3He2 digrams

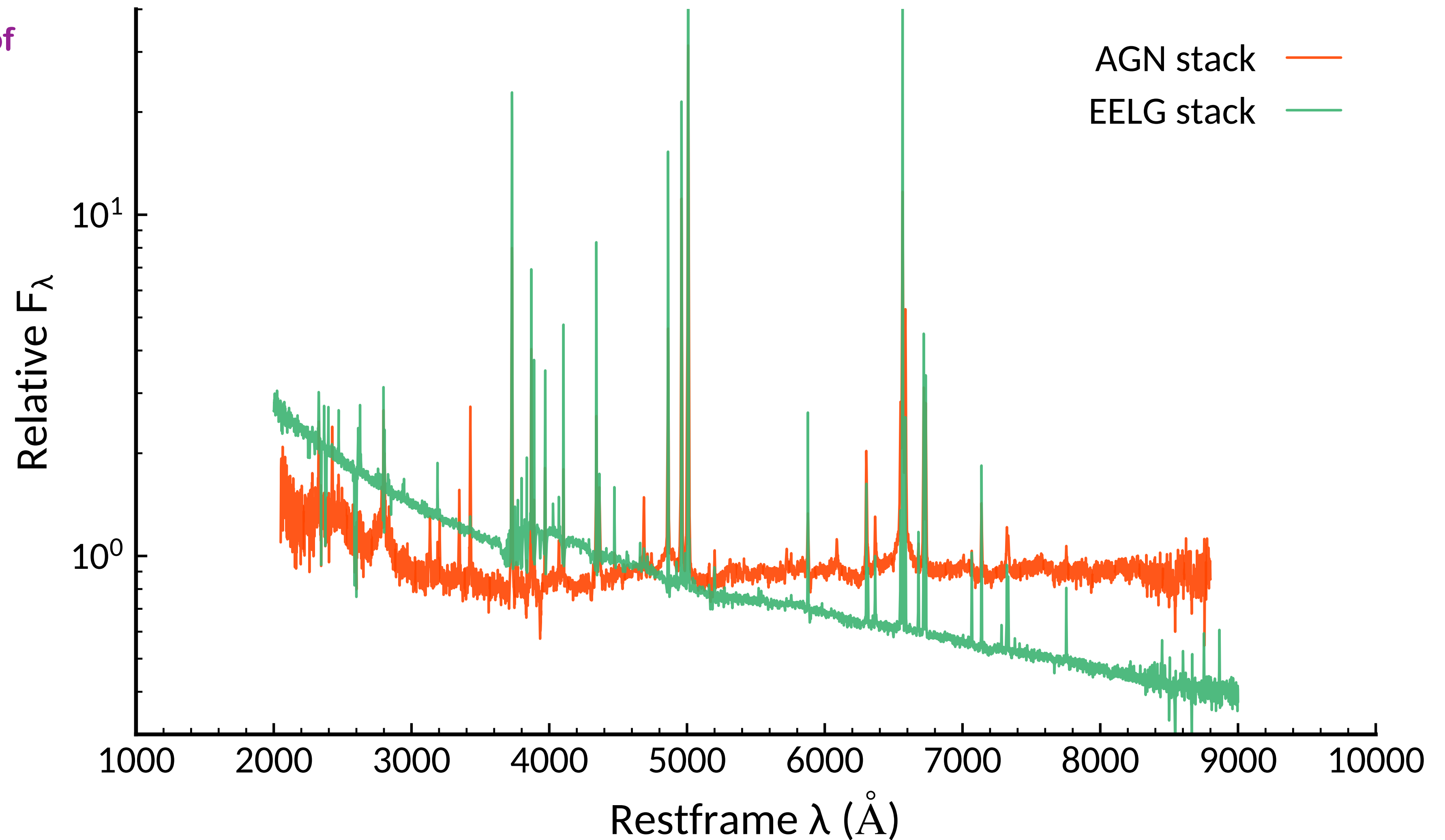


Fernandez-Ontiveros+, in prep
(See talk by Juan on Friday!)

The XTREM-20k: a sample of 20000 EELGs in DESI EDR

Median spectra

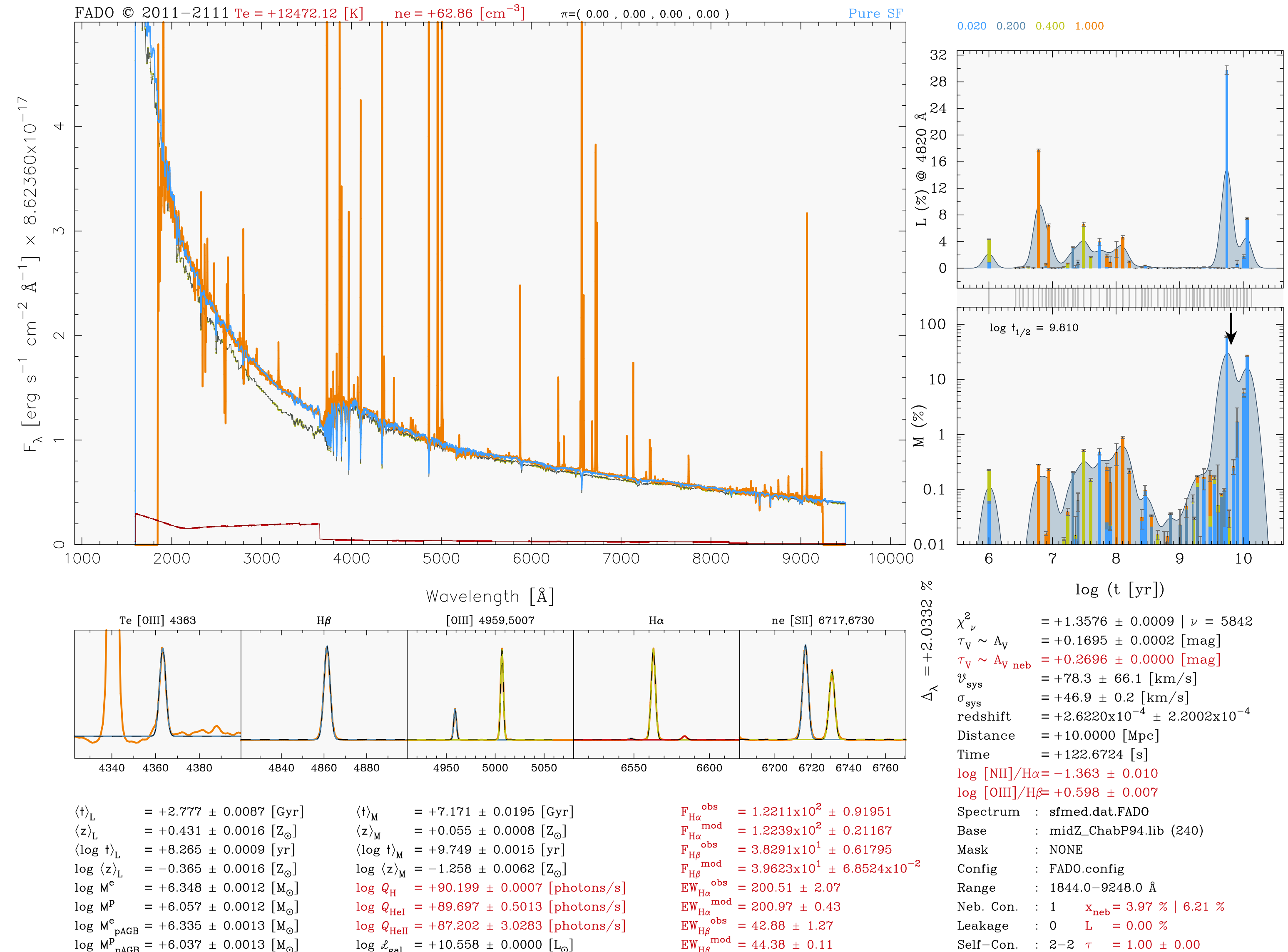
For a better description of
the AGN-like EELGs
see talk by Fernandez-
Ontiveros on Friday!



