

# Unveiling the properties of low-metallicity galaxies using bayesian tools

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# PLAN

**I-** Context & related questions

**II-** Modeling a galaxy

- ❖ Simple models
- ❖ Multi-sector modeling

**III-** PyMC3: a parameter inference bayesian tool

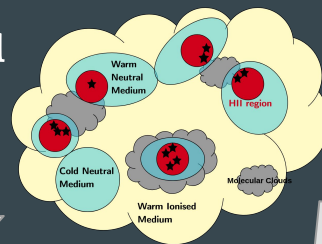
**IV-** Prospects with future missions



# CONTEXT AND BIG QUESTIONS

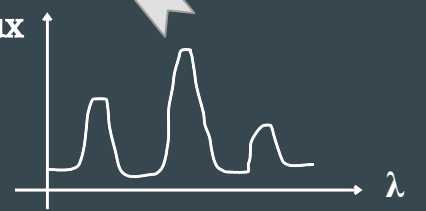
Local low-metallicity galaxies = best analog to understand primordial galaxies

Model



Structure of primitive galaxies ?

Flux



Redshift  $z$



$z \sim 7$

Billions of years ago

$z \sim 5$

$z = 0$

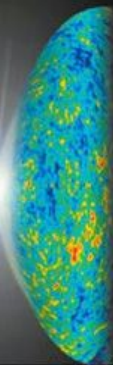
13.7

13.5

13.4

13

Big Bang



Neutral hydrogen and helium

Cosmic 'dark ages'

