JexoSim 2.0: End-to-End JWST Simulator for Exoplanet Spectroscopy - Implementation and Case Studies

Subhajit Sarkar¹ *†, Nikku Madhusudhan²

¹School of Physics and Astronomy, Cardiff University, The Parade, Cardiff, CF24 3AA, UK.

Last updated 2020 June 10; in original form 2013 September 5

ABSTRACT

The recently developed JWST Exoplanet Observation Simulator (JexoSim) simulates transit spectroscopic observations of exoplanets by JWST with each of its four instruments using a time-domain approach. Previously we reported the validation of JexoSim against Pandexo and instrument team simulators. In the present study, we report a substantially enhanced version, JexoSim 2.0, which improves on the original version through incorporation of new noise sources, enhanced treatment of stellar and planetary signals and instrumental effects, as well as improved user-operability and optimisations for increased speed and efficiency. A near complete set of instrument modes for exoplanet time-series observations is now included. In this paper we report the implementation of JexoSim 2.0 and assess performance metrics for JWST in end-member scenarios using the hot Jupiter HD 209458 b and the mini-Neptune K2-18 b. We show how JexoSim can be used to compare performance across the different JWST instruments, selecting an optimal combination of instrument and subarray modes, producing synthetic transmission spectra for each planet. These studies indicate that the 1.4 µm water feature detected in the atmosphere of K2-18 b using the Hubble WFC3 might be observable in just one transit observation with JWST with either NIRISS or NIRSpec. JexoSim 2.0 can be used to investigate the impact of complex noise and systematic effects on the final spectrum, plan observations and test the feasibility of novel science cases for JWST. It can also be customised for other astrophysical applications beyond exoplanet spectroscopy. JexoSim 2.0 is now available for use by the scientific community.

Key words: exoplanets, simulators, space telescopes

1 INTRODUCTION

Since the discovery of the first extra-solar planets a quarter of a century ago (Mayor & Oueloz 1995; Wolszczan & Frail 1992), our understanding of planets around other stars has expanded greatly. We know of the existence of over 4000 exoplanets covering a diverse range of sizes, masses, temperatures and orbital configurations. We find that our Solar System is far from typical in the Galaxy. The discovery of diverse planets in wide-ranging system architectures has challenged planet formation and evolution theories, with a need to understand the factors and conditions that bring about the diversity seen. To this end, atmospheric spectroscopy characterises exoplanets by obtaining compositional, structural and dynamic information of their atmospheres (Madhusudhan 2019). The atmospheric compositions can in turn provide important insights into planetary formation and evolution mechanisms. Spectroscopy is also key in the search for biosignature gases indicative of life (Seager 2014; Schwieterman et al. 2018). Atmospheric spectroscopy of exoplanets has been achieved through the transit-based techniques of transmission and eclipse spectroscopy (Seager & Sasselov 2000; Charbonneau et al. 2002; Grillmair et al. 2008; Deming et al. 2013), as well as direct imaging (Konopacky et al. 2013; Janson et al. 2010). The latter, while not constrained by the need for transits, is currently limited to studying young gas-giant planets at wide separations from their host stars.

Transmission spectroscopy depends on wavelength-dependent absorption of stellar light by atmospheric atomic and molecular species, as the planet transits in front of the star (e.g., Charbonneau et al. 2002; Sing et al. 2016; Diamond-Lowe et al. 2020). This technique probes the high altitude atmosphere of the planet day-night terminator, returning a spectrum consisting of $(R_D/R_s)^2$ with wavelength, where R_D is the apparent planet radius and R_S is the star radius. It has been applied in the visible and near-infrared wavelength ranges where the star is brighter, allowing higher signal-to-noise, thereby making detection of the spectral features of key chemical species more accessible at these wavelengths. Eclipse spectroscopy depends on the occultation of the planet's reflection and emission flux as it passes behind the star (secondary eclipse). The eclipse depth variations with wavelength give the spectrum of $F_p/(F_s + F_p)$, where F_p is the planet flux and F_s is the stellar flux. Eclipse spectroscopy provides constraints on the temperature structure and composition of the dayside atmosphere (e.g., Stevenson et al. 2014; Line et al. 2013; Madhusudhan 2018).

The Hubble space telescope has been used to great effect in obtaining transmission spectra of exoplanets using instruments such as

²Institute of Astronomy, University of Cambridge, Madingley Road, Cambridge CB3 0HA, UK

^{*} Contact e-mail: subhajit.sarkar@astro.cf.ac.uk

[†] School of Physics and Astronomy, Cardiff University, The Parade, Cardiff, CF24 3AA, UK

¹ https://exoplanetarchive.ipac.caltech.edu/

STIS, NICMOS, ACS and WFC3 (Charbonneau et al. 2002; Swain et al. 2008; Pont et al. 2008; Sing et al. 2011; Kreidberg et al. 2014) however the passbands of the spectra obtained are narrow (e.g. 1.1-1.7 µm for the Hubble WFC3) so that only small fraction of the spectrum is revealed. The Spitzer space telescope has also been used to obtain transmission and emission spectra, but these consisted of just a few photometric bands (Agol et al. 2010; Knutson et al. 2011; Deming & Knutson 2020). Ground-based facilities are hampered by the infra-red absorption windows of the Earth's atmosphere, as well as having to contend with atmospheric scintillation and turbulence effects. Wider wavelength coverage is desirable to reduce degeneracies and overcome impact of clouds (Barstow et al. 2015; Kreidberg et al. 2014; Sing et al. 2016; Madhusudhan 2019; Welbanks & Madhusudhan 2019). The next generation of transmission and emission spectra will be obtained from space-based observatories with wide wavelength coverage such as the James Webb Space Telescope (JWST) (Gardner et al. 2006) and Ariel (Tinetti et al. 2018), greatly improving the quality and quantity of exoplanet spectra obtained.

JWST is planned for launch in 2021. All four instruments on board are able to perform transit spectroscopy of exoplanets. These are the Near Infrared Imager and Slitless Spectrograph (NIRISS) (Doyon et al. 2012), the Near Infrared Camera (NIRCam) (Beichman et al. 2012), the Near Infrared Spectrograph (NIRSpec) (Ferruit et al. 2014), and the Mid-Infrared Instrument (MIRI) (Rieke et al. 2015). Combined, these instruments provide a wavelength coverage from 0.5 to 28.3 μm . JWST's 6.5m primary mirror will be largest to date in space, reducing photon noise to unprecedented levels. Reduced photon noise however could mean that other noise sources and systematics become more important and impact the data. For JWST therefore, it is particularly important to consider additional sources of noise or systematic trends that could possibly confound the detection of small signals such as exoplanet atmospheric signatures afforded by its low photon noise. Proper accounting of all errors is also crucial when establishing the final experimental uncertainties of a study including the impact of correlated noise. The size of the final error bars on the planet spectrum impacts the uncertainties in spectral retrievals (e.g. Madhusudhan & Seager 2009; Line et al. 2013; Waldmann et al. 2015; Madhusudhan 2018) and the scientific conclusions of a study. Simulators that model the instrumental and astrophysical noise, as well as systematics, during an observation can help to assess the performance of JWST. They can be used in the planning and optimisation of observational and data reduction strategies, and for testing the feasibility of specific science cases.

Since transit spectroscopy is a time-domain technique it is particularly vulnerable to time-dependent systematic trends from both the instrument, such as detector persistence (Berta et al. 2012), or from astrophysical sources, such as spot occultations and stellar variability (Rackham et al. 2018; Pont et al. 2006). In addition, time-correlated noise, e.g from pointing jitter or stellar granulation or pulsation (Sarkar et al. 2018), can inflate the final uncertainties and needs to be properly accounted for (Pont et al. 2006). Most simulators for JWST do not model the time-domain directly, but estimate the final noise on the transit depth through a static calculation. This approach leads to rapid computations which is ideal for assessing large sets of planets, however they lack the functionality to model time-correlated noise or time-dependent systematic trends. Pandexo (Batalha et al. 2017) simulates all four JWST instruments giving signal-to-noise (SNR) estimates based on set of complex computations using the Pandeia engine (Pontoppidan et al. 2016). While Pandexo generates 2-D detector images allowing it to model spatially-correlated noise sources, it does not produce a frame-by-frame time-domain simulation which limits its ability to model complex time-dependent processes. Simulators that have been produced by individual JWST instrument teams include the NIRISS SOSS 1-D² (Beichman et al. 2014) and 2-D simulators³, a 1-D simulator developed for NIRCam and MIRI (Greene et al. 2016), PyNRC for NIRCam ⁴ (Leisenring 2018), the NIRSpec instrument performance simulator (Piquéras et al. 2010) and the NIRSpec Exoplanet Exposure Time Calculator (NEETC) (Nielsen et al. 2016). To our knowledge these do not produce frame-by-frame time-domain simulations.

We developed the first version of JexoSim (the JWST Exoplanet Observation Simulator) (Sarkar et al. 2019) to fill this gap in the range of simulators available for JWST. Uniquely, JexoSim can simulate exoplanet transit observations using all four JWST instruments using a frame-by-frame time-domain approach, generating 2-D image time-series akin to an actual observation. It can model and capture the effects of time-correlated noise and systematic trends. JexoSim can also capture 2-D spatial- and wavelength-dependent systematics, and the potentially complex interaction between spatial and temporal processes, allowing measurement of their ensemble impact directly on the planet spectrum.

In the previous work (Sarkar et al. 2019), we described the JexoSim algorithm in detail and validated the simulator against Pandexo and instrument team simulators. In the current work, we report an enhanced version, JexoSim 2.0, with new noise sources, added instrumental effects including quantum yield and inter-pixel capacitance and enhanced fidelity in the stellar and planetary signal processing algorithm. We have made it faster, more versatile and easier to use. User-operability has been greatly improved with several architectural changes including a simplified user interface and installation procedure, together with more up-to-date and reduced number of dependent packages. In additional, a number of optimisations have been implemented to improve speed, reduce memory pressure, and enable the simulation of observations with very large numbers of integrations. We now include a near complete set of JWST instrument modes designated for exoplanet time-series observations. With these enhancements JexoSim 2.0 is now available to the community⁵.

In this paper, we describe the upgrades made in JexoSim 2.0 and provide a guide to its implementation. We then use the simulator to assess JWST performance metrics for specific case studies. We focus on exoplanet transmission spectroscopy using two end-member scenarios: the hot Jupiter HD 209458 b and the mini-Neptune K2-18b. We perform simulated observations using all four JWST instruments and demonstrate different simulation recipes. These include using Allan deviation analysis and Monte Carlo simulations to obtain precision on transit and eclipse depths and a noise budget analysis. We use JexoSim to assess which instrumental configurations are optimal for these end-member scenarios.

2 JEXOSIM 2.0

JexoSim 2.0 is a time-domain simulator of exoplanet transit spectroscopy using JWST and it four instruments, designed to test and validate specific and novel science cases for JWST observation. Both primary and secondary transits can be simulated, as well as out-of-transit (OOT) observations. Time-series images are generated representing the sequence of non-destructive reads (NDRs) per integration. The images can be processed using an included pipeline

http://maestria.astro.umontreal.ca/niriss/simu1D/simu1D.php

https://github.com/jasonfrowe/JWSTNIRISS

⁴ https://github.com/JarronL/pynrc

⁵ https://github.com/subisarkar/JexoSim

for immediate results, or stored in FITS format for later analysis. Simulated planet spectra with error bars can be generated, which can be used to test the detectability of atmospheric features, e.g. through spectral retrieval studies. Alternately signal and noise information from the OOT stellar signal can be extracted. Nearly all JWST instrument configurations dedicated to time-series exoplanet spectroscopy are now included in JexoSim 2.0, with their available subarray modes (Figure 1), although the MIRI Medium Resolution Spectrograph (MRS) mode is currently not simulated. In NIRISS only the first order spectrum from the GR700XD grism is currently simulated.

Next, we describe the upgrades made in JexoSim 2.0 in architecture, algorithm, dependencies and optimisations.

2.1 Architecture

The architecture of JexoSim 2.0 is outlined in Figure 2. A core sequence of modules is supported with databases and reference files, with various inputs and outputs to the system including an optional pipeline. Here we briefly discuss these components.