The XTREM-20k: a sample of 20000 EELGs in DESI EDR

Median spectra: Spectral synthesis fitting with FADO

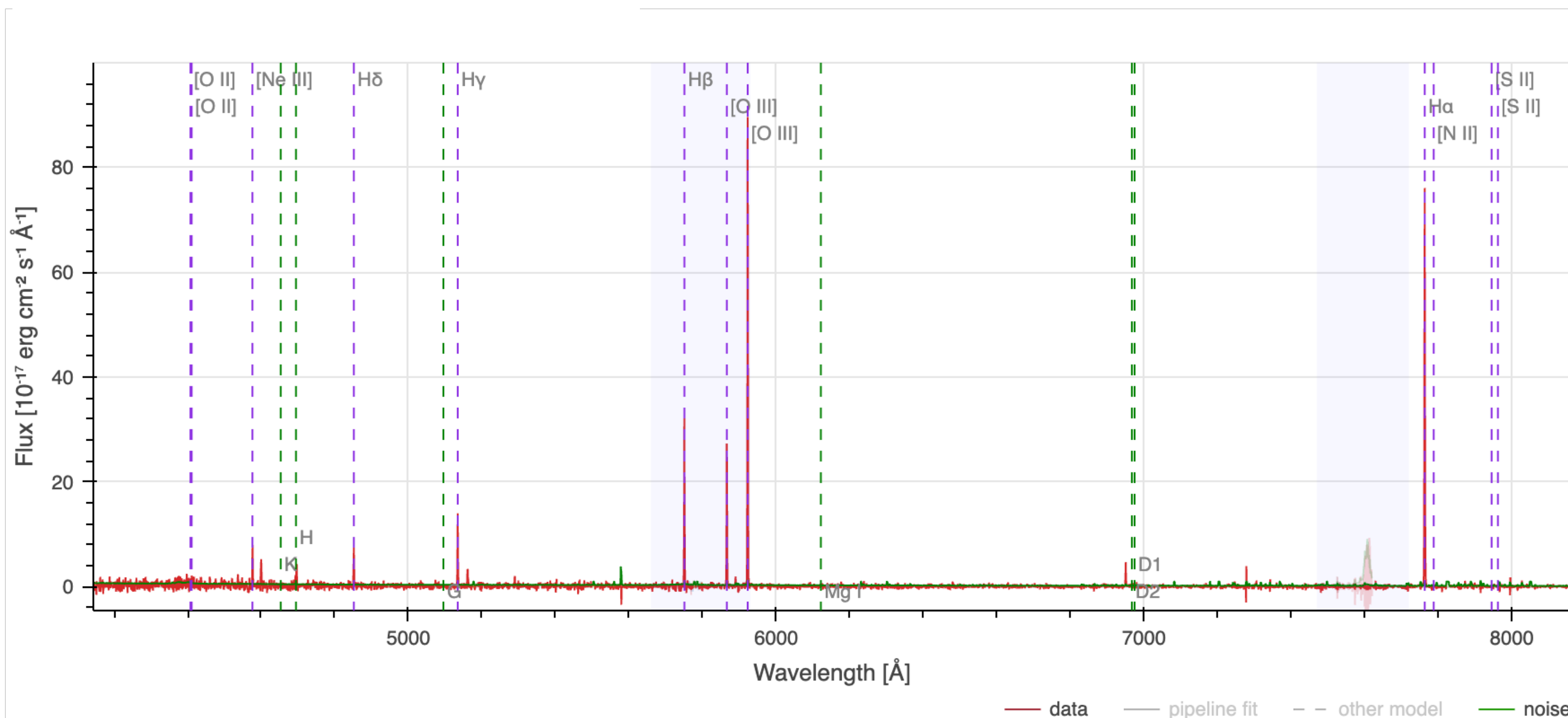
- Superb S/N in both lines and continuum allows detailed spectral synthesis
- FADO (Gomes & Papaderos 2016) is an powerful tool for such studies
- SF EELGs median properties consistent with average nearby HII/BCD/GPs in high S/N studies (e.g. Amorin+12; Breda+22; Fernandez+23)
 - Blue UV continuum
 - Significant contribution of nebular continuum
 - Bursty SFH



Lyman photon escape using XTREM-20k

Probing indirect method with our golden Te[OIII]4363 sample

- A sample of ~1500 EELGs at $z \sim 0.01$ to 0.95 selected from XTREM-20k sample with $\text{SNR} > 3$ in [OIII]4363 auroral line.
- ~75% belong to the “dark” survey \rightarrow fainter sources (~ 22 -24 AB mag) \rightarrow **low luminosity end: $M_u \sim -13.5$ to -18.5 mag**
- Golden sample for metallicity study using direct method (Amorín+25, in prep)
 - **T_e and N_e** via PyNeb (Luridiana+15)
 - **Direct metallicities** (Perez-Montero+17)



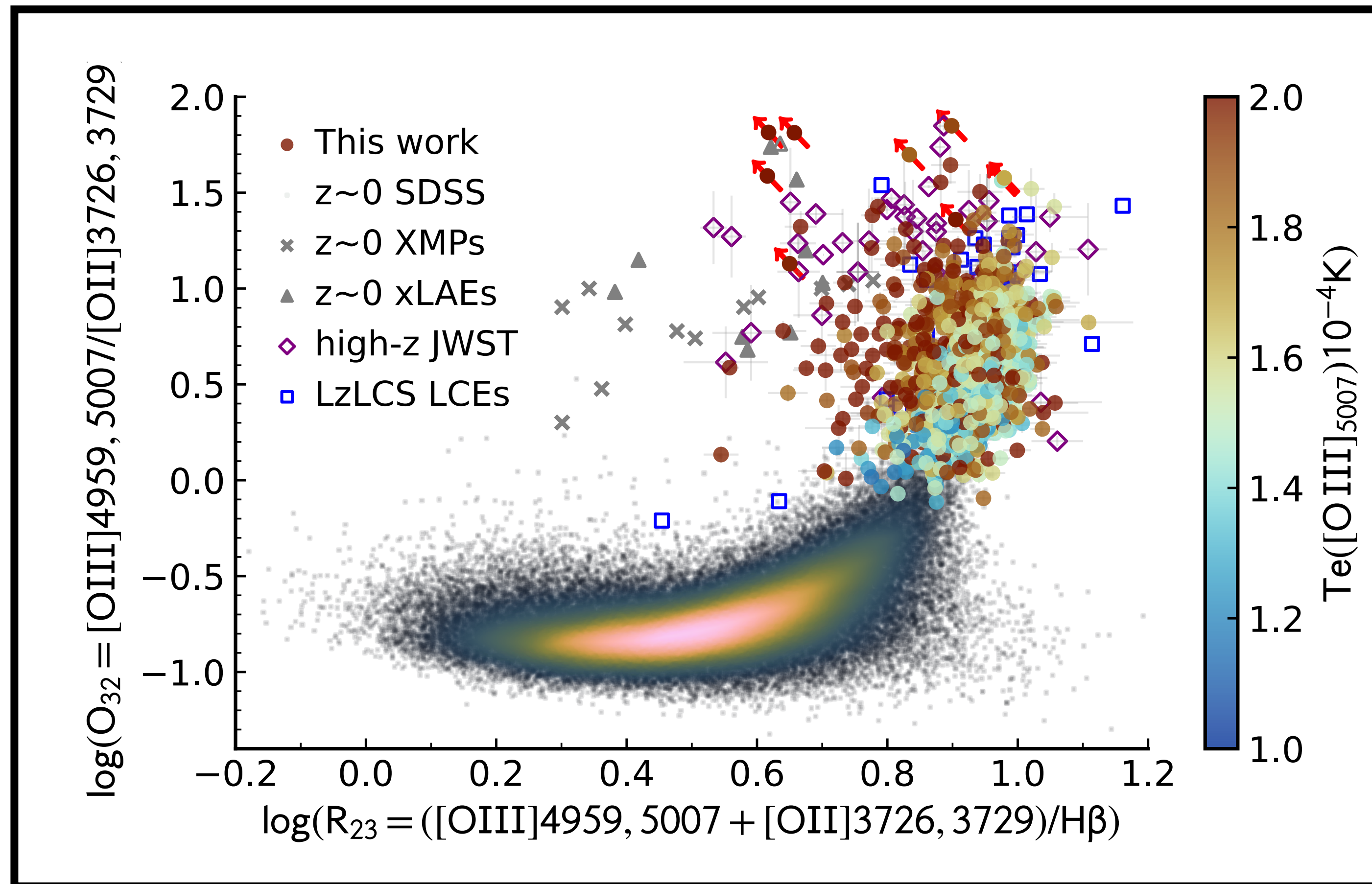
Gallery from deep Subaru HSC color tiles

- An unusual case (10 in 20k EELGs): very high T_e and extreme O32, no low-excitation lines (Amorín+25, in prep)