Recombination

First stars

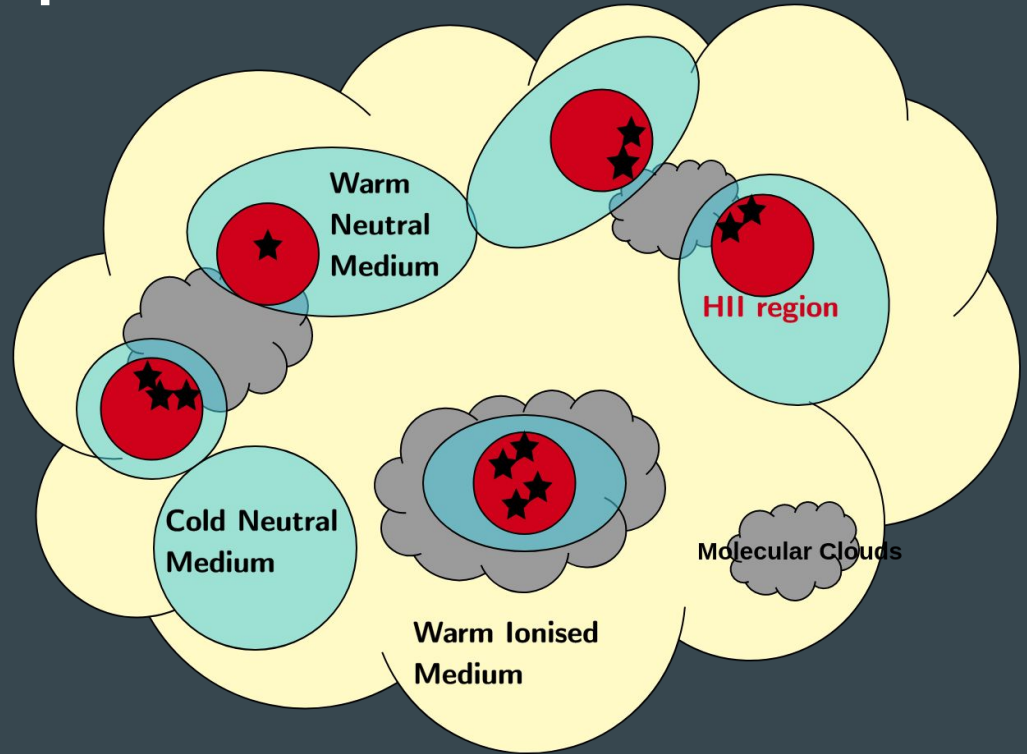
First galaxies

HUBBLE 2012

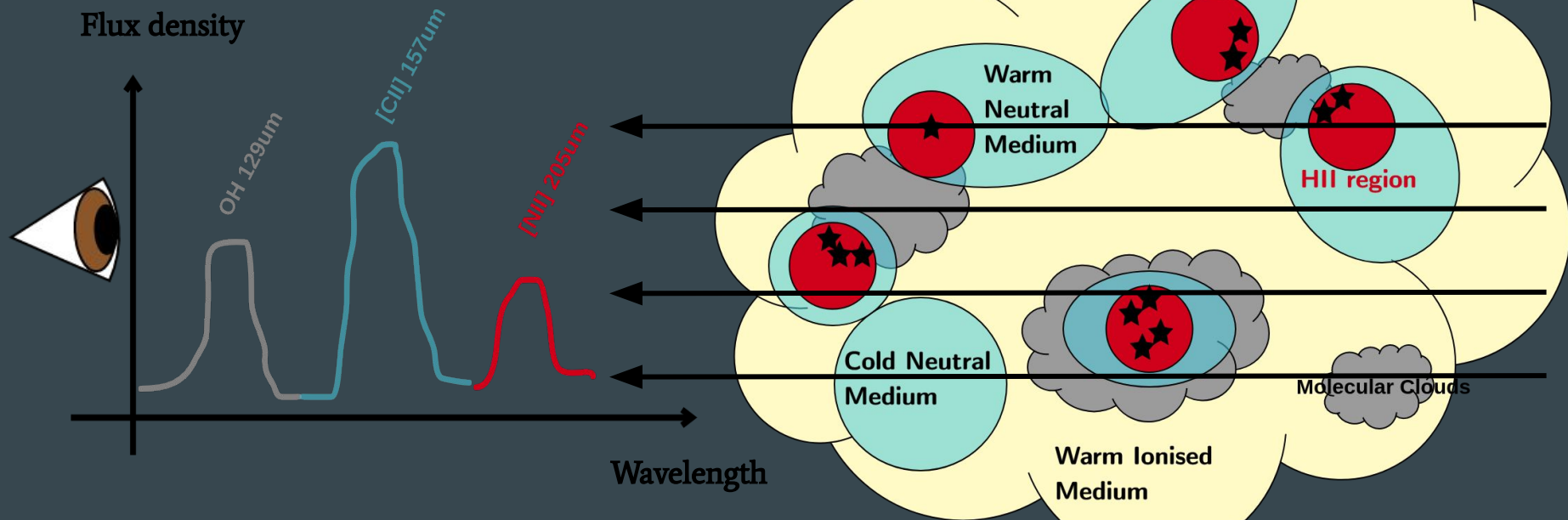
HUBBLE 2009

Reionization