2.1.1 Modules

JexoSim 2.0 retains from the original version the sequence of modules that executes the processing algorithm (Sarkar et al. 2019). The modules simulate the flow and modulation of the signal from the star to the detector followed by the generation of a time-series image stack of non-destructive reads (NDRs). The modules however now refer to dedicated libraries that hold associated functions, while the modules themselves control the calling of these functions. This organisation will aid future augmentation allowing for easier upgrades and addition of new functions.

2.1.2 Inputs

To improve user operability, full control over the simulation is now achieved through a new text-based 'input parameters file' (Figure 2). This file gives the user wide control over the simulation parameters and can be edited or duplicated to run particular simulation scenarios. A new 'paths file' (also a text file) allows the user to specify the path of the output folder for results. As in the previous version, default simulation and instrument parameters are held in XML-based configuration files which link to specific reference files (e.g. transmissions, wavelength solutions etc.). A new params class mediates the interaction of the input parameters file with the rest of the code modifying default values held in the XML files. A new set of XML files has been added for extra-solar system ('exosystem') parameters. When an exoplanet is first referenced from the planet database (see Section 2.3), an XML file containing the system parameters is generated and then re-used in subsequent simulations of the same system. A new set of files called 'recipe' files have been added which control patterns of simulation, types of results and outputs. The code will select a particular recipe depending on choices made in the input parameters file.

2.1.3 Outputs

The time-series of NDR images is the final output of the signal processing algorithm. This can be packaged into FITS format for processing by an external pipeline. Alternately, the user can choose to process the images through the included JexoSim pipeline for

immediate results. The main steps in this pipeline are shown in Figure 2 and described in detail in Sarkar et al. (2019). If processed through the pipeline, the output files are produced in .pickle format (containing processed data) and .txt format (containing parameters from the input parameters file or derived from the simulation itself). All output files are dumped to the specified output folder.

2.2 Algorithm

The original signal processing algorithm (the sequence of calculations executed in the modules) was described in detail in Sarkar et al. (2019) and illustrated in Fig. 1 of that paper. In the new version, the algorithm code has been refactored for efficiency and the entire JexoSim code updated from Python 2 from Python. Modifications to the algorithm are described below. A summary of the algorithm and changes made in JexoSim 2.0 is illustrated in Figure 3.

2.2.1 Stellar and planetary spectra

To account for resolution-linked bias (RLB) (Deming & Sheppard 2017), JexoSim 2.0 has a modified treatment of the star and planet spectra. The bias refers to a mismatch between the real transit depth in a spectral bin and that predicted using a transit spectrum model if the model utilises insufficient spectral resolution. If the planet spectrum, $p(\lambda)$, is binned (or convolved with the PSF) prior to it modulating the out-of-transit stellar spectrum, $F_s(\lambda)$, this bias is likely to result, and the fidelity of the simulation reduced. The bias increases when absorption lines from the star and planet overlap. To maximise fidelity by minimising the RLB effect, JexoSim now multiplies the planet spectrum into the stellar spectrum early in the algorithm while both are at their highest resolution (Figure 3). The 'in-transit' stellar spectrum, is next obtained: $F_{s,it}(\lambda) = F_s(\lambda)[1 - 1]$ $p(\lambda)$]. The in-transit and out-of-transit stellar spectra are then treated in exactly the same way through a sequence of steps ending with the production of a 2-D focal plane array for the out-of-transit signal, $FPA_{oot}(X, Y)$, and the in-transit signal, $FPA_{it}(X, Y)$, where X and Y are pixel coordinates. Figure 3 summarises these steps and a full description is given in Sarkar et al. (2019). We obtain the ratio of these 2-D arrays, FPA_{it}/FPA_{oot} , and then find the average ratio per pixel column, $\langle FPA_{it}(X)/FPA_{oot}(X)\rangle$. This returns a 1-D array. Subtracting this 1-D array from 1, gives p(X), the planet spectrum correctly modulated by the instrument response (Figure 3). p(X) is used as the input to generating the light curve 2-D array, LC(X,Y,t), where t corresponds to the time of a subintegration 6 . FPA_{oot} is used to generate the subintegration time-series, S(X,Y,t), which is modulated by the light curves, systematics, backgrounds and noise (Figure 3).

To minimise RLB the user can supply both the planet spectrum and the star spectrum at very high resolution. JexoSim allows for the user to supply their own stellar and/or planet spectra through the options in the input parameters file (Table 2) (select file for options planet_spectrum_model and star_spectrum_model). As mentioned in Section 2.3, JexoSim uses a default stellar Phoenix BT-Settl spectrum database. For star parameters, 3000 K, logg 5.0, Fe/H = 0, this gives a spectrum with average *R*-power of ~ 390000

⁶ We use the term 'subintegration' to define as the count accumulated between two successive NDRs (i.e. the difference between them). Co-adding the subintegrations of an integration subsequently generates the ramped NDRs for that integration.

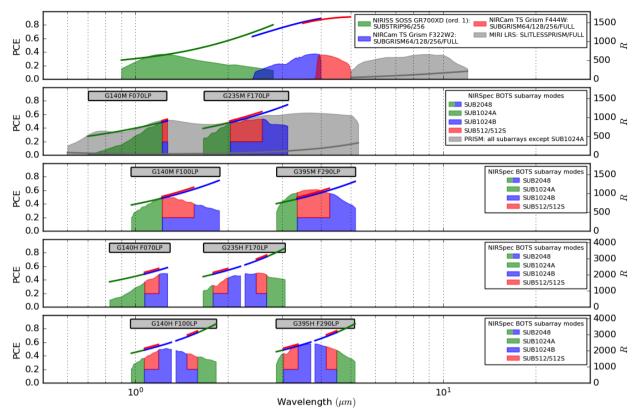


Figure 1. JexoSim 2.0 available instrument configurations shown with their photon-conversion efficiency (PCE) (upper bounds of shaded areas) and spectral resolving power (*R*) (floating lines) versus wavelength. Nominal wavelength ranges for each mode are shown. In NIRSpec the SUB512 and SUB512S modes have wavelength ranges which are subsets of the SUB1024B mode, hence where they overlap in range the colours are split between the modes (SUB512/SUB512S in red, SUB1024B in blue). SUB2048 encompasses the full wavelength range of each NIRSpec mode, i.e. the combination of green and blue areas. JexoSim 2.0 uses instrument-specific transmissions and quantum efficiency files from the Pandeia database (Pontoppidan et al. 2016), producing the final PCEs shown. The *R* power information is also derived from Pandeia. Where modes overlap, the *R* powers are slightly offset for clarity. SOSS = Single Object Slitless Spectroscopy. BOTS = Bright Object Time Series. TS Grism = Time Series Grism. LRS = Low Resolution Spectrometer.

between 0.05-5.5 µm. For the same star and wavelength range, high-resolution Phoenix spectrum by Husser et al. (2013) ⁷ give an average R-power of ~ 610000 , and can be used in JexoSim 2.0 by selecting for a user-supplied stellar file as described above ⁸. After selecting the star and planet spectra, the code must rebin these to a common wavelength grid (that of the spectrum with the lower resolution) to allow for array multiplication (Figure 3). Thus if the initial planet spectrum is provided at much lower R than the stellar spectrum, there will be some inevitable loss of fidelity (re: the RLB effect) due to rebinning at this stage. This can be minimised by providing both planet and star spectra at high resolution.

As an alternative to the user providing a specific planet spectrum as input, in JexoSim 2.0 we have added the capability to use the fully scalable ATMO model grid of transmission spectra produced by Goyal et al. (2018)⁹ for gaseous planets, as an option for the input planet spectrum. Alternately the user can select a 'simple' flat

planet transmission spectrum based on $(R_p/R_s)^2$ or a blackbody-based emission spectrum. Table 2 shows how to choose between these options in the input parameters file.

2.2.2 Backgrounds

JexoSim 2.0 uses the same zodiacal light and optical surfaces emission models developed for the previous version (Sarkar et al. 2019). In addition to these, JexoSim 2.0 now includes the thermal emission from the sunshield as a background source (with an associated Poisson noise contribution). We utilise the publicly-available plot of equivalent in-field sky irradiance vs wavelength for the sunshield from the JWST User Documentation Background Model webpage 10 . This is sampled using WebPlotDigitizer (Rohatgi 2020) and converted from MJy/sr to W/m²/µm/sr. A 7th-order polynomial is fitted to the sampled points. This polynomial is used to obtain the spectral flux density at the wavelength solution of the instrument above 7 µm. Below 7 µm, the flux is assumed to be negligible and set to zero. It is then processed in the same way as the zodi background, described in (Sarkar et al. 2019). This results in a 1-D array of photon count-rate per X pixel, $C_{Sunshade}(X)$, which is applied to the image time-series

https://phoenix.astro.physik.uni-goettingen.de/?page_id=15

⁸ These need to be first repackaged as text files with the first column giving the wavelength in μ m, and the second column the stellar flux density in W/m²/ μ m. The wavelength grid of these files extends from 0.5-5.5 μ m. JexoSim will return zero value for the stellar flux density outside this range, and thus these spectra are not suitable for MIRI LRS.

⁹ https://drive.google.com/drive/folders/1ZFbkPdqg37_ Om7ECSspSpEp5QrUMfA9J

¹⁰ Fig. 2 from https://jwst-docs.stsci.edu/jwst-observatory-functionality/jwst-background-model

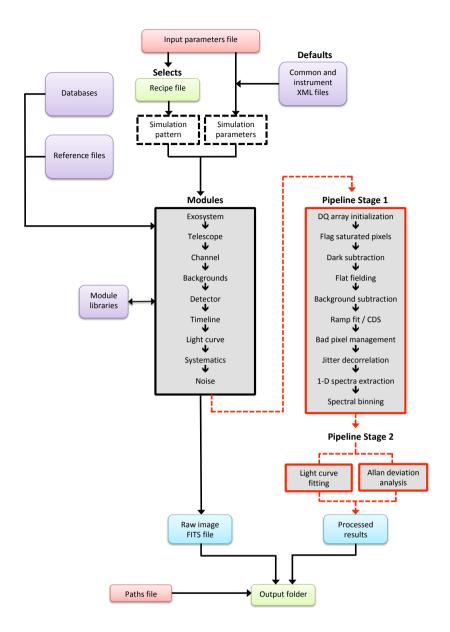


Figure 2. Overview of JexoSim 2.0 architecture. A new 'input parameters file' provides the user-interface and gives control over the simulation. Recipe files direct the pattern of the simulation, while XML files hold instrumental parameters, links to reference files and a default set of simulation parameters. The simulation proceeds through a sequence of 'modules'. These are described in Sarkar et al. (2019), together with the processing algorithm. Modifications to the algorithm in JexoSim 2.0 are illustrated in Figure 3. The modules now link to dedicated libraries. The final image stack is stored as FITS file or processed via the JexoSim pipeline.

as a background and contributes to the total Poisson noise (Figure 3). The list of current backgrounds is given in Table 1.

2.2.3 Noise and quantum yield

Noise sources in the original version of JexoSim (Sarkar et al. 2019) included: star (source photon noise), dark current, read-out noise, zodiacal reflected light and thermal emission, optical surfaces emission and pointing jitter. In JexoSim 2.0 we have added Poisson noise from the sunshade background and Fano noise (Figure 3). Table 1 lists the current noise sources simulated.