XTREM ionization sample

Higher ionization at very low metallicity

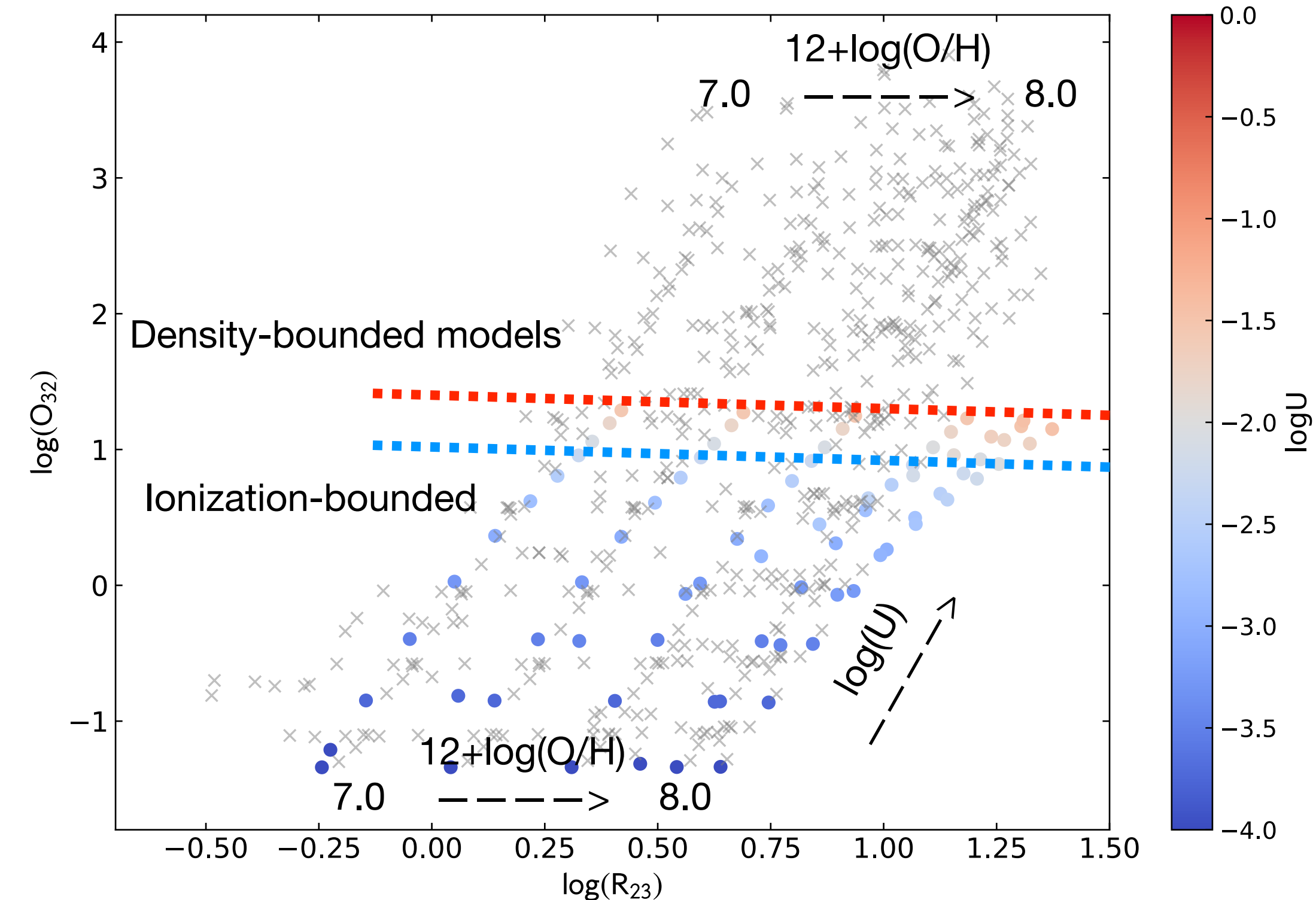
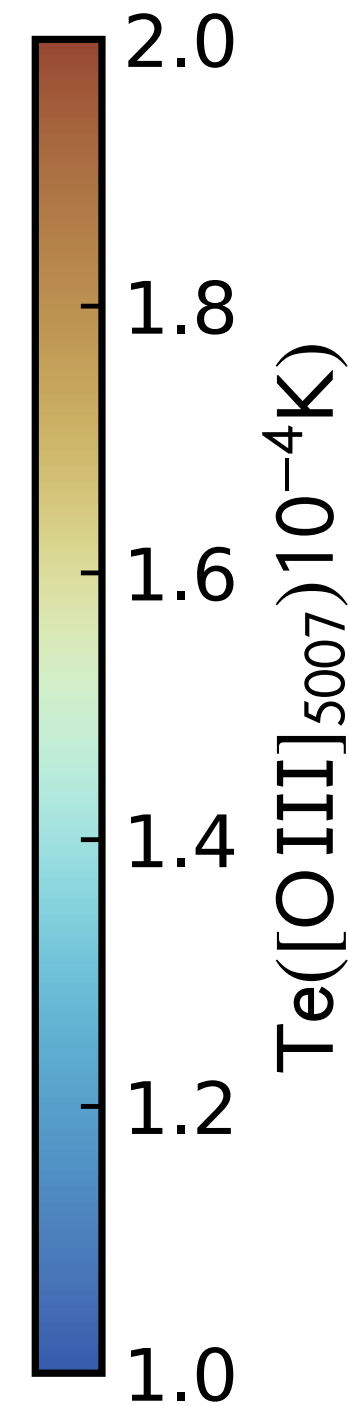
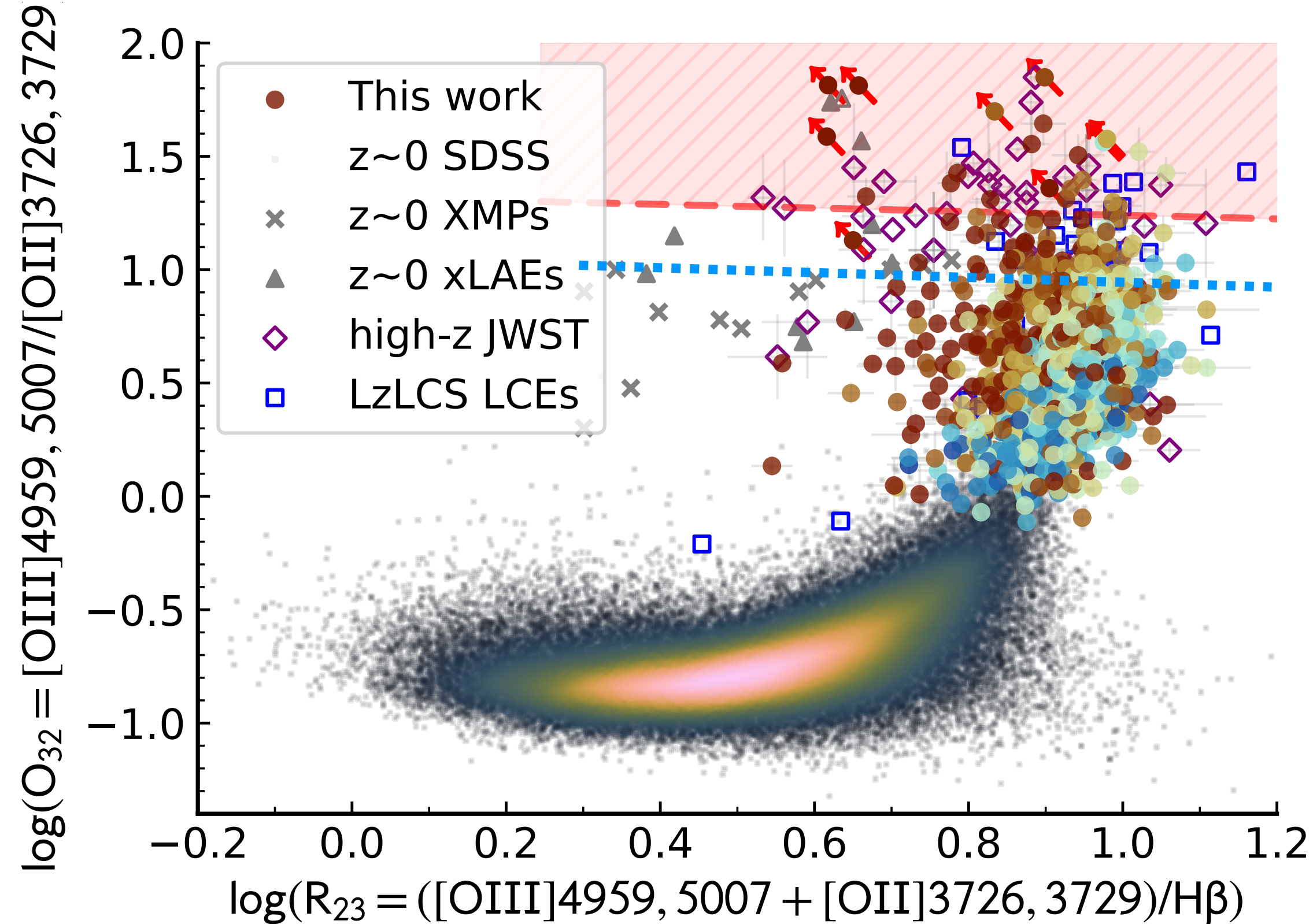
- We find a unique sample of XMPs with unusually high ionization $O32 > 10^{-70}$ and high Te
- Similar to the few local XMPs found as extreme LAE (xLAEs) by Izotov+24 from SDSS-DR16
- Excellent match to $z > 6$ comparison samples from JWST (Cameron+23,24; Heintz+24; Saxena+24; Trump+23; Arrabal-Haro+24; Mowla+24; Willot+25; Cullen+25) — Selected to match metallicity range, with Te estimates
- Different from classic XMPs (IZw18, SBS0335-052, LeoP, etc..) typically show lower O3O2 and R23



XTREM ionization sample

Higher ionization at very low metallicity: density bounded conditions

- A clear trend in O32-R23 with Te is reproduced by Cloudy models with purely stellar BPASS models (Perez-Montero+2014;2021, 2023)
- Density-bounded modes are the only ones able to reproduce $O32 > 10^{-20}$ with $12 + \log(O/H) < 8$ ($T_e > 15000K$) — Cf. Morriset+25
- No need of exotic sources with very hard radiation fields (models show BPASS incl. binaries with top-heavy IMF)