# How do we model a galaxy ?

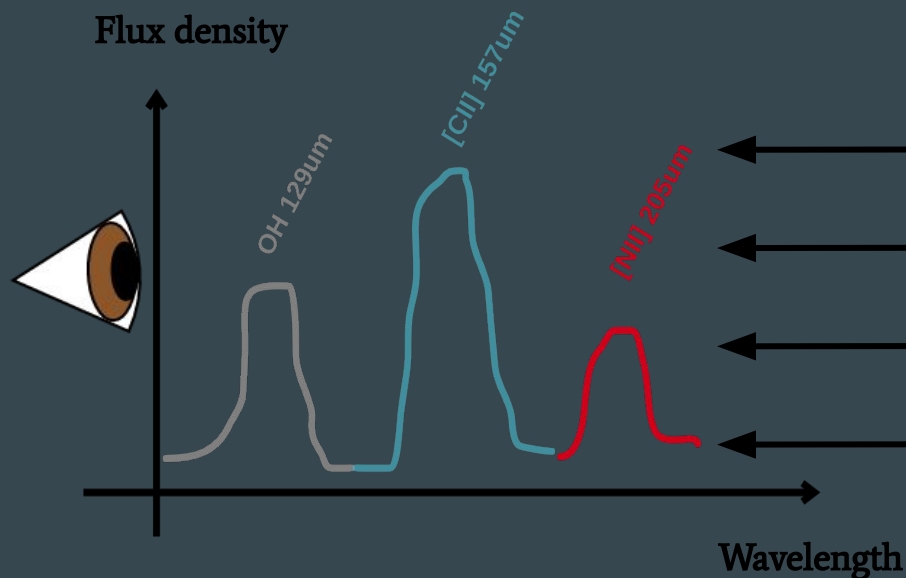


# How do we model a galaxy ?

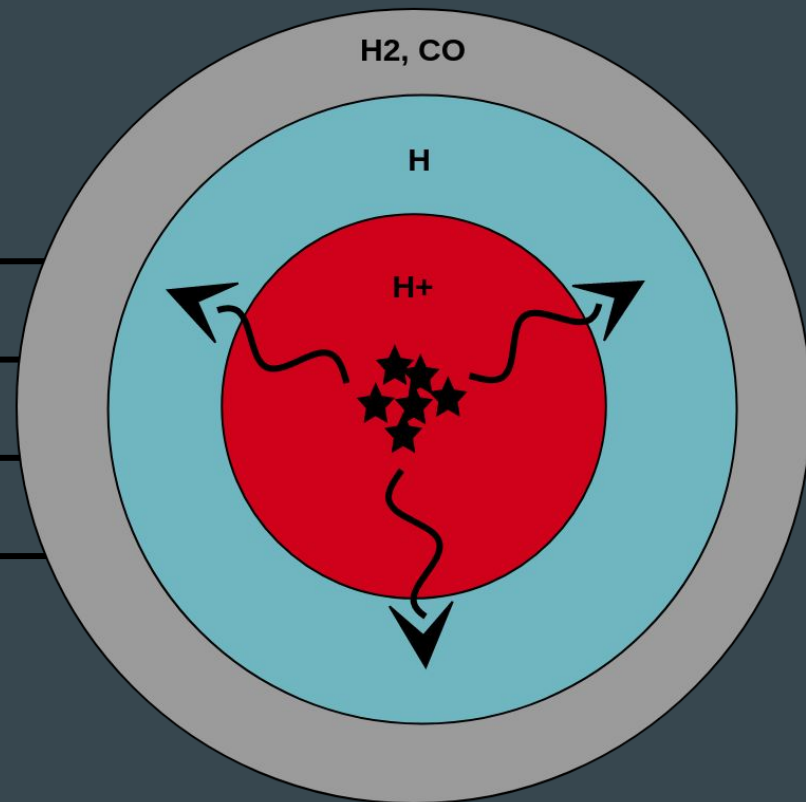


Spectral lines = integrated emission !