Fano noise is a type of photon-transfer noise (Janesick 2007), that

results from variation in the number of electron-hole pairs in the detector semi-conductor material per absorbed photon. The standard deviation is given by:

$$\sigma_f(\lambda) = \sqrt{F(\lambda)\eta(\lambda)} \tag{1}$$

where F is the Fano factor, and η is the quantum yield. The Fano factor is the ratio of the variance in the number of electrons generated to the average number of electrons generated per photon. We use the two-level approximation (valid for $\eta \sim 1$ to 2) for the Fano factor from McCullough et al. (2008), where $F = [(3\eta - 2) - \eta^2]/\eta$. Since both η and F are wavelength-dependent, the Fano noise is also. For $\eta = 1$, we obtain a Fano noise of zero e⁻. In the algorithm (Figure 3), both stellar and background photons are added and Poisson

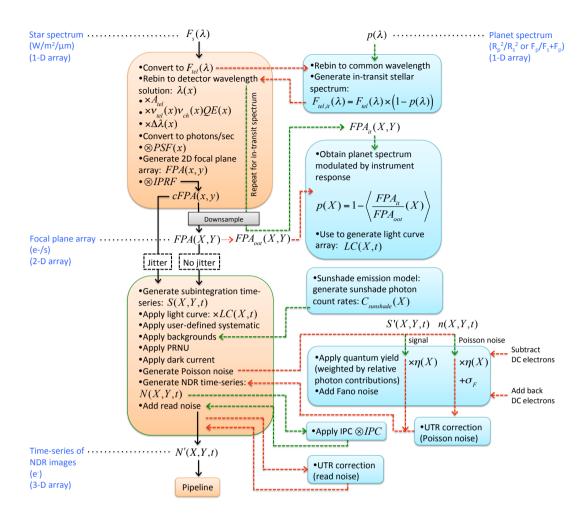


Figure 3. Simplified representation of the updated JexoSim algorithm. Right-hand side boxes (blue) show main changes in the algorithm introduced in JexoSim 2.0. Left-hand side boxes (orange) mostly follow the original algorithm, the details of which are completely described in Sarkar et al. (2019). X and Y are the spectral and spatial coordinates of whole pixels on the focal plane detector array, FPA(X,Y). An oversampled grid, FPA(x,y), is initially generated (for Nyquist-sampling of the PSF and jitter simulation), which has subpixel coordinates x and y. A_{tel} = telescope aperture area. v_{tel} = telescope transmission. v_{ch} = instrument channel transmission. $\Delta \lambda$ = wavelength span across subpixel in spectral direction. IPRF= 2-D intra-pixel response function. cFPA(x,y)= oversampled focal plane array convolved with intra-pixel response function. Other abbreviations are described in the figure or text.

variations to the photon numbers generated before the Fano noise is added. The wavelength-dependent quantum yield, $\eta(\lambda)$, is obtained for each instrument channel from the Pandeia database. For the point source we simply rebin this to the wavelength solution for each X pixel column, to give $\eta_*(X)$ for the stellar photons. For diffuse backgrounds, since a broad range of wavelengths will fall on each pixel (depending on the slit size used), a weighted quantum yield for each X pixel, $\eta_w(X)$ is calculated separately for each diffuse source. The quantum yield for each pixel on each subintegration, $\eta(X,Y,t)$, is found from the weighted average of $\eta_*(X)$ and $\eta_w(X)$ for each diffuse source, where the weights are the relative photon contributions on the pixel. For computational efficiency this weighted quantum yield is multiplied into all the signal and noise photons at a single step in the algorithm (Figure 3). The Fano noise is then simulated. For each pixel on each subintegration, $\sigma_F(X,Y,t) = \sqrt{SF\eta(X,Y,t)}$, where S is the number of photons on a pixel. This is used to apply

a random Gaussian variation in the electron count. For computation efficiency, the dark current is added prior to the generation of Poisson noise (so that Poisson noise generation is performed once), and thus its contribution to the signal and Poisson noise is subtracted prior to applying quantum yield and Fano noise (since dark current does not result from interacting photons), with the contributions added back after these steps.

2.2.4 Systematics and instrumental effects

The list of systematics and instrumental effects currently included are given in Table 1. As in the previous version, photo-response non-uniformity (PRNU) is included as a grid of pixel gain variations. Intra-pixel sensitivity variations can also be modelled using an intra-pixel response function described in Sarkar et al. (2019). In the new version, we have added inter-pixel capacitance (IPC)

Table 1. Summary of noise sources, backgrounds, systematics and instrumental effects included in JexoSim 2.0.

Effect	Туре	New in
		JexoSim 2.0
Noise	Star (source photon noise)	
sources	Dark current	
	Read-out noise	
	Zodiacal light	
	Optical surfaces emission	
	Sunshade emission	✓
	Fano noise	✓
	Pointing jitter	
Background	Dark current	
sources	Zodiacal light	
	Optical surfaces emission	
	Sunshade emission	✓
Systematics /	Optical transmissions	
instrumental	Wavelength solutions and spectral traces	
effects	PSF	
	PRNU	
	Intra-pixel sensitivity	
	Inter-pixel capacitance	✓
	Wavelength-dependent QE	
	Quantum yield	✓
	Pointing jitter	
	User-defined systematic	✓

(Giardino et al. 2012) for NIRISS, NIRCam and NIRSpec detectors. This is applied as a 2-D convolution in the algorithm (Figure 3). JexoSim 2.0 allows for the application of an externally-generated user-defined systematic grid, as a 2-D array which modulates the signal in time and wavelength dimensions. To use this function, inside the JexoSim/data/systematic_models/ folder must be placed a folder named for the specific systematic which contains text files for the systematic grid (containing the proportional change in signal), wavelength and time. The input parameters file option (Table 2) sim_use_systematic_model must be set to 1, and the name of the systematic model folder entered under sim_systematic_model_name.

There may be additional noise sources and systematics not yet represented in JexoSim. Notably we have not yet added the spatially-correlated read noise effect for NIR detectors (Rauscher et al. 2017). However, JexoSim has a versatile framework where noise sources and systematics can be added in the future, especially as our understanding of the instruments improve during operations. Astrophysical effects such as the impact of star spot effects, stellar pulsation and granulation, transits of exomoons or ring systems, and phase-dependent modulations can also be investigated using JexoSim by interfacing with external models directly or through the generation of time- and wavelength-dependent flux variation grids from such models which can then be used to modulate JexoSim light curves.

2.3 Dependencies

To reduce issues during installation and allow for better future up-keep, we have changed and reduced the dependencies in JexoSim 2.0.The main dependent packages are: PyTransit (Parviainen 2015), Astropy (Astropy Collaboration et al. 2013, 2018), Scipy (Virtanen et al. 2020), Numpy (Harris et al. 2020), Pandas (Wes McKinney 2010), Numba (Lam et al. 2015) and Matplotlib (Hunter 2007). A

dedicated setup process has been developed which imports each of these together with any sub-dependencies. A number of publiclyavailable databases are used with JexoSim 2.0. As in the previous version, the Pandeia database (Pontoppidan et al. 2016) is used to obtain transmissions and wavelength solutions for each instrument, and a Phoenix BT-Settl database is used for model star spectra (Allard et al. 2012)¹¹. We also use values from Pandeia for the instrument dark current, read noise, pixel full-well capacity values, IPC kernels, and quantum yield. Other instrument parameter values are obtained frrom Ressler et al. (2015), Space Telescope Science Institute (2018a), Space Telescope Science Institute (2018b), Space Telescope Science Institute (2018c) and Space Telescope Science Institute (2018d). As previously, WebbPSF (Perrin et al. 2012) is used to generate the point-spread-functions (PSFs) for each instrument, and limb-darkening coefficients (LDCs) are generated using ExoTETHyS (Morello et al. 2020). Both the PSFs and LDCs are precalculated. New in JexoSim 2.0 is the use of the NASA Exoplanet Archive¹ 'Planetary Systems' table as the database for extra-solar system parameters. Since this table provides results from multiple studies for a given planet, JexoSim first chooses values from the study which has the most complete set of parameter data. Remaining missing parameters are then selected from studies in order of most recent publication date. In rare cases where a parameter is completely missing, the user will be prompted to enter this manually (this only needs to be done once since the resulting exosystem XML file will be stored for later use).

2.4 Optimisation

The simulation of pointing jitter described in Sarkar et al. (2019) represented one of the slowest sections of the JexoSim algorithm, requiring repetitive sequential shifting of the image array at a subpixel level. In the previous version we used the scipy.weave function to interface with a section of code written in C that performed these shifts and improved speed. However, with the change to Python 3, this function can no longer be used. We use instead the Python optimisation package Numba, combined with its own parallelisation function for this part of the algorithm. This combination reduces jitter code processing times by an order of magnitude compared to standard Python. In addition we implement splitting the full image array into longitudinal sections, jittering each section (with the same jitter sequence) and then recombining the sections. This leads to an additional speed improvement by reducing the array size used in the jitter function.

In some instrument modes it is possible to 'crop' the image array in the 'Noise' module (Figure 2) to a smaller size, reducing the overall size of the final time-series array while preserving the full spectrum. The backgrounds are sampled at the edges of the image prior to cropping and later used for background subtraction in the data pipeline. Reducing the array size improves speed of the simulation and pipeline processing. Some simulations may produce very large numbers of NDRs (e.g. many thousands) reducing speed of the simulation and potentially overwhelming computer memory. This is particularly an issue for bright targets that have short integration times, targets with long overall observing times, and instrument modes with short frame times.

JexoSim 2.0 currently simulates only 'fast' read out modes where the number of frames per group (*m*) equals 1: MIRI (FAST), NIRSpec (NRSRAPID), NIRISS (NISRAPID) and NIRCam (RAPID). For

https://Phoenix.ens-lyon.fr/Grids/BT-Settl/CIFIST2011_2015/FITS/

NIRCam, 1-output and 4-output readout patterns are offered, each of which has a different frame time. JexoSim can operate using either correlated-doubling-sampling (CDS) or up-the-ramp (UTR) modes. In the latter, a slope is fitted in the pipeline to the NDR ramp in each integration cycle. This reduces read noise compared to CDS, but slightly increases Poisson noise (Rauscher et al. 2007). The user can choose to simulate the ramps by generating every NDR directly. However, to increase speed and reduce memory pressure, an alternative is offered where only the first and last NDRs are actually generated per integration cycle but the noise is adjusted so that when CDS (last-minus-first subtraction) is performed, the resulting Poisson noise and read noise are at the level expected for a ramp with n NDRs, where n is the number of groups per integration. This is achieved by adjusting the total Poisson noise (and Fano noise) on each NDR by a factor of $\sqrt{6(n^2+1)/5n(n+1)}$, and the read noise by a factor of $\sqrt{6(n-1)/n(n+1)}$ (Figure 3). We use this alternative mode in all the simulation examples given in this paper.

For full transit simulations where the number of NDRs is very large (many thousands), potential exists to overwhelm computer memory and slow simulation and pipeline running time due to the very large array size produced. To mitigate this, when the number of NDRs becomes very large, the timeline of images is split into consecutive segments. Each segment is processed through stage 1 of the pipeline (Figure 2) producing spectrally-binned light curve segments which are later joined together to produce the final light curves. These are then processed in stage 2 of the pipeline where light curve model fitting takes place to extract the planet spectrum.

To exclude background pixels which may contribute to noise, an extraction aperture (aperture mask) is applied over the integration image in the pipeline. However the aperture may also reduce signal and increase spatial jitter noise if too narrow. We have added a new function that auto-selects an optimal aperture width which maximises the stellar signal-to-noise ratio (SNR). If this option is selected, the code will rapidly trial different aperture widths on a sample segment of the image time series, and then selects the width that returns the highest average SNR over all wavelengths.

3 IMPLEMENTATION

3.1 Installation

JexoSim 2.0 is hosted on Github and is installed as follows. First a dedicated virtual environment is recommended to prevent package conflicts. For stability, a number of dependent packages are installed during the set up of the virtual environment. For conda users the following commands set up the environment (with the initial set of dependencies) and activate it.

```
$ conda create -n jexosim python=3.8.5 matplotlib
=3.3.1-0 setuptools=49.6.0 numpy=1.19.1 numba
=0.50.1
```

\$ source activate jexosim

The activation command might vary with the system. Next, the Github repository must be cloned.

\$ git clone https://github.com/subisarkar/JexoSim.
git

Next, the databases described in Section 2.3 need to be downloaded. These are Pandeia¹², the Phoenix BT-Settl model grid¹¹, and the

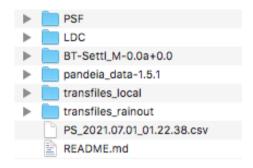


Figure 4. JexoSim archive/ folder displaying the expected contents.

ATMO transmission spectra grid¹³ ¹⁴ (the latter is optional). The pre-calculated PSF and LDC folders must also be downloaded and links are provided on the Github 'readme' page. The above folders need to be unzipped and moved to inside the JexoSim/archive/directory. Next, from the NASA Exoplanet Archive¹, the 'Planetery Systems' table (all rows, all columns) should be downloaded in .csv format, and moved into the JexoSim/archive directory. The final contents of the JexoSim/archive/ folder should look similar to Figure 4 ¹⁵. Next, from within the JexoSim/ folder the user should run the following commands to install JexoSim (and remaining dependencies) followed by the generation of JexoSim-compatible transmission files, wavelength solutions, IPC kernels and quantum yields from the Pandeia database.

```
$ cd JexoSim
$ python setup.py install
$ python generate.py
```

Finally, the user must decide on a directory location for the final results. By default these will be placed in the JexoSim/output/folder, however the user may choose a different location by editing the 'paths file', jexosim_paths.txt, which is located in the JexoSim/jexosim/input_files/ folder. The complete path to the output folder can be entered next to the output_directory option.