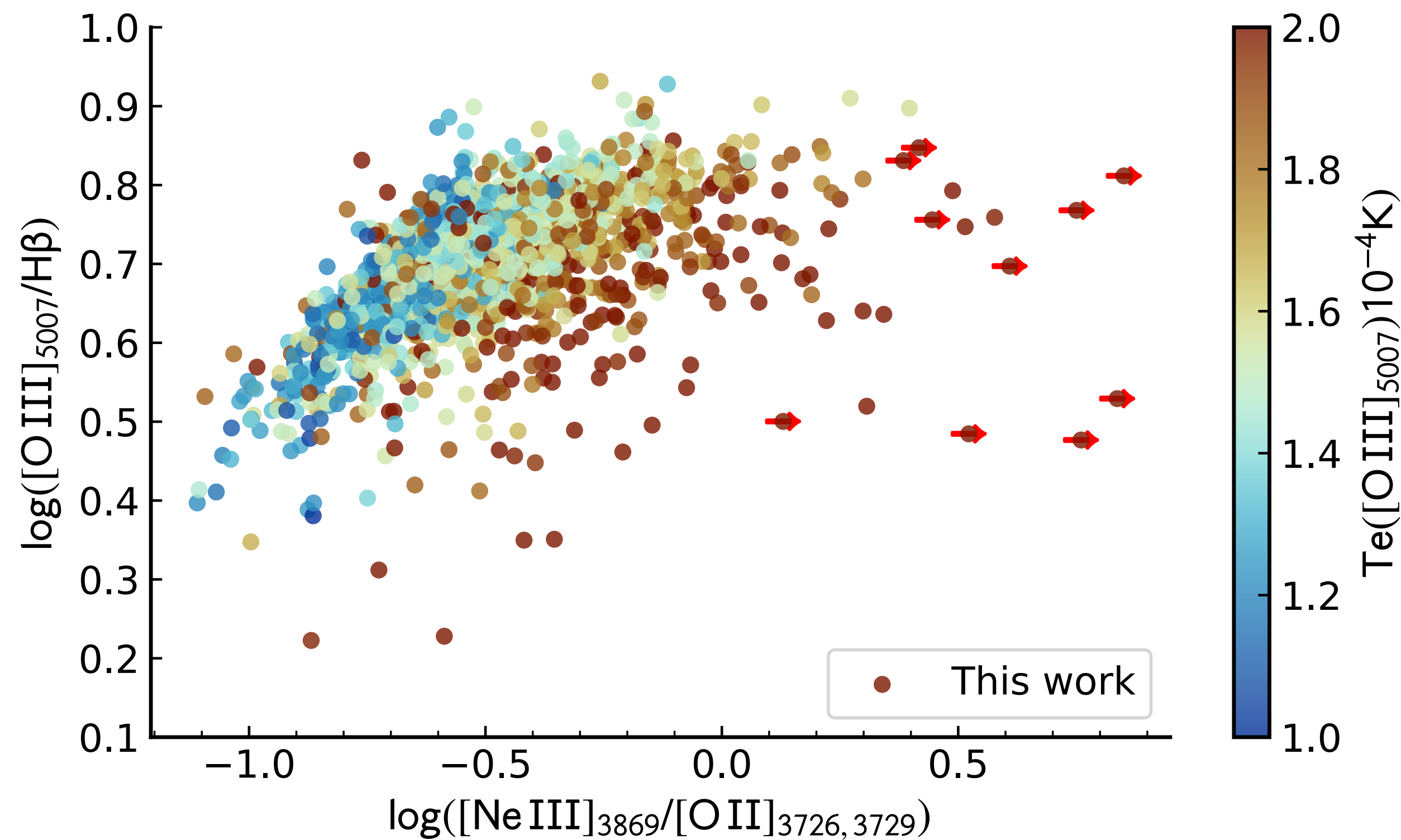


Amorín+25, in prep

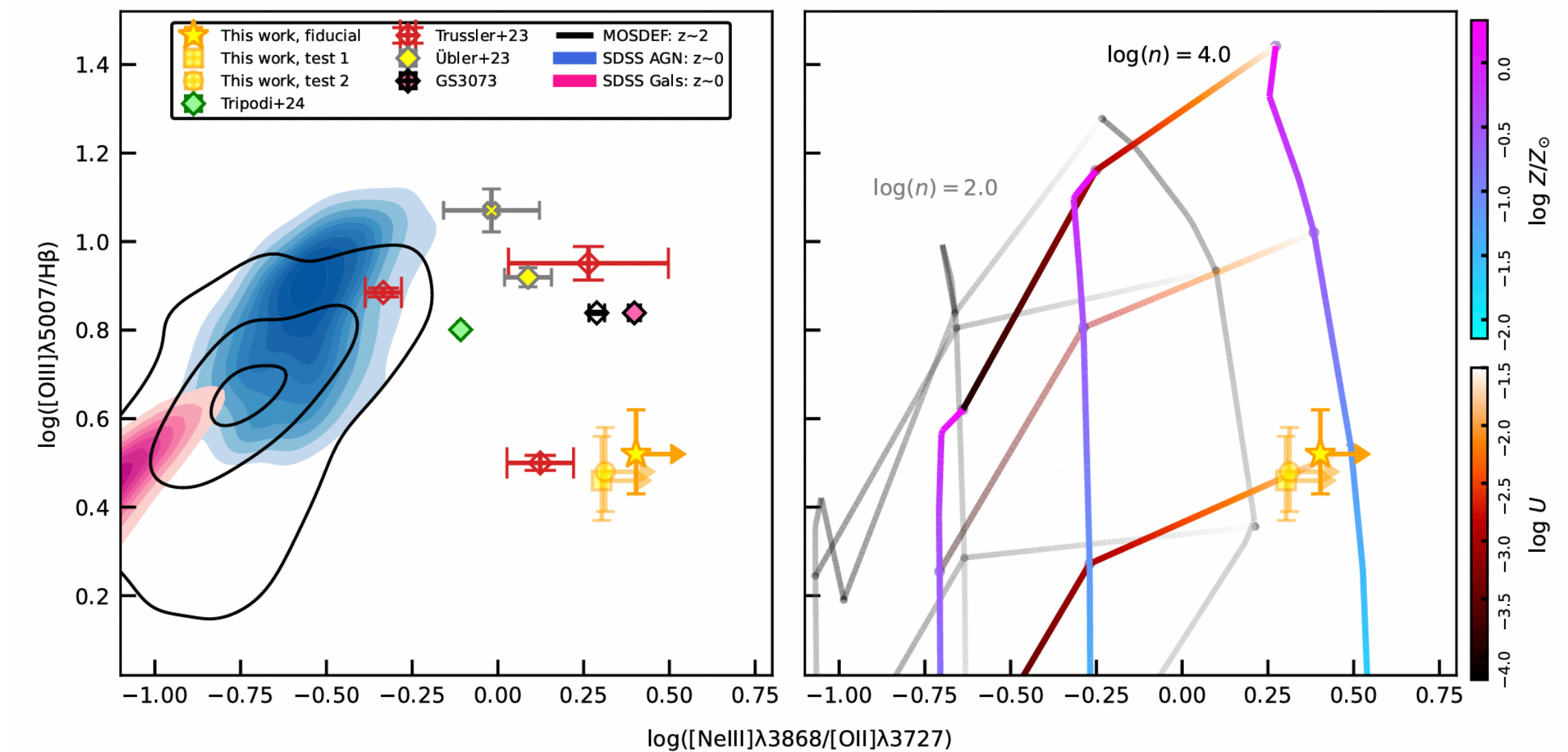
XTREM Te-based sample

Higher ionization at very low metallicity: candidates to strong LyC emitters

- Consistent results for the OHNO diagnostic



- Ionization-bounded models only explain the most extreme Ne3O2 and Te if assume AGN ionization at low metallicity (e.g. Tripodi+24)