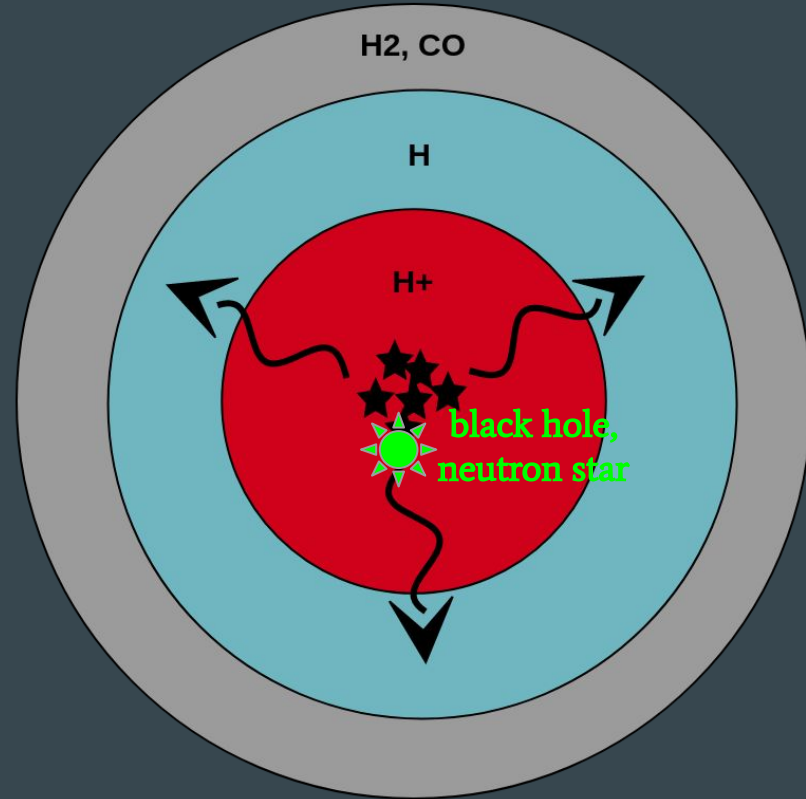
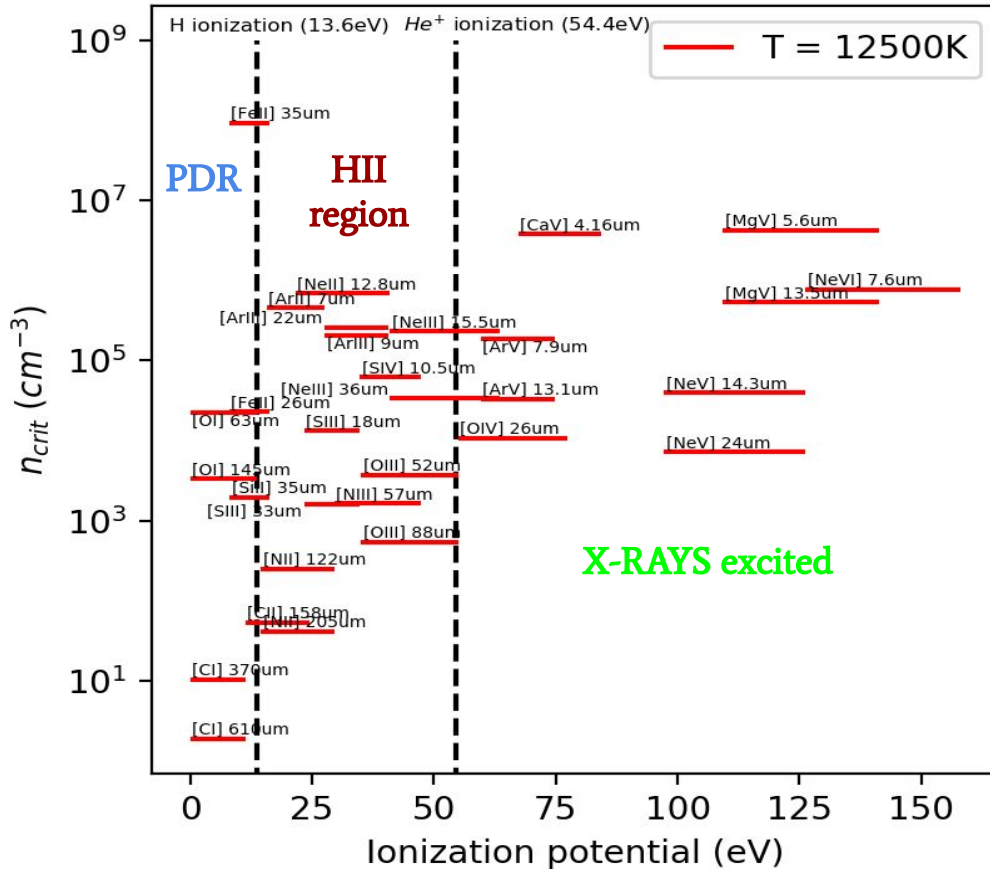
# Simplified representative model



Spectral lines = integrated emission !



# Different lines probe different zones





# Creating synthetic spectra with Cloudy (Ferland et al. 2017)

## Inputs:

- **incident spectrum** (stellar + X-ray source)
- **metal and dust** abundances
- **density/pressure** profile
- distance to the source (**ionization parameter**)
- additional corrections for dynamical effects (turbulence, shocks)