3.2 Running a simulation

To run a simulation the user should navigate to within the <code>JexoSim/</code> folder and run the <code>run_jexosim.py</code> file with an input parameters file name (e.g. <code>jexosim_input_params_ex1.txt</code> as shown below) as the argument.

If the user has chosen to apply the pipeline and obtain processed results, as mentioned previously these are packaged into a dictionary and dumped in .pickle format in the output directory (Figure 2) with an associated text file. The files are identified with the type of simulation, the instrument configuration, the planet, and a time

1Kvfi7FTBqM1MfnkTnHsJJqI7EFwnuaIG/view

https://stsci.app.box.com/v/pandeia-refdata-v1p5p1/

¹³ https://drive.google.com/file/d/

¹⁴ https://drive.google.com/file/d/

¹Lnp_kpbZGPEN0G6QhHrL4DcD4hwvaia/view

¹⁵ The exact name of the .csv file will vary based on the download date and time but the code will still recognise this as the planetary database. Similarly Pandeia will be recognised even if another version number is used.

Table 2. Input parameters file options.

Group	Entry	Description	Options	
Simulation	sim_diagnostics	Display of diagnostic data	0 or 1	
	sim_mode	Type of simulation recipe	1: Out-of-transit with Allan analysis. 2: Full transit. 3: Nois	
			budget. 4: Out-of-transit without Allan analysis.	
	sim_output_type	Format of the output	1: Pipeline processed. 2: FITS file only. 3: Pipeline processed	
			with intermediate products.	
	sim_noise_source	Choice of noise source	Enter number from provided list corresponding to noise source	
			(e.g. 0 activates all noise sources).	
	sim_realisations	Number of realisations	Enter integer number of realisations.	
	sim_full_ramps	Choice of CDS or UTR	0: CDS, 1: UTR.	
	sim_use_UTR_noise_correction	Apply noise correction for UTR	If $sim_full_ramps = 0$, choose 0 or 1.	
	sim_pointing_psd	Type of pointing jitter PSD	'flat': white noise PSD, 'non-flat': Herschel-derived PSDa.	
	sim_prnu_rms	rms of PRNU grid (%)	Enter number. Typical value is 3%.	
	sim_flat_field_uncert	Uncertainty on flat field (%)	Enter number. Typical value is 0.5%.	
	sim_use_ipc	Apply IPC	0 or 1. Not applied in MIRI.	
	sim_use_systematic_model	Apply systematic model	0 or 1	
	sim_systematic_model_name	Name of the systematic model	Enter the name of the folder containing the model files	
Observation	obs_type	Observation type	1: Primary transit. 2: Secondary eclipse.	
	obs_frac_T14_pre_transit	Pre-transit T_{14} fraction	Enter fraction of transit duration pre-transit (e.g. 0.5).	
	obs_frac_T14_post_transit	Post-transit T_{14} fraction	Enter fraction of transit duration post-transit (e.g. 0.5).	
	obs_use_sat	Use saturation time to set n	0 or 1.	
	obs_fw_percent	Saturation limit	Enter percent of full well (e.g. 80 or 100) as the saturation limit.	
	obs_n_groups	Set number of groups (n)	If obs_use_sat = 0, enter integer number of groups.	
	obs_n_reset_groups	Set number of reset groups	Enter 'default' for default value or integer number of groups b .	
	obs_inst_config	Set instrument configuration	Choose from list of configurations with subarray modes.	
Pipeline	pipeline_binning	Type of spectral binning	'R-bin': uses R. 'fixed-bin': uses number of pixel columns.	
	pipeline_R	<i>R</i> -power for binning	If 'R-bin' used enter R-power (e.g. 100).	
	pipeline_bin_size	Pixel columns per bin	If 'fixed-bin' used enter number of pixel columns (e.g. 5 or 10).	
	pipeline_ap_shape	Extraction aperture shape	'rect': rectangular. 'wav': wavelength-dependent.	
	pipeline_apply_mask	Apply extraction aperture	0 or 1.	
	pipeline_auto_ap	Auto-select width of aperture	0 or 1.	
	pipeline_ap_factor	Aperture width	Enter number α where width = $2\alpha F \lambda^c$.	
	pipeline_bad_corr	Manage bad pixels	0 or 1.	
Exosystem	planet_name	Planet name	Enter planet to search for in planet database.	
	planet_use_database	Use planet database	1: Planet database gives all exosystem parameters. 0: Exosystem	
			parameters entered manually d .	
	planet_spectrum_model	Type of planet spectrum	'simple': uses flat transmission spectrum based on $(R_p/R_s)^2$	
			or blackbody-based emission spectrum. 'complex': uses	
			ATMO gride. 'file': uses a specific spectrum from a file.	
	planet_spectrum_file	Path to planet spectrum file	If planet_spectrum_model = 'file' provide path to file.	
	star_spectrum_model	Type of stellar spectrum	'simple': uses blackbody. 'complex': uses Phoenix database.	
	star_spectrum_file	Path to star spectrum file	If star_spectrum_model = 'file' provide path to file.	
	star_spectrum_mag_norm	Normalise magnitude	0: None. 1 normalises to J and/or K mag. 2: uses $(R_s/d)^2$	

^a PSD=power spectral density profile. Both PSDs generate jitter timelines with an rms of 6.7 mas per 1-D axis. The Herschel-derived PSD is scaled version of the PSD obtained using Herschel pointing information described in Sarkar et al. (2019).

stamp. To display a set of plots showing results from the given .pickle file, the results.py file is run from within the JexoSim/ folder with the filename as an argument. For example:

\$ cd JexoSim \$ python results.py Noise_budget_MIRI_LRS_slitless_SLITLESSPRISM_ FAST_HD_209458_b_2021_07_01_1005_28.pickle

If the user chooses to simply store the image stack for later analysis without running the pipeline, a FITS file is generated and stored in the output directory (Figure 2).

3.3 Input parameters file options

In Table 2 we list the main options in the input parameters file, which provides the interface between the user and the code. These are divided into four categories: 'Simulation' (parameters that control the functioning of the simulation, but would not be options for a real observation), 'Observation' (parameters that control the simulated observation and could also be options for actual observations), 'Pipeline' (parameters controlling the pipeline), and 'Exosystem' (parameters for defining the extra-solar system). As JexoSim evolves, these options may be modified in future.

^b Default values are 0 for MIRI (assuming a read-reset method), and 1 for all NIR channels.

 $[^]c$ F is the F-number and λ is the wavelength. For rectangular apertures λ is the longest wavelength in the band.

^d There is a section to enter these system parameters manually.

^e If a 'complex' planet spectrum is chosen, a section exists to fill in required parameters (e.g. C/O ratio, haze, cloud etc.)

4 CASE STUDIES

10

We now describe five case studies using JexoSim 2.0. These demonstrate the range of instrument models (NIRISS, NIRCam, NIRSpec and MIRI), different simulation modes (out-of-transit vs full transit) and different methods to obtain the transit depth precision (Allan deviation analysis vs Monte Carlo). We use two end-member targets: the hot Jupiter, HD 209458 b, orbiting a bright (J mag 6.59) Sun-like star, and the mini-Neptune, K2-18 b, orbiting an M-dwarf of intermediate brightness (J mag 9.76). We simulate mostly primary transits, but also consider a secondary eclipse case. Finally, a 'noise budget' simulation is performed for MIRI LRS, to show how the total noise can be broken down to show the contribution of each noise source.

Table 3 summarises the major and minor points illustrated by each case study. Each case study can be run by the user by implementing the input parameters files named in Table 3 and provided with $JexoSim 2.0^{16}$ with adjustments described in the text below.

Table 4 lists the simulation settings for each case study referring to the input parameters file entries given in Table 2.

In all cases, except Case 5 (noise budget), the full suite of noise sources, backgrounds and systematics listed in Table 1 are used (excluding the 'user-defined systematic'). For the noise budget case, noise sources are implemented individually as explained further below. The JexoSim pipeline (Figure 2) is used in all cases to obtain the final results. The results are therefore post-processed, including noise mitigation methods (e.g. aperture masking during 1-D spectra extraction), subtraction of backgrounds, and decorrelation of correlated noise sources (e.g. pointing jitter noise).

4.1 Case 1: Transmission spectrum of K2-18 b with NIRISS using Allan deviation method

4.1.1 Overview

For this case study we simulate NIRISS SOSS (single object slitless spectroscopy) with the GR700XD grism and the SUBSTRIP96 subarray in NISRAPID read out mode. K2-18 b, is selected as the target, with all parameters obtained via the planet database. The goal is to obtain the precision on the transit depth at a binned *R*-power of 100 and produce example transmission spectra with error bars. We utilise an out-of-transit simulation approach (i.e. no transit light curves implemented) and Allan deviation analysis of the results to obtain the precision. The advantages and disadvantages of this approach are discussed below.

4.1.2 Allan deviation analysis

Allan deviation analysis (Allan 1966) accounts for the effect of correlated noise on the standard error of a mean signal. This is achieved by taking a time-dependent signal and binning it into sequential segments of duration τ , then taking the mean in each segment, and measuring the standard error of the mean values. For uncorrelated ('white') noise, the fractional noise (the standard error of the mean / mean signal), falls predictably with τ with a power law exponent of -0.5. This is the basis of 'integrating down' photon noise. However for correlated noise, the exponent may be different and itself change with τ . At large enough values of τ the correlation timescale is exceeded and the noise integrates down like 'white' noise. In Sarkar et al. (2019) we described in detail how JexoSim performs this kind

¹⁶ These input parameters files are located in the folder JexoSim/jexosim/input_files/. of analysis using simulated out-of-transit spectrally-binned timelines of integration signals. The outcome of this analysis is that the fractional noise, σ_s , can be predicted for any value of τ , taking into account any correlated noise. If τ is set to T_{14} , the transit duration, then assuming a simple 'box-car' model of a transit, with an equal amount of out-of-transit and in-transit time, the noise on the transit depth can be approximated by $\sqrt{2}\sigma_s$.

This approach partially accounts for correlated noise (by finding the standard error on the mean in- and out-of-transit signals per spectral bin), but assumes the in- and out-of-transit light curve sections are uncorrelated to each other. It also does not account for limb-darkening on the light curve, and cannot be used to assess systematic biases distorting the light curve, such as spot occultations or persistence. Full transit simulations using the Monte Carlo approach described in the next case study can capture these effects. However for the assessment of transit depth precision in the absence of such light curve distortions, this approach is adequate and delivers equivalent results to the Monte Carlo approach.

4.1.3 Simulation settings

Key settings in the input parameters file for this case are shown in Table 4. The option sim_mode is set to 1 choosing an OOT simulation with Allan analysis and sim_output_type set to 1, selecting pipeline processed results. The jitter option $sim_pointing_psd$ is set to 'flat' selecting a white noise power spectrum generating a jitter timeline with rms 6.7 mas. The PRNU is set to 3% rms with a flat field uncertainty of 0.5%. The number of groups per integration is set by the saturation time which is the time taken for the first pixel on the detector to reach the saturation limit. This time is then divided by the group time (same as frame time when m = 1) to obtain the integer, n, the number of groups per integration. 80% of the pixel full-well is chosen as the saturation limit. In this case n was calculated to be 13. For speed we implement CDS rather than full ramps but apply the UTR noise correction that adjusts the Poission and read noise to the levels expected for the number of groups per integration.

The option planet_spectrum_model is set to 'file' so that the transmission spectrum is obtained from a specific file generated beforehand for this planet using a radiative transfer code. In our examples, we use models based on published works for each planet considered. We use a model transmission spectrum of HD 209458 b based on Welbanks & Madhusudhan (2019) and that of K2-18 b based on Madhusudhan et al. (2020). The pipeline option, pipeline_binning is set to 'R-bin' for spectral binning based on spectral resolving power, with the R-power set to 100. pipeline_ap_shape is set to 'rect' choosing a rectangular extraction aperture. Since in NIRISS SOSS the spectral trace is curved, choosing this latter option does not actually produce a rectangularshaped aperture. Rather the aperture is curved to match the shape of the spectrum itself but the width of the aperture remains constant with wavelength. By setting pipeline_auto_ap to 1, the width of the aperture is auto-selected by the code to optimise SNR. We use the average of 5 realisations to obtain the final noise results, by setting $sim_realisations$ to 5^{17} .