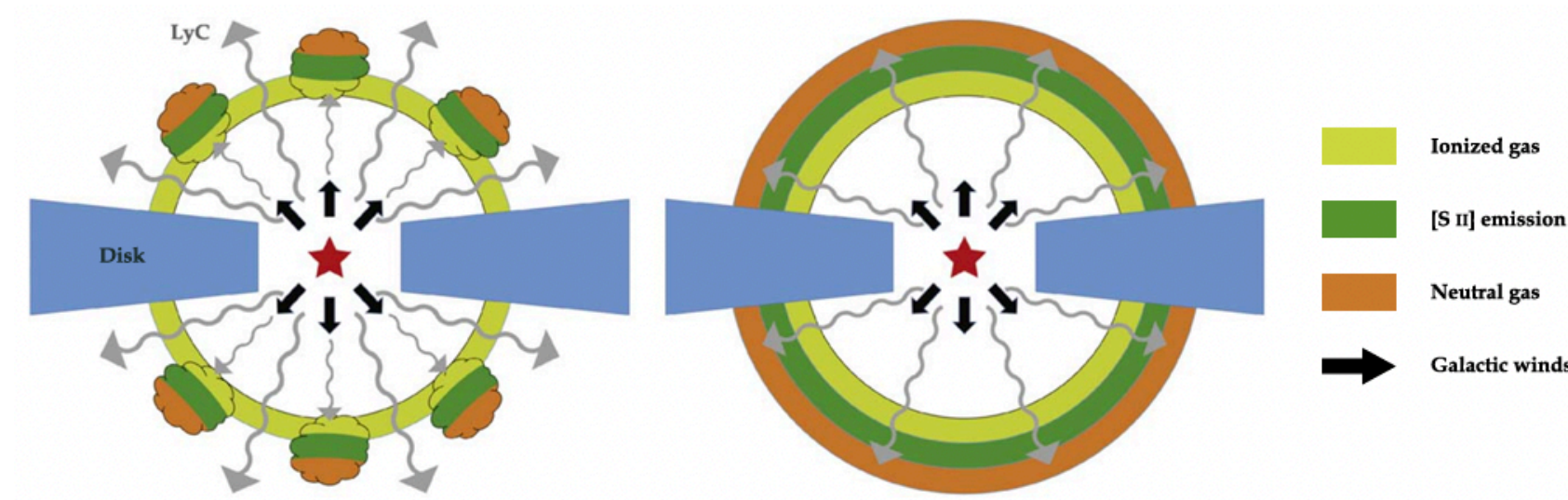
- However, density-bounded models with “normal” stellar ionization are claimed to work in some others (e.g., Cullen+25)

XTREM Te-based sample

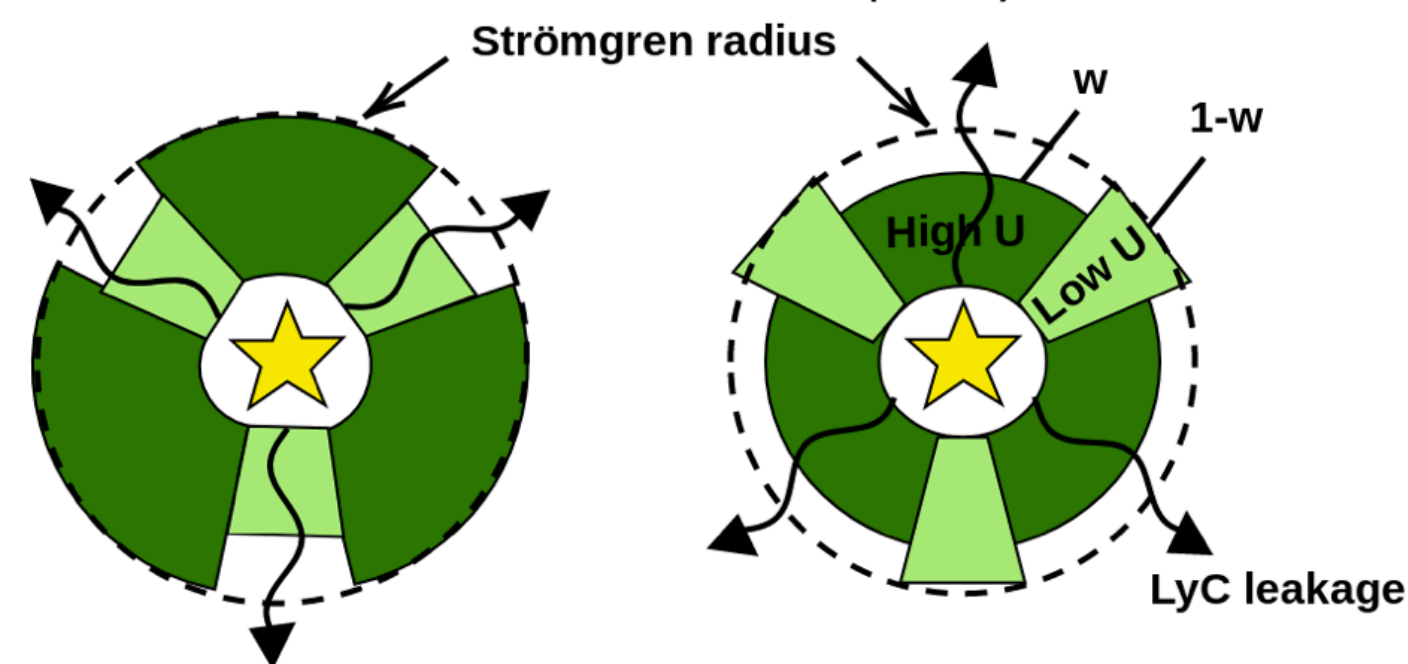
Higher ionization at very low metallicity: candidates to strong LyC emitters

- Selecting young bursts with high Te, low/moderate Ne and weak or non-detections of low-excitation lines ([NII], [SII], [OII]) appear optimal for candidates to strong LCE. Better to avoid restricting our samples by imposing high S/N cuts on these lines !

Cf. Wang+19,21 on [SII] deficiency



Ramambason et al. (2020)



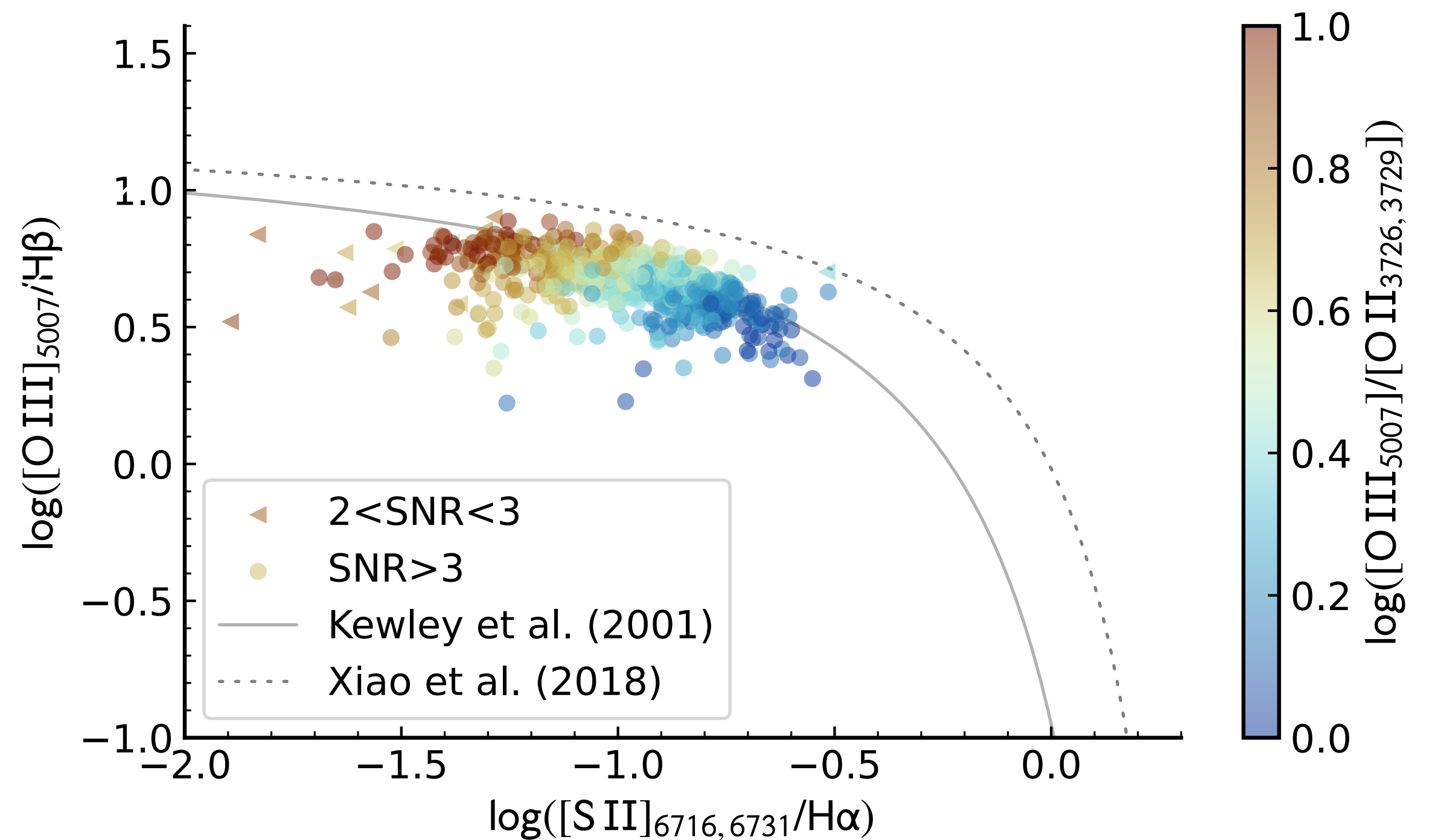
Scenario (1)

Density-bounded
channels/filaments

Scenario (2)

Density-bounded
galaxy

Galaxies are far more complex than single HII regions
Picket fence models with holes, channels, filaments...