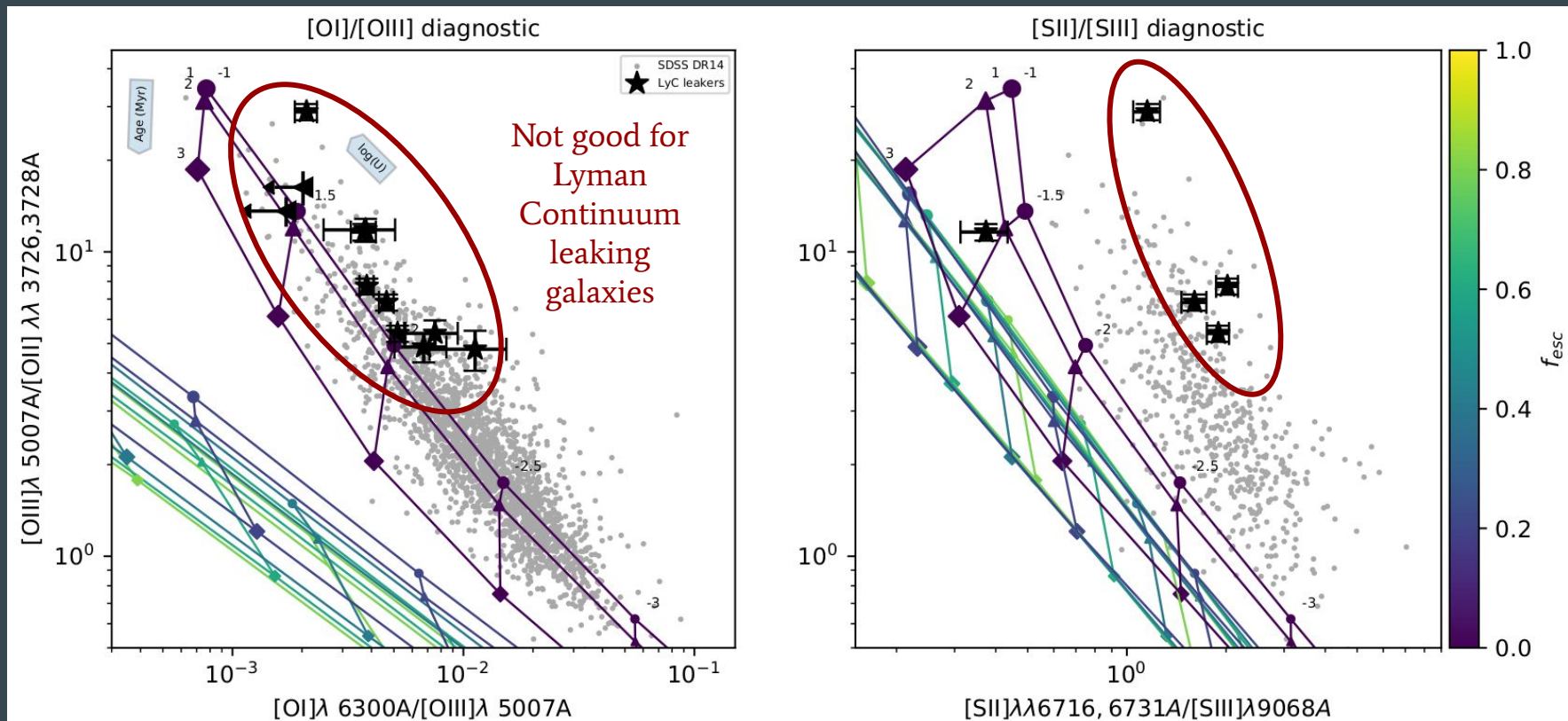
Radiative transfer  
& Chemistry  
(photo-ionization &  
photo-dissociation)

## Outputs

- lines fluxes
  - continuum fluxes
- ⇒ compared to observation
- temperature, density, pressure
  - ionization state for every specie
  - heating and cooling mechanisms
  - molecular gas content
- ⇒ what we want to know!