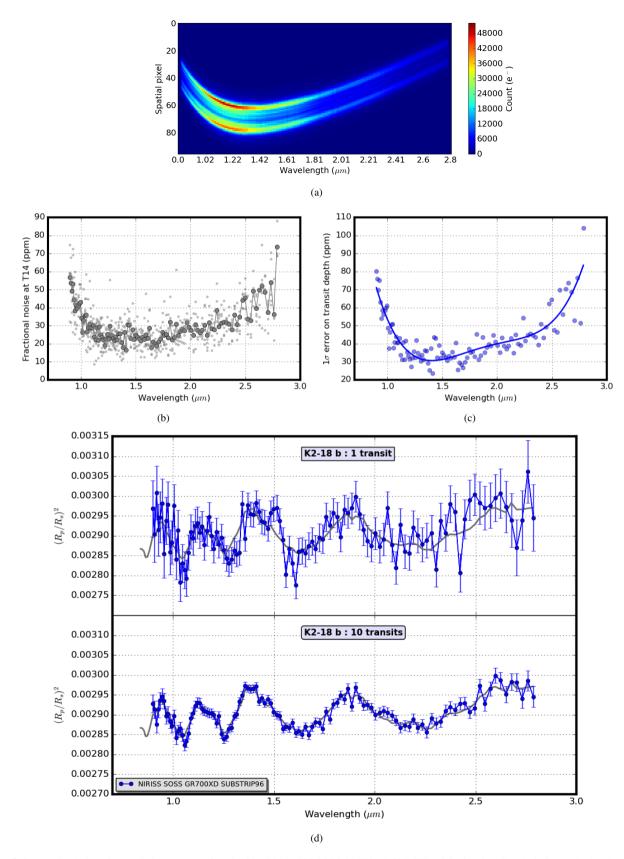


Figure 5. Case 1: simulation of transmission spectrum for K2-18 b with NIRISS SOSS GR700XD SUBSTRIP96 using the Allan deviation method. a) Integration image from pipeline. b) Fractional noise at T_{14} versus wavelength. Small dots: individual realisations. Large dots: average result. c) 1σ error on transit depth versus wavelength with 4th order polynomial line fit. d) Synthetic post-processed transmission spectra at R=100 for 1 transit and 10 co-added transits. Grey line: input spectrum binned to R=100.

Table 3. Summary of major and minor points of each case study.

Case	File	Major points	Minor points	
1	*ex1.txt Produces NIR transmission spectrum of K2-18b		NIRISS subarray mode selection	
		Uses OOT simulation mode	Simulation/pipeline settings, e.g.:	
		Demonstrates NIRISS instrument model	auto-calculation of n groups, PRNU level,	
		Uses Allan deviation method to obtain error bars	type of jitter PSD, R-binning,	
		All noise and background sources applied	auto-sizing of extraction aperture etc.	
		Post-processed results via JexoSim pipeline		
2	*ex2.txt	Produces NIR/MIR transmission spectrum of K2-18b	NIRCam & MIRI LRS subarray mode selection	
		Uses full-transit simulation mode	Simulation/pipeline settings, e.g.:	
		Demonstrates NIRCam & MIRI instrument models	pre- and post- transit observation time	
		Uses Monte Carlo method to obtain error bars	Combines spectra from several instrument modes	
		All noise and background sources applied		
		Post-processed results via JexoSim pipeline		
3	*ex3.txt	Produces NIR transmission spectrum of K2-18b	NIRSpec subarray mode selection	
		Produces NIR transmission spectrum of HD 209458 b	Simulation/pipeline settings, e.g.:	
		Uses full-transit simulation mode	number of realisations set to 50	
		Demonstrates NIRSpec instrument model	Combines spectra from several subarray modes	
		Uses Monte Carlo method to obtain error bars		
		All noise and background sources applied		
		Post-processed results via JexoSim pipeline		
		Saturation affecting subarray choices		
		Comparison of hot Jupiter / sub-Neptune spectrum SNR		
4	*ex4.txt	Produces NIR/MIR emission spectrum of HD 209458 b	Uses same subarray modes as in case 2	
		Uses full-eclipse simulation mode	Simulation/pipeline settings, e.g.	
		Demonstrates NIRCam and MIRI instrument models	selection of eclipse over transit observation	
		Uses Monte Carlo method to obtain error bars	Combines spectra from several instrument modes	
		All noise and background sources applied		
		Post-processed results via JexoSim pipeline		
5	*ex5.txt	Produces noise budget for MIRI K2-18b observation	Uses LRS SLITLESSPRISM subarray mode	
		Uses Allan deviation method to find fractional noise	Simulation of multiple noise sources in isolation	
		Significant background & read noise at longer λ	Simulation/pipeline settings, e.g.	
		-	user-defined aperture size (auto-sizing disabled)	

^{*} Prefix: jexosim_input_params_

4.1.4 Results

Figure 5 shows the results from this case study. Figure 5a shows an example integration image taken just before the jitter decorrelation step in the pipeline (Figure 2). We see the curved spectral trace in this channel and the unusual PSF, elongated in the cross-dispersion direction by a cylindrical lens incorporated into the GR700XD optical element. Figure 5b shows the fractional noise at T_{14} as a function of wavelength derived from the Allan deviation analysis. The average result is given by the large grey dots, with the small dots showing the individual realisations. The average value is used to then calculate the noise on the transit depth per spectral bin (Figure 5c, blue dots) by multiplying by $\sqrt{2}$. We fit a 4th order polynomial to these points (Figure 5c, blue line) to estimate the expected noise (1σ error) per spectral bin.

We find that at R = 100, the 1σ error given by the polynomial fit ranges from a minimum of 31 ppm (at 1.41 µm) to maximum of 83 ppm (at 2.79 µm), the noise rising at both the blue and red ends of the wavelength range. We then generate a transmission spectrum in Figure 5d. In each spectral bin, the 1σ error from 5b line fit is used to randomise the value of $(R_p/R_s)^2$ using a Gaussian probability distribution centered on the input spectrum binned down to R =100. The input spectrum is the planet spectrum modulated by the instrument response: p(X) in Figure 3. The size of the error bars represent the 1σ margin of error. The upper plot in Figure 5d gives a randomised spectrum for a single transit observation.

The spectral features are noisy but large scale variations are discernible over the noise, including the 1.4 µm water featured discovered using the Hubble WFC3 (Benneke et al. 2019; Tsiaras et al. 2019). A future spectral retrieval study can quantify observability more exactly. The lower plot shows a spectrum for 10 co-added transits where the 1σ error has been reduced by a factor of $1/\sqrt{10}$. We can see that with 10 transits the spectral features are well-recovered with very little noise at the shorter wavelengths.

4.2 Case 2: Transmission spectrum of K2-18 b with NIRCam and MIRI using Monte Carlo method

4.2.1 Overview

In this case study we simulate the NIRCam Time-series Grism F444W and F322W2 modes observing K2-18 b in primary transit. In both cases, the SUBGRISM64 subarray is used with the 4output readout pattern option. We also simulate MIRI LRS with the SLITLESSPRISM subarray. For each instrument mode, full primary transit observations are modeled in a 50-realisation Monte Carlo simulation to obtain the precision on the transit depth. The pipeline runs through stage 1 and stage 2 (light curve fitting) (Figure 2). This combination of instrument modes allows us to generate a simulated transmission spectrum from 2.4 to 12 µm.

¹⁷ One realisation would suffice here, but obtaining the average of many gives a less noisy final result.

Table 4. Simulation settings per case study. See Table 2 for description of each entry. Some entries are left blank indicating they do not need to be filled in for these simulations.

S	sim_diagnostics					
		0	0	0	0	0
	sim_mode	1	2	2	2	3
5	sim_output_type	1	1	1	1	1
9	sim_noise_source	0	0	0	0	
E S	sim_realisations	5	50	50	50	10
lati	sim_full_ramps	0	0	0	0	0
Simulation	sim_use_UTR_noise_correction	1	1	1	1	1
. <u>v</u>	sim_pointing_psd	'flat'	'flat'	'flat'	'flat'	'flat'
5	sim_prnu_rms	3	3	3	3	3
5	sim_flat_field_uncert	0.5	0.5	0.5	0.5	0.5
5	sim_use_ipc	1	1	1	1	1
S	sim_use_systematic_model	0	0	0	0	0
S	sim_systematic_model_name					
	obs_type	1	1	1	2	1
C	obs_frac_T14_pre_transit		0.5	0.5	0.5	
C	obs_frac_T14_post_transit		0.5	0.5	0.5	
C	obs_use_sat	1	1	1	1	1
g c	obs_fw_percent	80	80	80	80	80
atic o	obs_n_groups					
Observation	obs_n_reset_groups	'default'	'default'	'default'	'default'	'default'
) ps	obs_inst_config a	'NIRISS +	'NIRCam +	'NIRSpec	'MIRI +	'MIRI +
0		SOSS_	TSGRISM_	BOTS_G395H_	LRS_	LRS_
		GR700XD +	F322W2 +	F290LP +	slitless +	slitless +
		SUBSTRIP96 +	SUBGRISM64_	SUB2048 +	SLITLESSPRISM +	SLITLESSPRISM +
		NISRAPID'	4_output +	NRSRAPID'	FAST'	FAST'
			RAPID'			
_	pipeline_binning	'R-bin'	'R-bin'	'R-bin'	'R-bin'	'R-bin'
-	pipeline_R	100	100	100	100	100
o t	pipeline_bin_size					
٠ -	pipeline_ap_shape	'rect'	'rect'	'rect'	'rect'	'rect'
E E	pipeline_apply_mask	1	1	1	1	1
-	pipeline_auto_ap	1	1	1	1	0
-	pipeline_ap_factor					1
	pipeline_bad_corr	1	1	1	1	1
	planet_name ^b	'K2-18 b'	'K2-18 b'	'HD 209458 b'	'HD 209458 b'	'K2-18 b'
e r	planet_use_database	1	1	1	1	1
· ·	planet_spectrum_model	'file'	'file'	'file'	'file'	'file'
$\frac{8}{2}$ t	planet_spectrum_file	path given	path given	path given	path given	path given
Exc	star_spectrum_model	'complex'	'complex'	'complex'	'complex'	'complex'
	star_spectrum_file					
	star_spectrum_mag_norm	1	1	1	1	1

^a For cases 2-4, this entry is changed as required for the instrument configuration being simulated.

4.2.2 Monte Carlo method

This method generates full primary transit or secondary eclipse simulations with implementation of a transit or eclipse light curve. In each realisation, the image time-series are processed through stage 1 of the pipeline generating synthetic data light curves spectrally-binned to R of 100. In stage 2 of the pipeline, these are fitted with model light curves and the transit depth, $(R_p/R_s)^2$ or eclipse depth, $F_p/(F_s + F_p)$, recovered for each spectral bin. The fitting uses a downhill simplex algorithm minimising chi-squared. The planet-star radius ratio (or square root of the eclipse depth in secondary eclipse simulations) is the only free-parameter in this fit. After multiple realisations, a distribution of transit depths is obtained for each spectral bin. We take the standard deviation of this distribution to be the 1σ confidence interval margin-of-error on the transit depth, i.e. the size of the error bar on the final spectrum. The Monte Carlo approach gives robust results since the uncertainty on the transit depth is di-

rectly measured, accounting for all correlated and uncorrelated noise effects. Also, any residual systematic wavelength-dependent biases on the spectrum can be detected through deviation of the mean value in a systematic manner relative to the input spectrum. The latter, for example, may occur due to the presence of stars spots and faculae.

4.2.3 Simulation settings

Table 4 gives the key settings used in the input parameters file for this case study. These are mostly the same as used for case 1, with the following exceptions. sim_mode is set to 2, choosing a full transit observation, and $sim_realisations$ is set to 50. Under obs_inst_config, the option for NIRCam F332W2 SUBGRISM64 with 4-output readout pattern is shown, however this is substituted when simulating the F444W and MIRI LRS modes. The fraction of T_{14} that is observed before transitions.