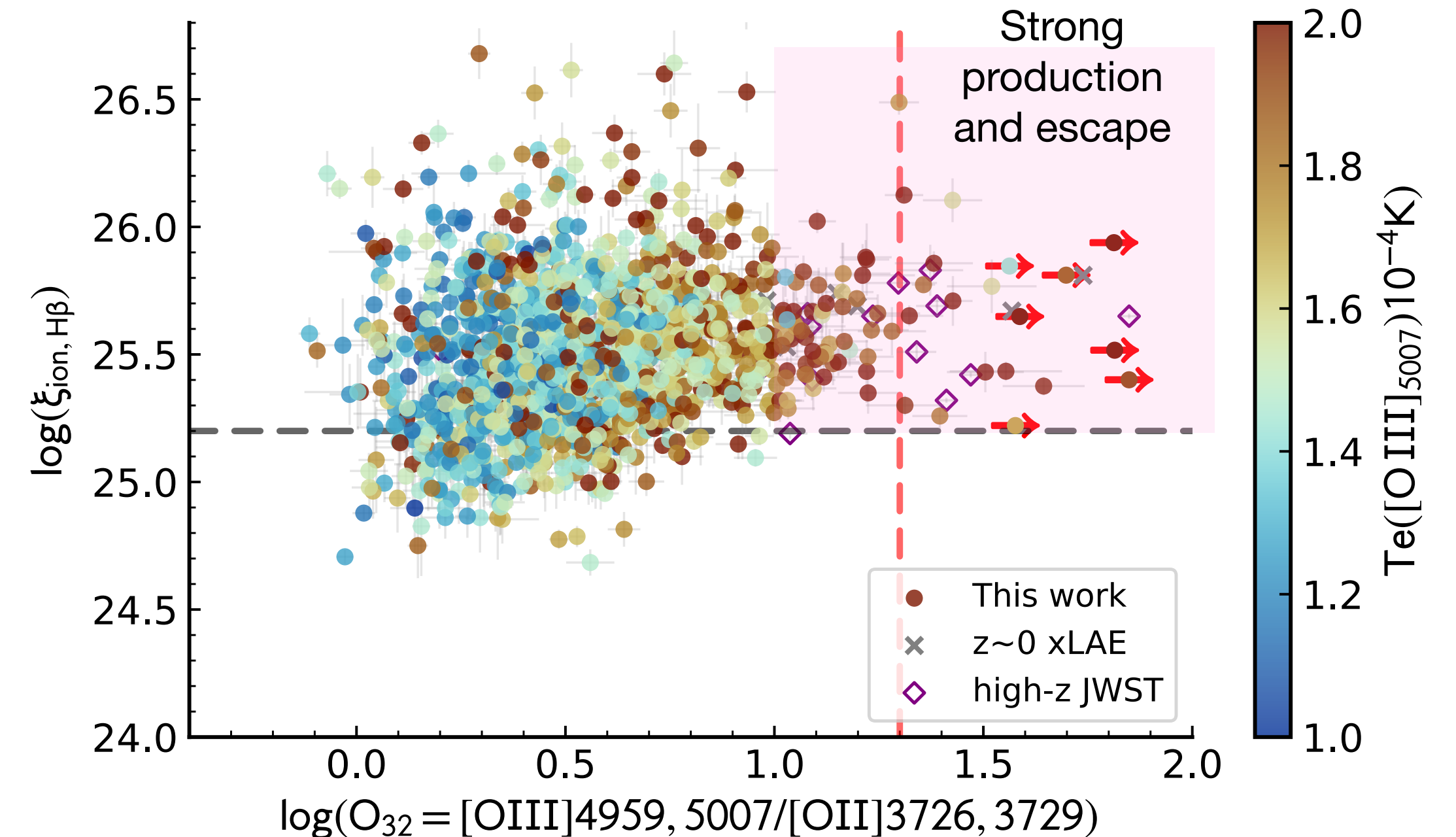
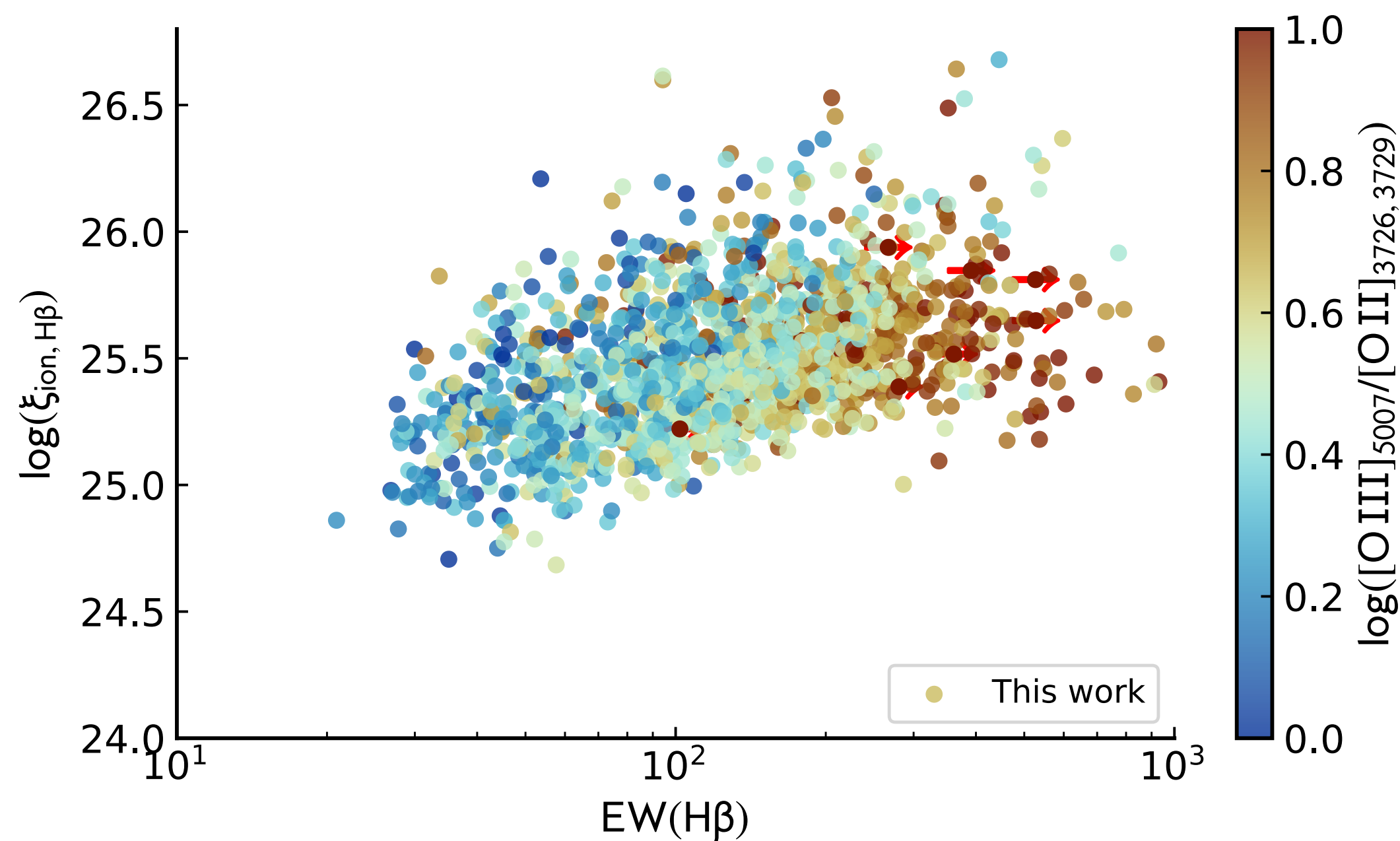