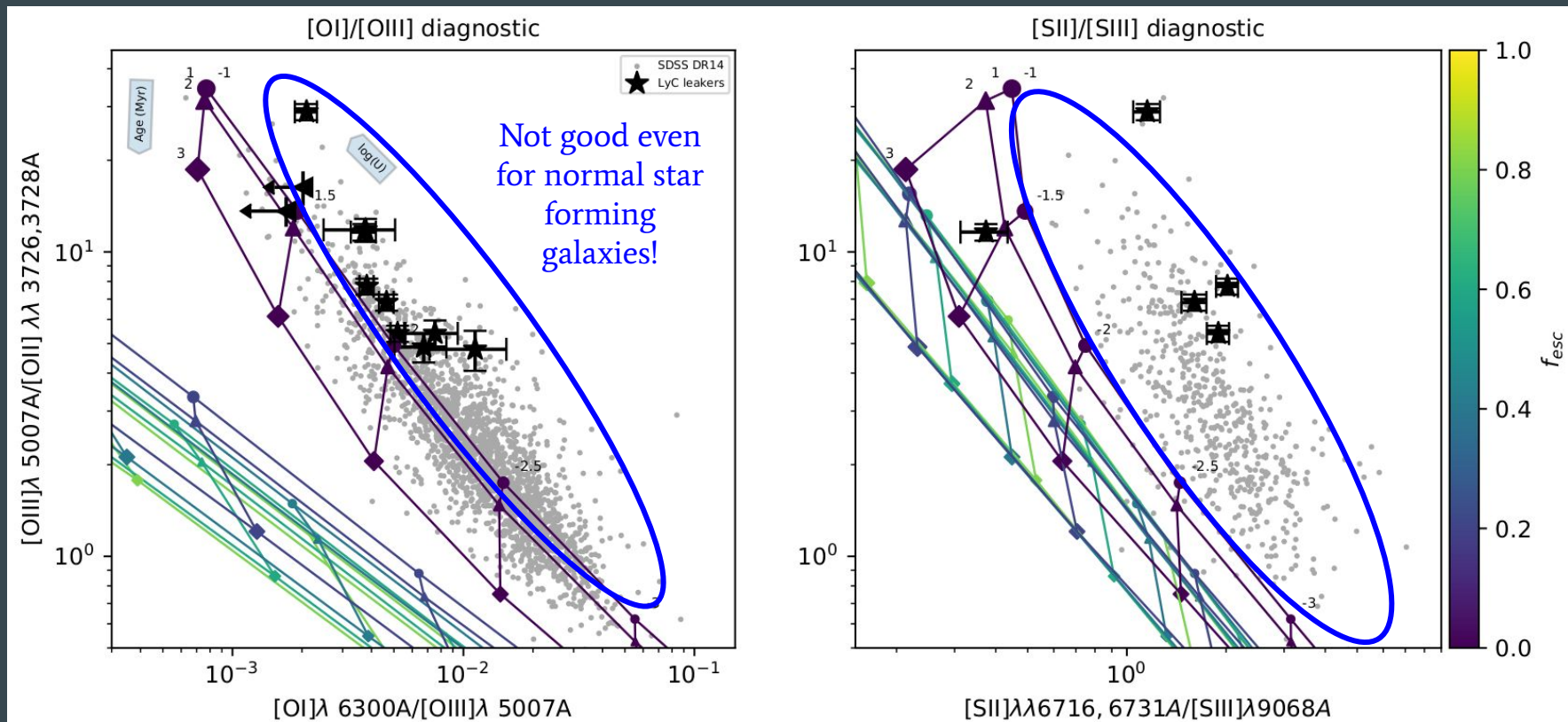
# Results of “simple” models

Ramambason et al. in prep



# Results of “simple” models

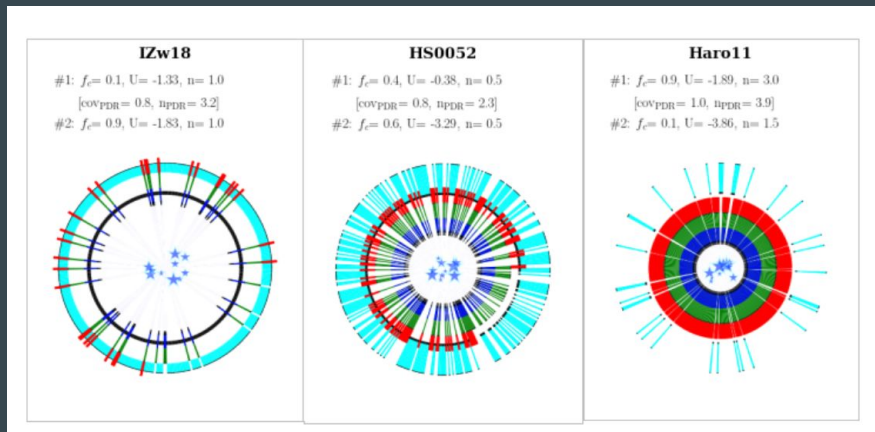
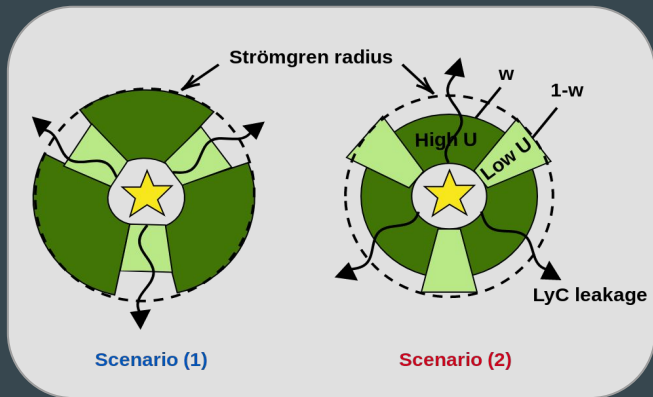
Ramambason et al. in prep