^b In case 3 'HD 209458 b' is also used.

sit (obs_frac_T14_pre_transit) and the fraction after transit (obs_frac_T14_post_transit) are both set to 0.5.

4.2.4 Results

Results from this case study are shown in Figure 6. Example integration images are shown for each instrument configuration in Figure 6a. Due to cropping of the image in the 'Noise' module to improve simulation speed, the size of these images may not match the original subarray sizes. Figure 6b shows the transit depths recovered from each of the 50 realisations (smaller dots). In each bin a distribution of transit depth instances occurs. The mean value for the distribution in each spectral bin is shown (large dots). The input spectrum binned to R = 100 is shown as the grey line.

No discernible systematic bias is seen in the mean values. Figure 6c shows the 1σ error versus wavelength, where each point is the standard deviation of transit depths from Figure 6b for the given spectral bin. Polynomial fits to these points (4th order for MIRI and 2nd order for NIRCam) are shown. These line fits are used to predict the 1σ error for each wavelength bin for a single transit observation per instrument mode.

Based on these polynomial fits, the 1σ error in NIRCam ranges from 47 ppm (at 3.61 μm) to 65 ppm (at 2.45 μm) for the F332W2 mode, and from 49 ppm (at 3.94 μm) to 75 ppm (at 4.95 μm) for the F444W mode. Similarly, for MIRI LRS, the 1σ error ranges from a minimum of 70 ppm (at 5.26 μm) increasing substantially with wavelength beyond 10 μm to a maximum of 448 ppm (at 11.95 μm).

As in the previous case study we generate example transmission spectra using these 1σ error values. Figure 6d shows randomised transmission spectra for 1 and 10 transits. With one transit the spectrum is very noisy with features not readily discernible over noise. With 10 transits, the spectral features in both NIRCam and MIRI become discernible above noise upto about 8 μ m range.

4.3 Case 3: Transmission spectra of HD 209458 b and K2-18 b with NIRSpec using Monte Carlo method

4.3.1 Overview

This case study simulates NIRSpec with a variety of subarray modes, using both medium- and high-resolution gratings. Simulated primary transit observations are performed on both HD 209458 b and K2-18 b. This example also illustrates the potential issues of detector saturation for bright targets with JWST requiring careful subarray selection, with different configurations chosen for each planet. We obtain the transit depth precision at R=100 for each configuration and planet using the Monte Carlo method described in Section 4.2. Using a combination of instrument configurations we generate post-processed transmission spectra with error bars for each planet from $\sim 1-5 \ \mu m$. These results highlight the comparative performance of JWST NIRSpec between a hot Jupiter with a bright host star and a mini-Neptune with a dim host star.

4.3.2 Simulation settings

Table 4 lists the input parameters file settings for this example. These mostly follow those of case 2. The entry for obs_inst_config is shown for the G395H grating with the F290LP filter and the SUB2048 subarray, but this is changed for other configurations as needed. The planet_name entry is changed between 'HD 209458 b' and 'K2-18 b'.

4.3.3 NIRSpec configurations

NIRSpec is a complex instrument with several different dispersion elements, filter options and subarray modes (Figure 1). The choice of instrument configuration (grating, filter and subarray) may be driven by the desired wavelength coverage and the wish to minimise the number of separate transit observations needed to cover this wavelength range. Each configuration requires an independent observation.

However configuration choice must also take into account the feasibility of using each subarray with regards to pixel saturation. In particular 'hard' saturation must be avoided. This is where the saturation time (the time for the first pixel to reach the chosen saturation limit) is longer than 2 frame times. 2 frames is the minimum needed to mitigate reset noise. Subarrays with shorter frame times are thus more likely to avoid hard saturation. As with the previous simulations, we use a saturation limit of 80% full well (to minimise potential for non-linearity) and assume the NRSRAPID readout mode.

For both HD 209458 b and K2-18 b, JexoSim predicts NIRSpec PRISM will result in saturation with all subarray modes and is thus excluded in these cases. This is partly attributable to its very short spectral trace, concentrating spectral power on a small region of the detector, leading to high detector count rates and short saturation times

The SUB512 and SUB512S subarrays have the shortest frame times and are thus least prone to saturation. However, as can be seen in Figure 1 they cover only a fraction of the available wavelength range for a given dispersion element and so would need to be combined with other subarrays for wide wavelength coverage.

The high resolution gratings, which tend to disperse the spectral power over a greater physical distance compared to the medium resolution gratings, are better for avoiding saturation. For the brighter target, HD 209458 b, we found we could apply G395H using the SUB2048 subarray (thus capturing its full wavelength range) without saturation. For G295H, we found that SUB2048 leads to hard saturation, but subarrays SUB1024A and SUB1024B (which have shorter frame times) avoid this, and thus a combination of these two subarray modes is used. Finally for G140H, we found that subarrays SUB1024A and SUB1024B saturate, but subarray SUB512 is feasible with the F100LP filter giving coverage in two wavelength patches (1.07–1.19, 1.47–1.59 μ m) (Figure 1).

For K2-18 b, we found that all three medium resolution gratings (G140M, G235M, and G395M) could be used with the SUB2048 subarray (capturing the full wavelength range of each grating) without saturating. We chose the F100LP filter for use with G140M over the alternate F070LP filter as it avoids a gap in the wavelength coverage when combined with the other gratings (Figure 1).

4.3.4 Results

Figure 7 show the results for this case study. The distributions and means of transit depth instances recovered from the Monte Carlo simulation are shown in Figure 7a. No discernible biases are seen when comparing the mean transit depths to the input spectrum. The standard deviations of the transit depths in each spectral bin are plotted in Figure 7b, with second order polynomials fitted to the values.

Using the polynomial values, for HD 209458 b the 1σ error on the transit depth across all the NIRSpec modes used ranges from 10 ppm (at 1.18 µm) to 36 ppm (at 5.14 µm). For K2-18 b the 1σ error across the NIRSpec modes used ranges from 32 ppm (at 2.15 µm) to

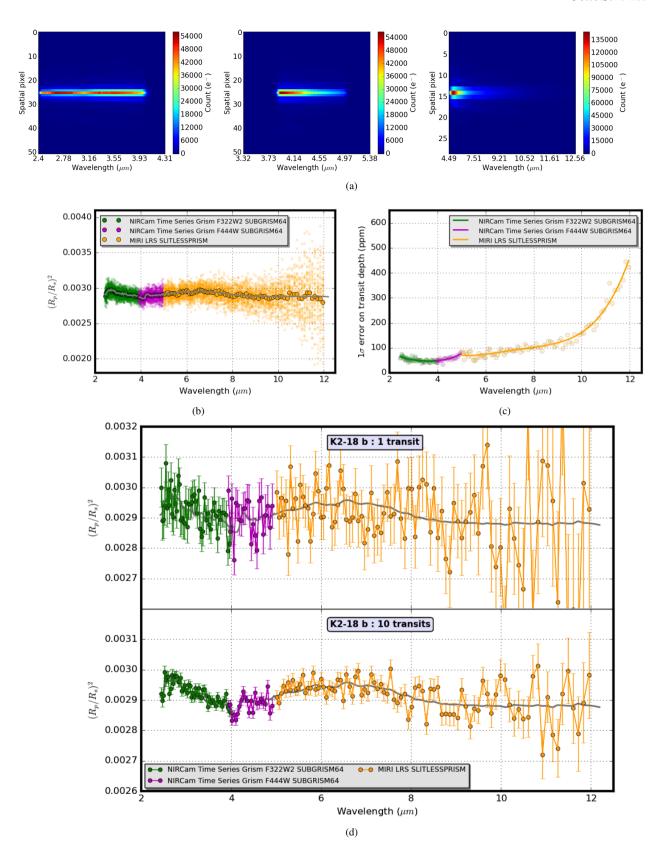


Figure 6. Case 2: simulation of transmission spectrum for K2-18 b with NIRCam Time Series Grism F322W2 and F444W modes (both with SUBGRISM64) and MIRI LRS slitless using the Monte Carlo method. a) Integration images from pipeline - left: NIRCam Grism F322W2, middle: NIRCam Grism F444W, right: MIRI LRS. b) Monte Carlo simulation recovered transit depths versus wavelength (large dots: average of 50 realisations, small dots: individual realisations, grey line: input spectrum binned to R = 100). c) 1σ error on transit depth versus wavelength with 2nd and 4th order polynomial line fits for NIRCam and MIRI respectively. d) Synthetic post-processed transmission spectra for K2-18b for 1 transit and 10 co-added transits at R = 100 (grey line: input spectrum binned to R = 100)

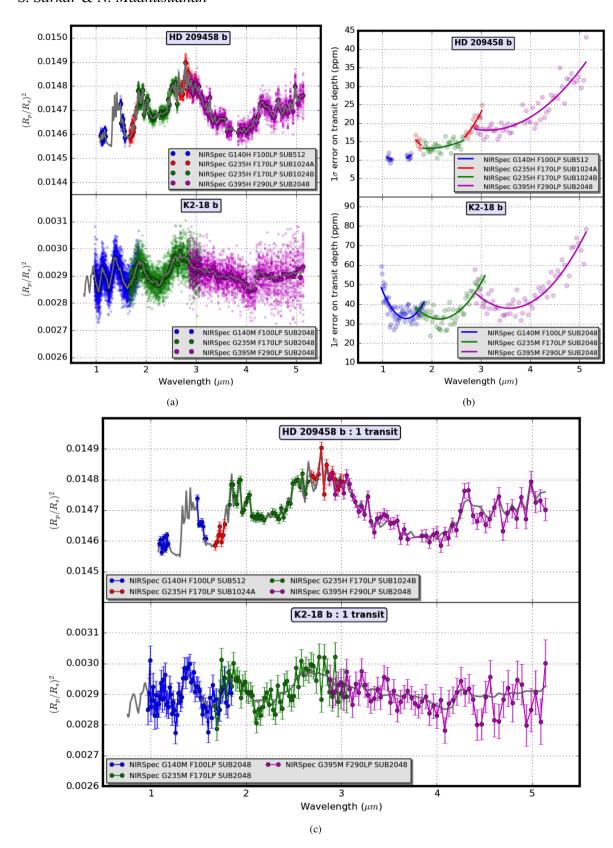


Figure 7. Case 3: simulation of transmission spectra for HD209458b and K2-18b using multiple NIRSpec instrument subarray modes using the Monte Carlo method. a) Monte Carlo simulation recovered transit depths versus wavelength (large dots: average of 50 realisations, small dots: individual realisations, grey line: input spectrum binned to R = 100). b) 1σ error on transit depth versus wavelength with 2nd order polynomial line fits. c) Synthetic post-processed transmission spectra for each planet at R = 100 (grey line: input spectrum binned to R = 100).

77 ppm (at $5.14 \mu m$). The noise on the transit depth is thus about 2-3 times higher for K2-18 b compared to HD 209458 b.

In additional to experiencing higher noise, the spectral amplitudes for the low-mass K2-18 b are much smaller than for the hot Jupiter HD 209458 b (Figure 7c) which further reduces the final signal-to-noise on the spectrum (where the 'signal' is the spectral amplitude) compared to HD 209458 b. We can readily see from Figure 7c that the transmission spectrum for HD 209458 b recovers planetary spectral features to a high degree of precision and accuracy. For K2-18 b, large NIR spectral features (such as the 1.4 μm water feature) are discernible above noise. The final spectrum for HD209458b contains a gap in wavelength coverage between 1.19 and 1.47 μm due to using the SUB512 subarray for the G140H grating.

4.4 Case 4: Day-side emission spectrum of HD 209458 b with NIRCam and MIRI using Monte Carlo method

4.4.1 Overview

This case illustrates a simulated observation of the secondary eclipse of HD 209458 b using NIRCam and MIRI LRS. The same instrument configurations used in case 2 are used here (NIRCam Time-series Grism F444W and F332W2 with 4-output readout pattern and SUB-GRISM64 subarray and MIRI LRS SLITLESSPRISM). The simulations use eclipse light curves to modulate the stellar signal. These are generated in the same way as primary transit light curves but limbdarkening coefficients are set to zero and the minimum of the light curve is normalised to unity. The fractional eclipse depth of each light curve gives the planet-star flux ratio expressed as $F_p/(F_s + F_p)(\lambda)$. The input planet spectrum for HD 209458 b was obtained from a selfconsistent model reported in Gandhi & Madhusudhan (2017). As in the transmission cases, all noise sources, background sources and instrumental effects in Table 1 (excluding the user-defined systematic) are included, and the final results are processed through the pipeline in the same way as for cases 2 and 3. The Monte Carlo approach is used with 50 realisations for each instrumental configuration. We find the precision on the eclipse depth for an R of 100 and produce a post-processed day-side emission spectrum extending from 2.4-12 μm.