XTREM ionization sample

Probing the ionization photon efficiency

OUR RESULTS

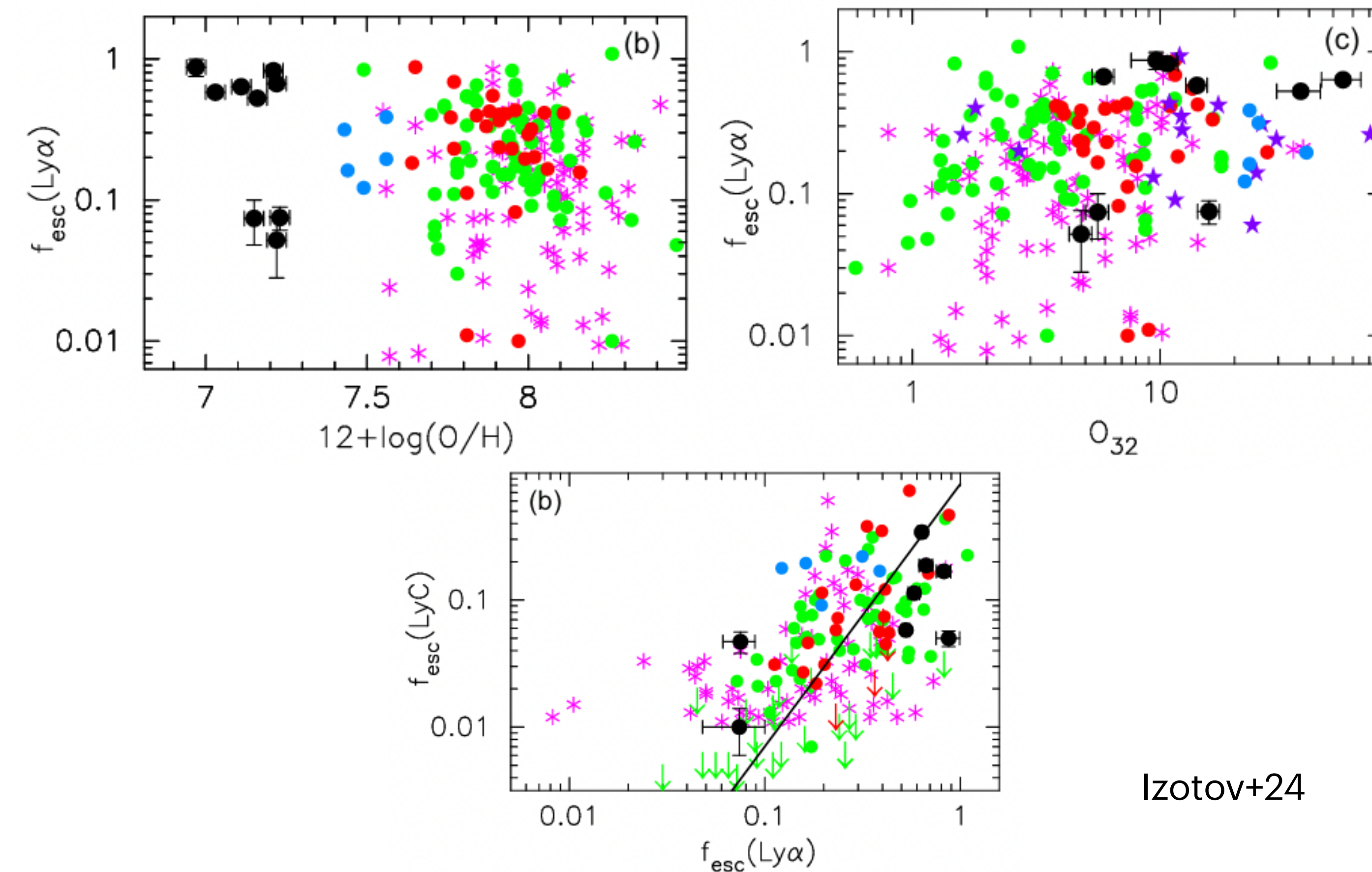
- We derive ξ_{ion} from $H\alpha$ and UV (1500) luminosity consistent with previous works (no LyC leakage assumed) See *Antonio Gimenez Talk!*
- We find a clear increase of ξ_{ion} with EW. In agreement with previous works at low and high- z (e.g. Tang+19; Simmonds+24; Llerena+24)
- The highest $H\beta$ EWs ($>100\text{\AA}$) correspond to younger burst ages, higher ionization (O32, Ne3O2) and higher T_e — above $\text{EW}(H\beta) > 300\text{\AA}$ the relation flattens (cf. Izotov+24)
- We find a scattered ξ_{ion} - O32 relation, with a **flat behaviour above 25.2 for EELGs with O32 >10 AND $T_e > 15\text{-}20\text{kK}$ (XMP regime)**



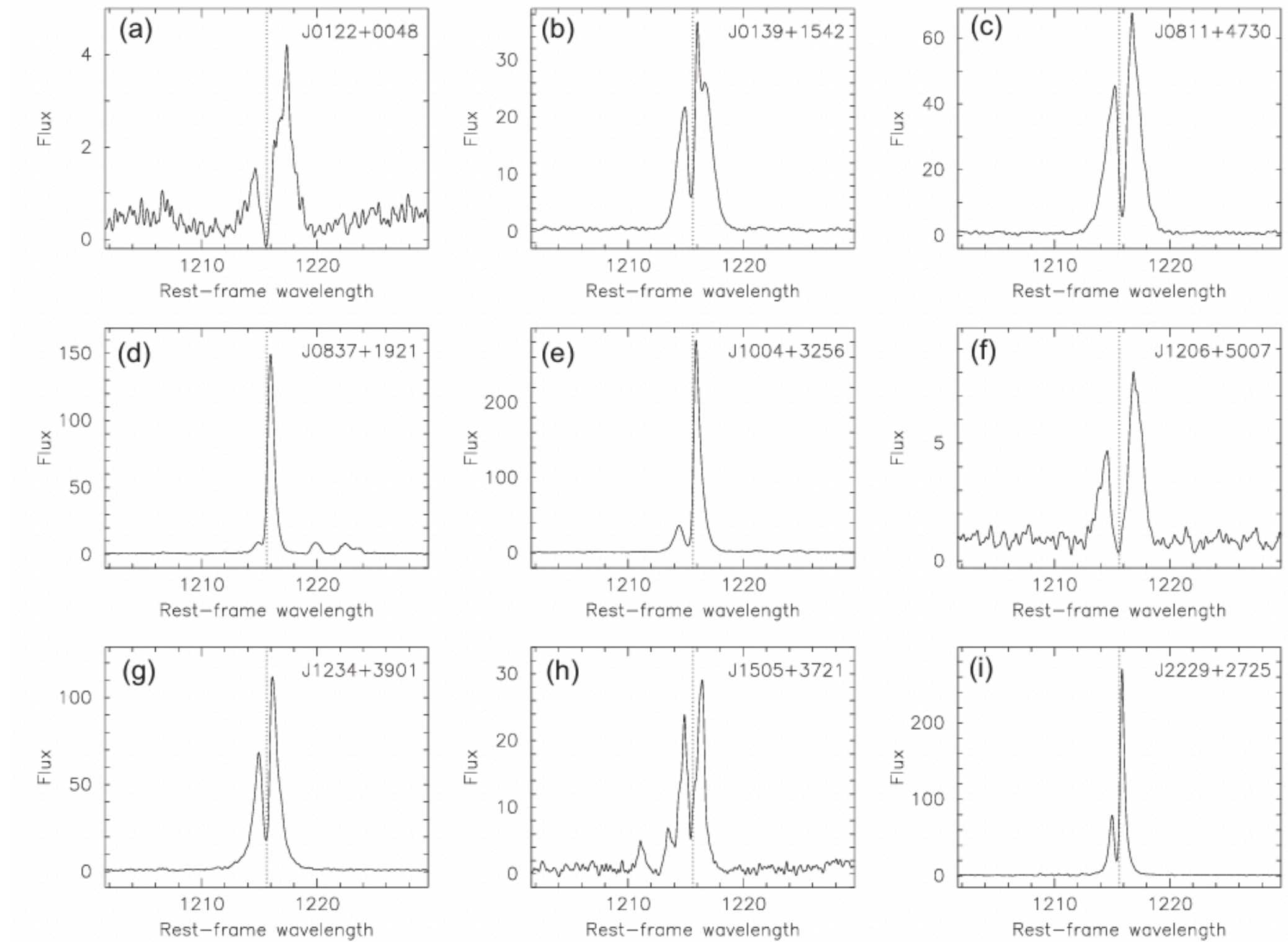
Amorín+25, in prep

Expectations for HST/COS studies

- Our XTREM-20K sample of potential leakers add statistical significance to the local xLAEs found by Izotov+24
- We explore a similar range of faint luminosities, low-mass and metallicity, and ionization conditions but at higher redshifts
 - Our predictions are in line with the XTREM sample of high O32, high Te, are xLAEs with very strong LyC escape
 - The XTREM redshift range makes them better suit for LyC studies (e.g. LzLCS)

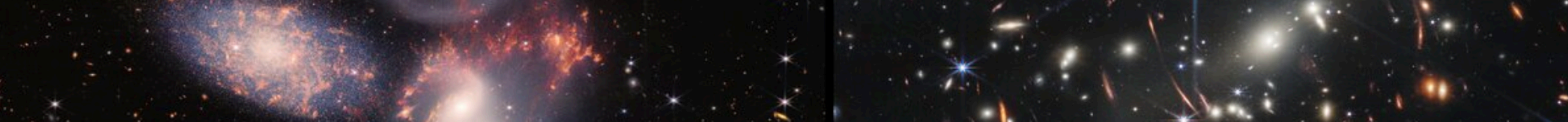


Izotov+24



Summary and Conclusions

- We present XTREM: an unprecedented sample of 20k EELGs selected from DESI EDR using a KMEANS methodology to filter outliers and minor spectral classes. We find EELGs (including XMPs, “Green Peas” and rare AGNs or “Little Red Dots” analogs) are outliers of any classification scheme and our method is robust to isolate these systems.
- XTREM sample is an ideal training set to understand efficient ways to exploit DESI DRs and other surveys e.g J-PAS for the selection and study of complete samples of EELGs (see Antonio’s talk later)
- XTREM contains a golden subsample of ~1500 [OIII]4363 emitters, including the most metal-poor ones (XMPs, $Z < 0.1 Z_{\text{sun}}$), which is ideal for Lyman escape studies. New objects w.r.t previous works.
- We discovered new EELGs with extreme ionization conditions ($O32 > 10-70$) and electron temperatures ($T_e > 20\text{kK}$). Selection effects due to S/N cuts may prevent to find these objects.
- Cloudy models with standard stellar ionization (BPASS) show their $O32$ - $R23$ and T_e properties are only predicted by incomplete or optically-thin nebulae or highly porous ISM conditions consistent with “density-bounded” assumptions.
 - We establish a limit in the $O32$ - $R23$ plane above which ionization-bounded models ($f_{\text{esc}}(\text{LyC})=0$) cannot explain their line ratios. Importantly, no need of exotic or very hard radiation fields is found (and *no sign* of very high density, or high ionization lines such as HeII or NeV is particularly found in this sample)
 - While strong leakage is still possible in not so extreme conditions, our XTREM subsample are great candidates for prodigious Ly α and LyC emission, being one of the closest analogs to the most extreme LAEs at $z > 6$ found by JWST
- Future HST/COS follow-up will confirm their xLAE and LCE candidacy and test the low-mass LAE/LCE regime



THANK YOU FOR YOUR ATTENTION!!