# Need of multi-sector modeling

Two-components... (Ramambason et al. in prep)

Or more complicated! (Lebouteiller et al. 2017)



## Parameter Space

N parameters  
(age, density, pressure,  
covering factors..)

NxP-dimensions grid of  
Cloudy models

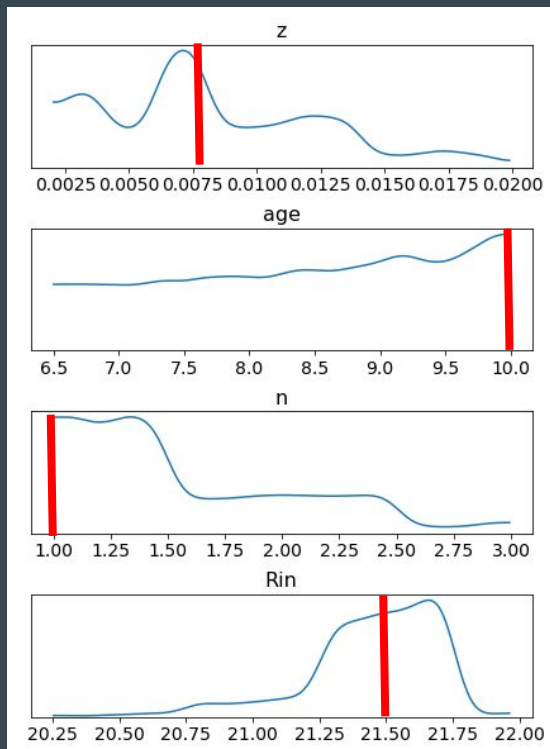


## Observable Space

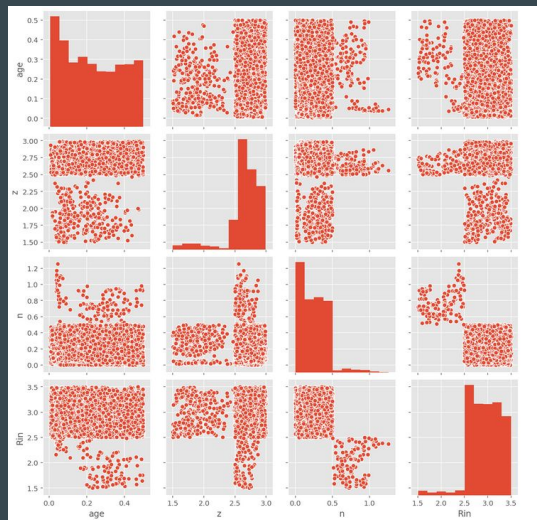
P spectral lines  
= constraints

# First results applied on synthetic observations

Probability distributions of parameters



Bayesian statistics (PyMC3)  
+ MCMC sampling

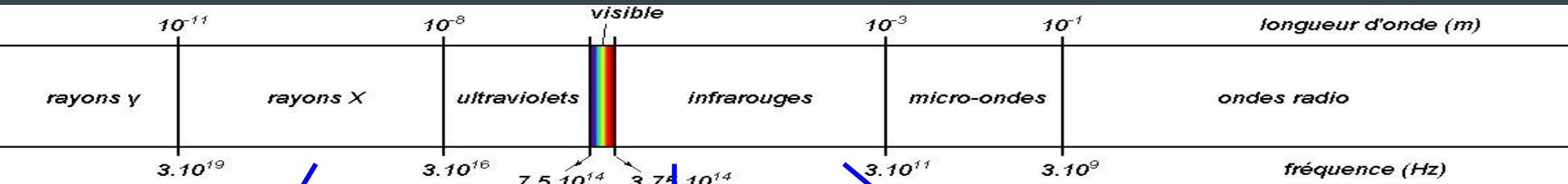


Observations in  
optical, infrared  
domain

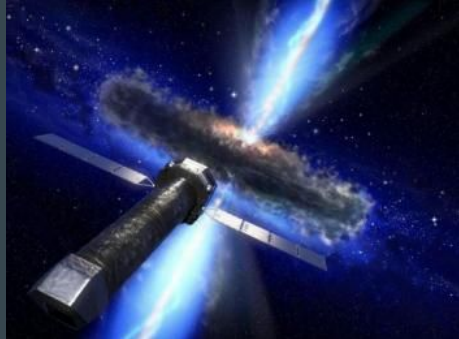
Why?

- more robust to outliers