4.4.2 Simulation settings

The settings for this simulation are given in Table 4 and are mostly the same as used in case 2. The key change is for obs_type where 2 is selected to generate a secondary eclipse observation. 'HD 209458 b' is entered for planet_name. The path to the secondary eclipse input planet spectrum file is entered under planet_spectrum_file.

4.4.3 Results

Figure 8 shows the results from this case study. We find that a very high precision result is obtained from just one eclipse per instrument mode given the brightness of the host star. Transit depths recovered from the Monte Carlo simulation are shown in Figure 8a. Figure 8b shows the standard deviations for each bin and as previously polynomials are fitted to these (2nd order for NIRCam, 4th order for MIRI).

Using the polynomial fitted values, for NIRCam the eclipse depth precision ranges from 15 ppm (at 3.41 μm) to 18 ppm (at 2.45 μm) for the F332W2 mode, and from 16 ppm (at 4.06 μm) to 27 ppm (at 4.95 μm) for the F444W mode. For MIRI LRS the precision ranges from a minimum of 22 ppm (at 5.64 μm) to a maximum of 183 ppm (at 11.95

 μ m). We can see that the randomised post-processed spectrum has very small error bars and traces the input spectrum to high degree of precision and accuracy with just a single observation (per instrument mode). These precision results are comparable to those obtained in transmission for the same target.

4.5 Case 5: Noise budget analysis of K2-18 b observation with MIRI using Allan deviation method

4.5.1 Overview

A noise budget analysis breaks down the total noise into its constituent elements, helping us to understand which noise sources are most impactful and thus require the greatest attention for mitigation in observational and data reduction strategies. Here we perform a noise budget for K2-18 b observed with MIRI LRS slitless mode. We use out-of-transit simulations with Allan deviation analysis, looping through different noise sources and recovering the fractional noise at T_{14} versus wavelength for each source. The noise sources are those listed in Table 1. Each is simulated with the other noise sources switched off and a simulation is also produced with all noise sources on. The instrumental effects listed in Table 1 (excluding the userdefined systematic) are applied in all cases with the exception of pointing jitter which is only applied in the pointing jitter noise case and in the all noise case. Background sources listed in Table 1 are applied only if the corresponding noise is being simulated, e.g. the zodical light background is not applied unless the zodi noise is being simulated, so only in the zodi noise and all noise cases. The results are processed through stage 1 and stage 2 (Allan deviation analysis) of the pipeline (Figure 2) with some variations. The jitter decorrelation step is only applied in the pointing jitter and all noise cases. Background subtraction is only applied if a diffuse background (zodi, optical surfaces emission or sunshade) is included. Dark current subtraction is only applied for dark current noise and all noise cases. We obtain the average result of 10 realisations in each case.

4.5.2 Simulation settings

The simulation settings for the noise budget simulation are given in Table 4 and mostly follow those of case 1 with the following exceptions. The parameter sim_mode is set to 3, to select the noise budget option. When this is done sim_noise_source can be left blank as the code will loop through all noise sources. obs_inst_config is set for MIRI LRS SLITLESSPRISM. Also the auto-aperture sizing function is disabled (pipeline_auto_ap is set to 0) so that an extraction aperture size must be applied manually. This ensures that variation of the extraction aperture size is not a factor when comparing the different noise contributions. We set pipeline_ap_factor to 1 (based on the value obtained by the auto-aperture function for a simulation with all noise activated). The width of the mask is $2 \times \alpha F \lambda$, where F is the F-number, λ is the wavelength and α is the value of pipeline_ap_factor. For a rectangular aperture mask (as selected here) λ is the longest wavelength in the wavelength range. If a wavelength-dependent aperture mask is chosen, λ is the wavelength of each pixel column.

4.5.3 Results

Results from this example are shown in Figure 9. The smaller dots show results from individual realisations with the larger dots giving the average per spectral bin. We find that below about $10~\mu m$ the spectra can be considered photon-noise-limited (the stellar 'source

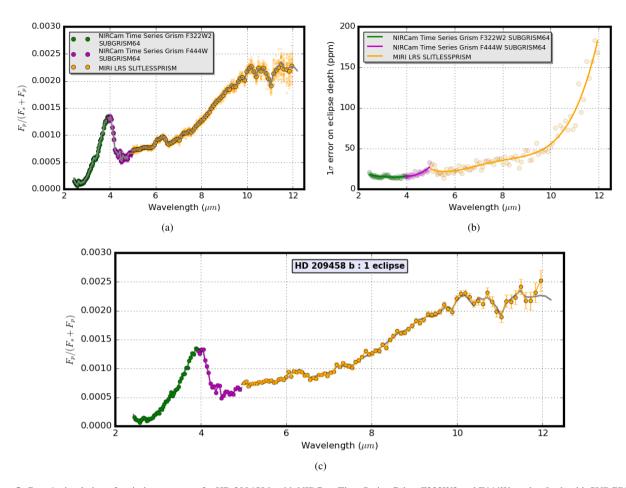


Figure 8. Case 4: simulation of emission spectrum for HD 209458 b with NIRCam Time Series Grism F322W2 and F444W modes (both with SUBGRISM64) and MIRI LRS slitless mode, using the Monte Carlo method. a) Monte Carlo simulation recovered eclipse depths versus wavelength (large dots: average of 50 realisations, small dots: individual realisations, grey line: input spectrum binned to R = 100). b) 1σ error on eclipse depth versus wavelength with 2nd and 4th order polynomial line fits for NIRCam and MIRI respectively. c) Synthetic post-processed dayside-emission spectrum for 1 eclipse (per instrument mode) (grey line: input spectrum binned to R = 100).

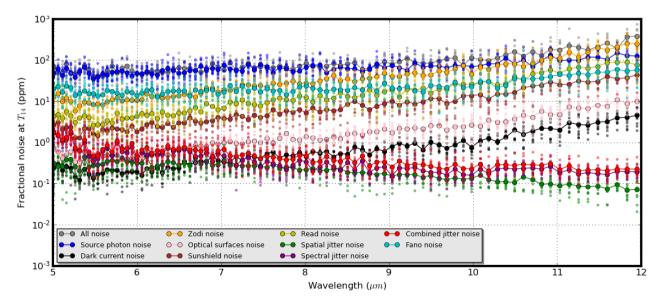


Figure 9. Case 5: noise budget for MIRI LRS observing K2-18 b at R = 100 (large dots: average of 10 realisations, small dots: individual realisations).

photon noise' being the largest noise contributor), however at longer wavelengths zodiacal light noise becomes significant and exceeds source photon noise above ~ 11 µm. Read noise is also significant at the long wavelength end but is mitigated by reading up-the-ramp and the large number of groups per integration (in this case n = n35). Fano noise, which is dependent on the photons from both star and backgrounds, also becomes a significant noise source at the red end, bolstered by the high number of zodi photons, but does not exceed the source photon noise. Noise from the sunshade emission increases with wavelength and is more significant than noise emission from optical surfaces, however it too does not exceed the source photon noise up to 12 µm. Other noise sources such as pointing jitter, optical surfaces emission noise, and dark current noise are wellcontrolled and orders of magnitude smaller than the source photon noise. The contribution of some noise sources is dependent on the extraction aperture size. For example if we use a larger aperture size, the impact of zodi noise increases overtaking photon noise at shorter wavelengths. This kind of analysis can also be used to assess the impact of changing observational parameters such as saturation limit (and thus integration time and total number of integrations) on the overall noise balance.

5 CONCLUSIONS

JexoSim 2.0 is a time-domain simulator of JWST exoplanet spectroscopy designed for the planning and validation of science cases for JWST. JexoSim generates synthetic spectra that capture the full impact of complex noise sources and systematic trends, allowing for assessment of both accuracy and precision in the final spectrum. In this paper, we described the upgraded simulator, which has new noise sources and instrumental effects and has been designed to improve operability, speed, efficiency and versatility. JexoSim 2.0 is now freely available to the community. We have described here how to implement the code, with specific case studies that can be replicated by a user.

The case studies demonstrate a range of capabilities with simulated results from all four instruments and different subarray configurations. We examined how JWST can be used to observe the hot Jupiter HD 209458 b around a Sun-like star, and the low-mass planet K2-18 b around an M-dwarf. Observing bright targets, such as HD 209458 b, may presents challenges in finding subarray modes that will not saturate, with possible gaps in wavelength coverage when combining certain NIRSpec grating configurations. K2-18 b is of great current interest given its location in the habitable zone with similar insolation to the Earth and the discovery of water vapour and clouds in its atmospheric spectrum using the Hubble WFC3 IR instrument (Benneke et al. 2019; Tsiaras et al. 2019) using nine transits. However whereas the Hubble spectrum covered only 1.1 to 1.7 μm , the JWST spectra simulated here range from ~ 0.9 to 12 μm. While we have not performed a spectral retrieval study in this paper, spectral features in the WFC3 range are clearly visible over noise with just one transit observation using NIRSpec or NIRISS. Similar levels of noise are obtained with each. The 1.4 µm water feature (observed with the Hubble WFC3) has an amplitude of \sim 115 ppm in the spectrum from our radiative transfer model. JexoSim predicts a transit depth noise of 33 ppm with NIRSpec (G140M) and 31 ppm with NIRISS. If we divide the amplitude by the transit depth noise we obtain a signal-to-noise of about 3.5-3.7 for one transit, which compares well with the multiple transits needed to achieve a similar precision with Hubble. When observing K2-18 b, NIR-Cam achieves similar noise performance to NIRSpec and NIRISS, though its coverage does not reach down to the WFC3 wavelength range. Whilst NIRSpec offers the widest total wavelength coverage of the three NIR instruments, when using the gratings, this must be achieved through applying multiple subarray modes, each requiring its own observation. The PRISM mode can cover the complete range in one pass, however this will work only with dim targets that will not saturate the detector. For K2-18 b, the noise at *R*=100 with MIRI LRS ranges from 70 ppm to 448 ppm. The noise increases with wavelength, so that particularly at the long wavelength end of MIRI, these results may not be useful. However, binning to lower *R* will improve precision. Future studies using spectral retrievals can incorporate JexoSim's ability to add confounding factors such as spot effects or additional systematics to see if spectral features including simulated biomarkers can be successfully recovered from low-mass planets around M-dwarf stars, targeted for observation by JWST.

Although there may be systematics not currently known or included in JexoSim 2.0, the code can be easily upgraded or modified in future to accommodate these. JexoSim 2.0 can be used to cross-validate initial results from other simulation tools in cases where time-domain effects are critical to consider, as well as compare performance across the suite of JWST instruments and modes as performed here. JexoSim 2.0 provides a framework for investigating in detail the feasibility of specific and novel scientific cases for JWST where detectability may be vulnerable to astrophysical or instrumental confounding factors. It is also well-suited to investigating the impact of star spots and faculae as well as stellar pulsation and granulation noise. With simple modifications it can be used to investigate detection of time-dependent scientific signals such as exomoon transits or phase-related modulations. JexoSim 2.0 can also be customised for other astrophysical applications beyond exoplanet spectroscopy, such as brown dwarf spectroscopy.

With JWST, exoplanet science will be transformed. JexoSim 2.0 will assist in maximising and optimising the scientific possibilities of this ground-breaking observatory.

ACKNOWLEDGEMENTS

Thanks to Sam Rowe (Cardiff University) for alpha testing and help with implementing Numba. Thanks to Andreas Papageorgiou (Cardiff University) for alpha testing and to Tyler Gordon (University of Washington) for trialling the code and providing valuable feedback. Thanks to Jayesh Goyal (Cornell University) for help with using the ATMO scaleable grid. We use a modified version of his publicly-available code snippet for rescaling the spectra from this grid for use in JexoSim. Our thanks to the referee for their helpful comments and suggestions for improvement. S.S. was supported by UKSA grant ST/S002456/1.