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Escape of Lyman radiation from galactic labyrinths
7-11 April 2025, OAC, Kolymbari, Crete



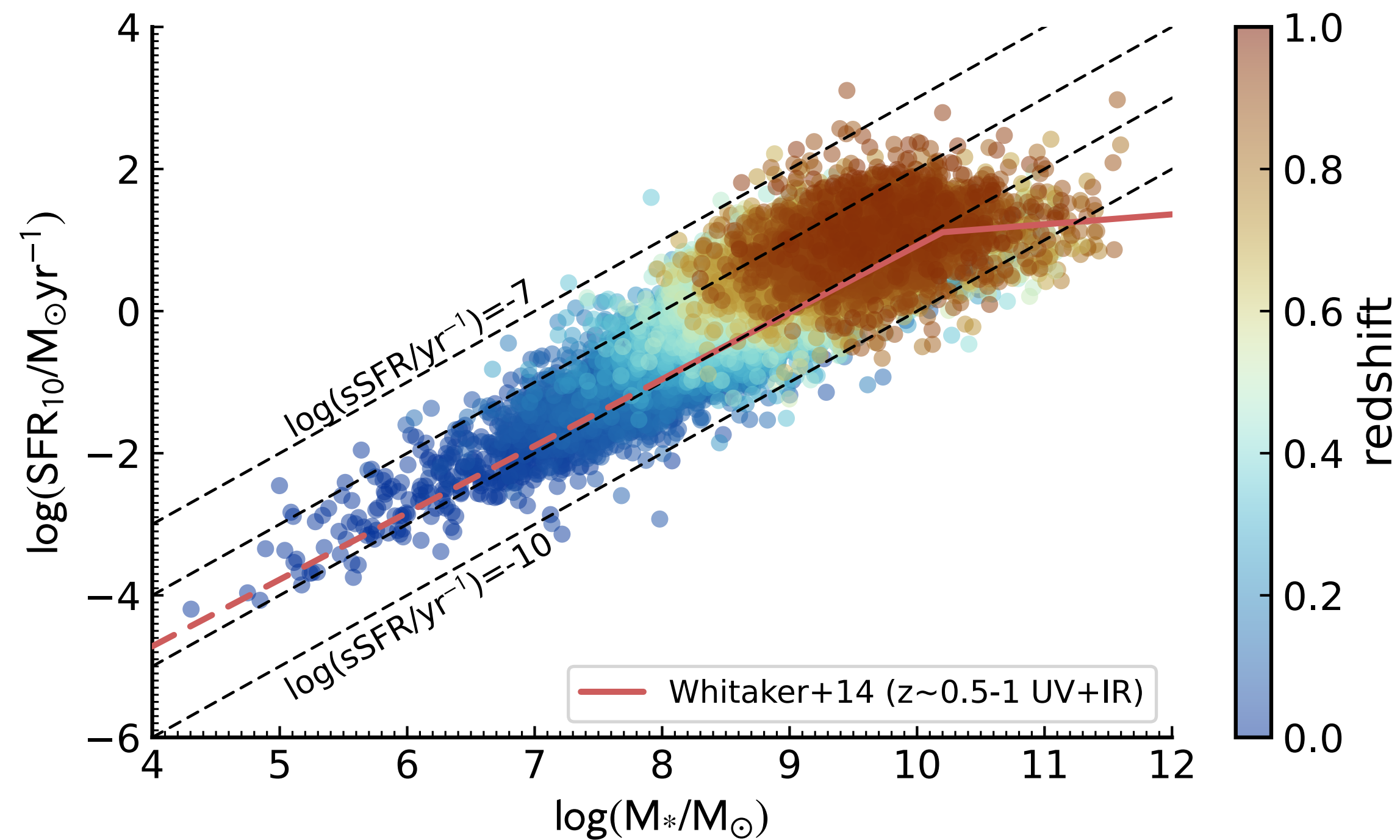
EELGs in DESI EDR

Scaling relations

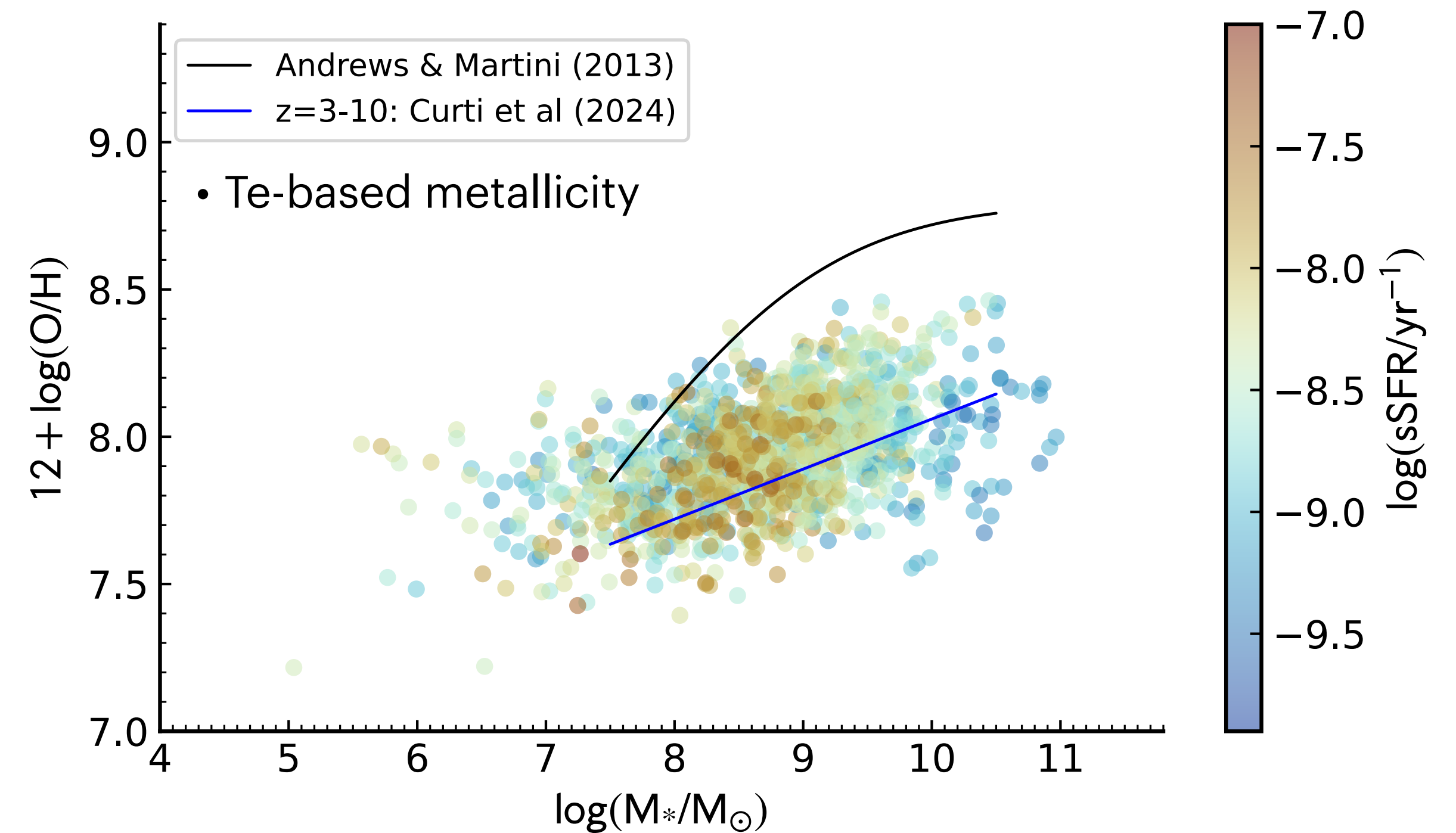
Preliminary results

- A very large sample allow us to probe mass-metallicity and other key scaling relations in excellent detail

Mass-SFR relation



Mass-metallicity relation



Amorín+25, in prep