

## SALSA: A Python Package for Constructing Synthetic Quasar Absorption Line Catalogs from Astrophysical Hydrodynamic Simulations

Brendan I. Boyd<sup>1</sup>, Devin W. Silvia<sup>2</sup>, Brian W. O'Shea<sup>1, 2, 3</sup>, Jason Tumlinson<sup>4, 5</sup>, Molly S. Peeples<sup>4, 5</sup>, and Nicholas Earl<sup>4</sup>

 Department of Physics and Astronomy, Michigan State University 2 Department of Computational Mathematics, Science and Engineering, Michigan State University 3 National Superconducting Cyclotron Laboratory, Michigan State University 4 Space Telescope Science Institute 5 Department of Physics & Astronomy, Johns Hopkins University

## Introduction

The hot, low density gas surrounding galaxies, called the circumgalactic medium (CGM), is vital to understanding the structure and evolution of galaxies (Tumlinson, Peeples, & Werk, 2017; Voit et al., 2017). The diffuse nature of the CGM makes it difficult to observe by direction detection in emission, so much of our understanding comes from studying absorption line features in the spectra of light from distant quasars that pass through intervening galaxies (Howk et al., 2017; Lehner et al., 2018). A single quasar sightline only contains information about a relatively small portion of gas in the halo of an individual galaxy. Because of this, observational astronomers conduct surveys to collect many sightlines and create large absorber catalogs that contain information about the variety of absorption lines found in each individual sightline. These catalogs create a statistical picture of the CGM and have proved invaluable

As a complement to observational surveys, hydrodynamic simulations have also become increasingly important for studying the CGM and efforts have been made to apply absorption line analysis to simulated data (Egan, Smith, O'Shea, & Shull, 2014; Peeples et al., 2019; Smith, Hallman, Shull, & O'Shea, 2011). Trident<sup>1</sup> is a Python package, built off of yt<sup>2</sup> (Turk et al., 2011), that can extract an artificial sightline, referred to as a "LightRay" in the code, from simulation data and then generate synthetic spectra from that sightline (Hummels, Smith, & Silvia, 2017). Analyses using Trident provide the opportunity to explore simulations from an observer's perspective, which facilitates making direct comparisons to observational studies. In this way, Trident provides a new avenue of study for simulators. However, a straightforward, streamlined process for replicating observational absorber catalogs is not yet readily available.

## **Statement of Need**

In order to fill this void, we introduce the Python package, SALSA (Synthetic Absorption Line Surveyor Application). SALSA is a package that generates synthetic absorber catalogs by studying the LightRays and/or spectra generated using Trident. SALSA provides an automated pipeline to process large numbers of LightRays and extract absorber information into a catalog

<sup>1</sup>https://trident.readthedocs.io/en/latest/ <sup>2</sup>https://yt-project.org/

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in our understanding of the dynamics in the CGM.

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#### Software

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for further analysis. One large benefit to studying these synthetic catalogs is the ability to directly compare to observational catalogs. This can give new insights into the data as well as help facilitate collaboration between simulators and observers.

### Summary

Two separate methods are made available to extract absorbers. The "Spectacle method" uses the Python package Spectacle<sup>3</sup> to fit Voigt profiles to the synthetic spectra generated by Trident (see Figure 1) (Earl & Peeples, 2019). This method provides traditional absorption line information (e.g., Doppler broadening, equivalent width) and thus creates synthetic absorber catalogs very similar to those made from observational studies.

The second method, called the "SPICE (Simple Procedure for Iterative Cloud Extraction) method," is a novel method that uses cell level data from the simulation to find the contiguous groups of cells which will meaningfully contribute absorption line features to the synthetic spectra. It does this through an iterative process that isolates the regions along the LightRay with the highest number density values and returns those regions with observationally detectable column densities as individual absorbers (see Figure 1 or for more details, the documentation<sup>4</sup>). This method provides direct access to the information contained in the simulation (e.g., temperature, velocity, metallicity) and, in turn, more information than can be provided by spectral absorption line analysis alone.



**Figure 1:** These plots were generated using FOGGIE simulation data (Peeples et al., 2019). The top plot shows the number density profile of O VI along the length of the LightRay. The shaded regions were found by the SPICE method and represent the absorbers that would be extracted. The bottom plot shows the synthetic spectra for that same LightRay. The dashed lines represent the two absorption lines that Spectacle fit to the spectra.

<sup>3</sup>https://spectacle-py.readthedocs.io/en/latest/

<sup>&</sup>lt;sup>4</sup>https://salsa.readthedocs.io/en/latest/

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Each method has its own advantages and disadvantages depending on the research goals. Spectacle extracts absorbers in a way that is much more analogous to that of observational studies and thus can more easily be used to make "apples-to-apples" comparisons between simulations and observations. The SPICE method, on the other hand, retains much of the additional information provided by simulation data, allowing for more in-depth analysis of the properties of absorbers and how those relate to the simulated galaxy as a whole.

Once a synthetic absorber catalog is generated, analysis of the data can proceed from an observer's perspective. Coupling this analysis with the unprocessed simulation data can bring powerful insights about how the CGM functions and how observations might provide a limited view into this complex medium. Current research efforts with the FOGGIE collaboration<sup>5</sup> are leveraging SALSA to study O VI absorbers in the CGM. Further work will assuredly provide more discoveries and better connect the cutting-edge research done by computational and observational astronomers studying the CGM.

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