- can include priors on the parameter
- possibility to use upper limits

# Prospects in the context of future spatial missions



Athena (developing phase)



SPICA (pre-selected by ESA)

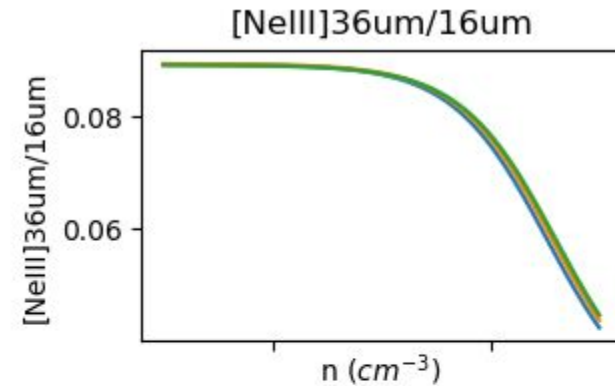
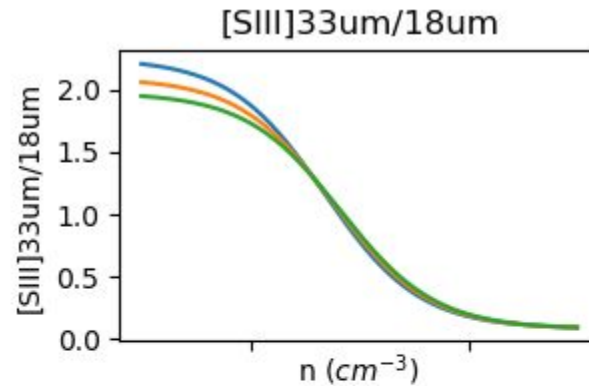
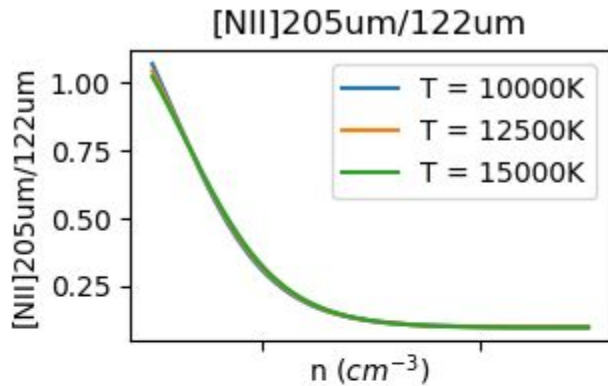


JWST (launch in ~2021)



**Thank you for your attention !**

# Results of “simple” models



Lines ratios  $\rightarrow$  parameter of the models

$\rightarrow$  properties of the galaxies

$\Rightarrow$  **Mean parameters averaged on the whole galaxy**

Good iff:

- **morphology** is not too messy
- **the interstellar medium properties are globally uniform**