DATA AVAILABILITY STATEMENT

The data underlying this article will be shared on reasonable request to the corresponding author.

REFERENCES

Agol E., Cowan N. B., Knutson H. A., Deming D., Steffen J. H., Henry G. W., Charbonneau D., 2010, The Astrophysical Journal, 721, 1861 Allan D., 1966, Proceedings of the IEEE, 54, 221

- Allard F., Homeier D., Freytag B., 2012, Philosophical Transactions of the Royal Society of London A: Mathematical, Physical and Engineering Sciences, 370, 2765
- Astropy Collaboration et al., 2013, A&A, 558, A33
- Astropy Collaboration et al., 2018, aj, 156, 123
- Barstow J. K., Aigrain S., Irwin P. G. J., Kendrew S., Fletcher L. N., 2015, Monthly Notices of the Royal Astronomical Society, 448, 2546
- Batalha N. E., et al., 2017, Publications of the Astronomical Society of the Pacific, 129, 064501
- Beichman C. A., Rieke M., Eisenstein D., Greene T. P., Krist J., McCarthy D., Meyer M., Stansberry J., 2012, in Clampin M. C., Fazio G. G., MacEwen H. A., Oschmann Jacobus M. J., eds, Society of Photo-Optical Instrumentation Engineers (SPIE) Conference Series Vol. 8442, Space Telescopes and Instrumentation 2012: Optical, Infrared, and Millimeter Wave. p. 84422N, doi:10.1117/12.925447
- Beichman C., et al., 2014, Publications of the Astronomical Society of the Pacific, 126, 1134
- Benneke B., et al., 2019, The Astrophysical Journal, 887, L14
- Berta Z. K., et al., 2012, The Astrophysical Journal, 747, 35
- Charbonneau D., Brown T. M., Noyes R. W., Gilliland R. L., 2002, ApJ, 568,
- Deming D., Knutson H. A., 2020, Nature Astronomy, 4, 453
- Deming D., Sheppard K., 2017, ApJ, 841, L3
- Deming D., et al., 2013, ApJ, 774, 95
- Diamond-Lowe H., Charbonneau D., Malik M., Kempton E. M. R., Beletsky Y., 2020, AJ, 160, 188
- Doyon R., et al., 2012, in Clampin M. C., Fazio G. G., MacEwen H. A., Oschmann Jacobus M. J., eds, Society of Photo-Optical Instrumentation Engineers (SPIE) Conference Series Vol. 8442, Space Telescopes and Instrumentation 2012: Optical, Infrared, and Millimeter Wave. p. 84422R, doi:10.1117/12.926578
- Ferruit P., Birkmann S., Böker T., Sirianni M., Giardino G., de Marchi G., Alves de Oliveira C., Dorner B., 2014, in Oschmann Jacobus M. J., Clampin M., Fazio G. G., MacEwen H. A., eds, Society of Photo-Optical Instrumentation Engineers (SPIE) Conference Series Vol. 9143, Space Telescopes and Instrumentation 2014: Optical, Infrared, and Millimeter Wave. p. 91430A, doi:10.1117/12.2054756
- Gandhi S., Madhusudhan N., 2017, Monthly Notices of the Royal Astronomical Society, 472, 2334
- Gardner J. P., et al., 2006, Space Science Reviews, 123, 485
- Giardino G., et al., 2012, in Holland A. D., Beletic J. W., eds, Society of Photo-Optical Instrumentation Engineers (SPIE) Conference Series Vol. 8453, High Energy, Optical, and Infrared Detectors for Astronomy V. p. 84531T, doi:10.1117/12.925357
- Goyal J. M., Wakeford H. R., Mayne N. J., Lewis N. K., Drummond B., Sing D. K., 2018, Monthly Notices of the Royal Astronomical Society, 482, 4503
- Greene T. P., Line M. R., Montero C., Fortney J. J., Lustig-Yaeger J., Luther K., 2016, The Astrophysical Journal, 817, 17
- Grillmair C. J., et al., 2008, Nature, 456, 767
- Harris C. R., et al., 2020, Nature, 585, 357-362
- Hunter J. D., 2007, Computing in Science Engineering, 9, 90
- Husser T. O., Wende-von Berg S., Dreizler S., Homeier D., Reiners A., Barman T., Hauschildt P. H., 2013, A&A, 553, A6
- Janesick J. R., 2007, Photon Transfer DN $\rightarrow \lambda$
- Janson M., Bergfors C., Goto M., Brandner W., Lafrenière D., 2010, The Astrophysical Journal, 710, L35
- Knutson H. A., et al., 2011, The Astrophysical Journal, 735, 27
- Konopacky Q. M., Barman T. S., Macintosh B. A., Marois C., 2013, Science, 339, 1398
- Kreidberg L., et al., 2014, Nature, 505, 69 EP
- Lam S. K., Pitrou A., Seibert S., 2015, in Proceedings of the Second Workshop on the LLVM Compiler Infrastructure in HPC. LLVM '15. Association for Computing Machinery, New York, NY, USA, doi:10.1145/2833157.2833162, https://doi.org/10.1145/ 2833157.2833162
- Leisenring J., 2018, pynrc, 0.8.0dev., https://pynrc.readthedocs.io/ en/latest/

- Line M. R., et al., 2013, The Astrophysical Journal, 775, 137
- Madhusudhan N., 2018, Atmospheric Retrieval of Exoplanets. Springer International Publishing, Cham, pp 1-30, doi:10.1007/978-3-319-30648-3_104-1, https://doi.org/10.1007/978-3-319-30648-3_104-1
- Madhusudhan N., 2019, Annual Review of Astronomy and Astrophysics, 57,
- Madhusudhan N., Seager S., 2009, The Astrophysical Journal, 707, 24
- Madhusudhan N., Nixon M. C., Welbanks L., Piette A. A. A., Booth R. A., 2020, The Astrophysical Journal, 891, L7
- Mayor M., Queloz D., 1995, Nature, 378, 355
- McCullough P. R., Regan M., Bergeron L., Lindsay K., 2008, PASP, 120, 759 Morello G., Claret A., Martin-Lagarde M., Cossou C., Tsiaras A., Lagage P.-O., 2020, The Astronomical Journal, 159, 75
- Nielsen L. D., et al., 2016, in MacEwen H. A., Fazio G. G., Lystrup M., Batalha N., Siegler N., Tong E. C., eds, Society of Photo-Optical Instrumentation Engineers (SPIE) Conference Series Vol. 9904, Space Telescopes and Instrumentation 2016: Optical, Infrared, and Millimeter Wave. p. 99043O, doi:10.1117/12.2231624
- Parviainen H., 2015, Monthly Notices of the Royal Astronomical Society, 450, 3233
- Perrin M. D., Soummer R., Elliott E. M., Lallo M. D., Sivaramakrishnan A., 2012, in Clampin M. C., Fazio G. G., MacEwen H. A., Oschmann Jacobus M. J., eds, Society of Photo-Optical Instrumentation Engineers (SPIE) Conference Series Vol. 8442, Space Telescopes and Instrumentation 2012: Optical, Infrared, and Millimeter Wave. p. 84423D, doi:10.1117/12.925230
- Piquéras L., et al., 2010, in Angeli G. Z., Dierickx P., eds, Society of Photo-Optical Instrumentation Engineers (SPIE) Conference Series Vol. 7738, Modeling, Systems Engineering, and Project Management for Astronomy IV. p. 773812, doi:10.1117/12.856860
- Pont F., Zucker S., Queloz D., 2006, Monthly Notices of the Royal Astronomical Society, 373, 231
- Pont F., Knutson H., Gilliland R. L., Moutou C., Charbonneau D., 2008, Monthly Notices of the Royal Astronomical Society, 385, 109
- Pontoppidan K. M., et al., 2016, in Peck A. B., Seaman R. L., Benn C. R., eds, Society of Photo-Optical Instrumentation Engineers (SPIE) Conference Series Vol. 9910, Observatory Operations: Strategies, Processes, and Systems VI. p. 991016 (arXiv:1707.02202), doi:10.1117/12.2231768
- Rackham B. V., Apai D., Giampapa M. S., 2018, The Astrophysical Journal, 853, 122
- Rauscher B. J., et al., 2007, Publications of the Astronomical Society of the Pacific, 119, 768
- Rauscher B. J., et al., 2017, Publications of the Astronomical Society of the Pacific, 129, 105003
- Ressler M. E., et al., 2015, Publications of the Astronomical Society of the Pacific, 127, 675
- Rieke G. H., et al., 2015, Publications of the Astronomical Society of the Pacific, 127, 584
- Rohatgi A., 2020, Webplotdigitizer: Version 4.4, https://automeris.io/ WebPlotDigitizer
- Sarkar S., Argyriou I., Vandenbussche B., Papageorgiou A., Pascale E., 2018, Monthly Notices of the Royal Astronomical Society, 481, 2871
- Sarkar S., Madhusudhan N., Papageorgiou A., 2019, Monthly Notices of the Royal Astronomical Society, 491, 378
- Schwieterman E. W., et al., 2018, Astrobiology, 18, 663
- Seager S., 2014, Proceedings of the National Academy of Science, 111, 12634 Seager S., Sasselov D. D., 2000, The Astrophysical Journal, 537, 916
- Sing D. K., et al., 2011, Monthly Notices of the Royal Astronomical Society, 416, 1443
- Sing D. K., et al., 2016, Nature, 529, 59
- Space Telescope Science Institute 2018d, Technical report, User documentation for Cycle 1: MIRI, https://jwst-docs.stsci.edu/download/ attachments/16744575/jwst_miri_documentation_20180212. pdf. Space Telescope Science Institute/NASA/ESA/CSA, Baltimore, USA, https://jwst-docs.stsci.edu/download/attachments/ 16744575/jwst_miri_documentation_20180212.pdf
- Space Telescope Science Institute 2018b, Technical report, User documentation for Cycle 1: NIRCam, https://stsci.app.box.com/s/

```
wdu8467g3yp7rjj8z6rs82nwu8a87wuy. Space Telescope Science In-
   stitute/NASA/ESA/CSA, Baltimore, USA, https://stsci.app.box.
   com/s/wdu8467g3yp7rjj8z6rs82nwu8a87wuy
Space Telescope Science Institute
                                           2018a, Technical
   port, User documentation for Cycle 1: NIRISS, https:
   //jwst-docs.stsci.edu/download/attachments/16744575/
   jwst_niriss_documentation_20180212.pdf?version=20&
   modificationDate=1556155233201&api=v2.
                                                   Space
                                                             Tele-
   scope Science Institute/NASA/ESA/CSA,
                                                            USA,
                                                Baltimore.
   https://jwst-docs.stsci.edu/download/attachments/
   16744575/jwst_niriss_documentation_20180212.pdf?
   version=20&modificationDate=1556155233201&api=v2
Space Telescope Science Institute 2018c, Technical report, User docu-
   mentation for Cycle 1: NIRSpec, https://stsci.app.box.com/s/
   kcoup3fkc1ds34qhmi4o2s6oz2dq5jvd. Space Telescope Science In-
   stitute/NASA/ESA/CSA, Baltimore, USA, https://stsci.app.box.
   com/s/kcoup3fkc1ds34qhmi4o2s6oz2dq5jvd
Stevenson K. B., et al., 2014, Science, 346, 838
Swain M. R., Vasisht G., Tinetti G., 2008, Nature, 452, 329
Tinetti G., et al., 2018, Experimental Astronomy, 46, 135
Tsiaras A., Waldmann I. P., Tinetti G., Tennyson J., Yurchenko S. N., 2019,
   Nature Astronomy, 3, 1086
Virtanen P., et al., 2020, Nature Methods, 17, 261
Waldmann I. P., Tinetti G., Rocchetto M., Barton E. J., Yurchenko S. N.,
   Tennyson J., 2015, The Astrophysical Journal, 802, 107
Welbanks L., Madhusudhan N., 2019, AJ, 157, 206
Wes McKinney 2010, in Stéfan van der Walt Jarrod Millman eds, Pro-
   ceedings of the 9th Python in Science Conference. pp 56 - 61,
   doi:10.25080/Majora-92bf1922-00a
Wolszczan A., Frail D. A., 1992, Nature, 355, 145
```

This paper has been typeset from a TFX/LATFX file prepared by the author.