

# The Demographics, Stellar Populations, and Star Formation Histories of Fast Radio Burst Host Galaxies: Implications for the Progenitors

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## Abstract

We present a comprehensive catalog of observations and stellar population properties for 23 highly secure host galaxies of fast radio bursts (FRBs). Our sample comprises 6 repeating FRBs and 17 apparent nonrepeaters. We present 82 new photometric and 8 new spectroscopic observations of these hosts. Using stellar population synthesis modeling and employing nonparametric star formation histories (SFHs), we find that FRB hosts have a median stellar mass of  $\approx 10^{9.9} M_{\odot}$ , mass-weighted age  $\approx 5.1$  Gyr, and ongoing star formation rate  $\approx 1.3 M_{\odot} \text{ yr}^{-1}$  but span wide ranges in all properties. Classifying the hosts by degree of star formation, we find that 87% (20 of 23 hosts) are star-forming, two are transitioning, and one is quiescent. The majority trace the star-forming main sequence of galaxies, but at least three FRBs in our sample originate in less-active environments (two nonrepeaters and one repeater). Across all modeled properties, we find no statistically significant distinction between the hosts of repeaters and nonrepeaters. However, the hosts of repeating FRBs generally extend to lower stellar masses, and the hosts of nonrepeaters arise in more optically luminous galaxies. While four of the galaxies with the clearest and most prolonged rises in their SFHs all host repeating FRBs, demonstrating heightened star formation activity in the last  $\lesssim 100$  Myr, one nonrepeating host shows this SFH as well. Our results support progenitor models with short delay channels (i.e., magnetars formed via core-collapse supernova) for most FRBs, but the presence of some FRBs in less-active environments suggests a fraction form through more delayed channels.

*Unified Astronomy Thesaurus concepts:* Radio transient sources (2008); Galaxies (573); Star formation (1569); Magnetars (992)

## 1. Introduction

Fast radio bursts (FRBs) are extremely bright ( $\approx 10$  mJy–100 Jy), (sub)millisecond pulses of megahertz to gigahertz

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emission. First discovered over a decade ago in 2007 (Lorimer et al. 2007), it was not until 2017 that an FRB was precisely localized and traced back to its host galaxy at  $z = 0.19$ , providing the first direct evidence of their cosmological origins (Chatterjee et al. 2017; Marcote et al. 2017; Tendulkar et al. 2017). While this first localization was facilitated by targeted observations made possible by the repeating nature of the source, an increasing number of FRBs are now being localized upon detection by fast transient searches using radio interferometers (e.g., Bannister et al. 2019; Ravi et al. 2019). Over

the last decade, the commissioning of sensitive and wide-field fast transient detection instrumentation has led to an enormous increase in the detected FRB population (e.g., Macquart et al. 2010; CHIME/FRB Collaboration et al. 2018). It is now established that some fraction (currently  $\sim 4\%$  observed; Petroff et al. 2022) of the FRB population produce repeat bursts from the same cosmic source (repeating FRBs; Spitler et al. 2016; CHIME/FRB Collaboration et al. 2019a) while the majority of discovered FRBs have not been observed to repeat to date (apparent nonrepeating FRBs; CHIME/FRB Collaboration et al. 2021). Despite over 600 published FRBs to date (Petroff et al. 2022), their origins and the nature of their repetition remains uncertain.

Due to their short durations and inferred high energies, many of the leading FRB progenitor models invoke a magnetically powered neutron star, known as a magnetar (Platts et al. 2019). The connection between FRBs and magnetars was bolstered with the detection of a bright radio burst from the Galactic magnetar SGR 1935+2154, which accompanied emission at higher energies (CHIME/FRB Collaboration et al. 2020a; Bochenek et al. 2020; Mereghetti et al. 2020). While the radio burst energies from that source fall a few orders of magnitude short of the typical extragalactic FRBs detected to date (Kirsten et al. 2021), they begin to bridge the gap between Galactic and extragalactic coherent radio sources (e.g., Margalit et al. 2020a; Nimmo et al. 2022).

The FRB signal properties, namely their dispersion measure (DM), rotation measure (RM), duration, spectrotemporal morphology, and polarization, provide key information on their central engines, and serve as important probes of the intervening ionized matter (e.g., Michilli et al. 2018; Hessels et al. 2019; Hilmarsson et al. 2021; Mannings et al. 2022; Ryder et al. 2022; Wu & McQuinn 2023; Cook et al. 2023; Ocker et al. 2023). However, these signals alone provide only a highly model-dependent, low-precision estimate of the distance to the FRB, making it difficult or impossible to infer the parent stellar populations and FRB energetics directly. However, if a host galaxy can be identified, a wealth of information can be gleaned from their local and global environments—precise redshifts, energy scales, and properties of the environment on local and galactic scales. Concurrent to the findings that repeater and nonrepeater burst morphologies may be statistically distinct (Pleunis et al. 2021), host properties may provide additional distinguishing power on the physical distinction between these classes. Aligned with this goal, advancements in FRB experiments have enabled routine (sub)arcsecond localizations, making robust host galaxy associations feasible.

For FRBs, the first host associations were in seemingly distinct environments. The first repeating FRB 20121102A was found in a star-forming, metal-poor dwarf galaxy (Chatterjee et al. 2017; Tendulkar et al. 2017), while the first well-localized apparently nonrepeating FRB 20180924B resided in an older and more-massive star-forming galaxy (Bannister et al. 2019), providing early signs that they might arise from distinct populations. The next well-localized repeater FRB 20180916B was pinpointed to a massive spiral galaxy with a moderate star formation rate (Marcote et al. 2020), complicating the picture that their host properties alone could be discerning. One interesting feature that has only concerned two repeating FRBs thus far (FRBs 20121102A and 20190520B) are their colocation with persistent radio sources (PRSs; Chatterjee et al. 2017; Marcote et al. 2017; Niu et al. 2022): compact radio emission

that cannot be attributed to star formation. Based on the size and brightness temperature ( $\lesssim 0.7$  pc and  $T_b \gtrsim 5 \times 10^7$  K, respectively), Marcote et al. (2017) claimed the PRS associated with FRB 20121102A is compact and directly linked to the FRB event, while the PRS associated with FRB 20190520B was too luminous to be explained by star formation (Niu et al. 2022). Notably, both bursts reside in dwarf host galaxies (Tendulkar et al. 2017; Niu et al. 2022), with their PRSs coincident with or close to a star-forming knot in the galaxy. While no other FRBs have known PRSs to date, it is worth characterizing their host galaxies to connect to their multiwavelength properties.

As a population, FRBs are generally found in star-forming galaxies across a wide range of masses (e.g., Tendulkar et al. 2017; Bannister et al. 2019; Prochaska et al. 2019; Marcote et al. 2020; Fong et al. 2021; Bhandari et al. 2023; Niu et al. 2022; Ravi et al. 2022). Based on early studies of a limited number of hosts, no statistically significant distinction was found between the stellar population properties of repeating and apparent nonrepeating FRBs (Bhandari et al. 2020a; Heintz et al. 2020). In some cases, milliarcsecond-scale localizations pinpointed FRBs to very different subgalactic environments, e.g., the discoveries of some repeating FRBs in or proximal to knots of star formation (Bassa et al. 2017; Tendulkar et al. 2017; Piro et al. 2021; Tendulkar et al. 2021; Niu et al. 2022) or in non-star-forming environments altogether, such as the old  $\sim 9$  Gyr globular cluster environment (Bhardwaj et al. 2021; Kirsten et al. 2022). From a modest sample of subarcsecond localized FRBs, one finds that the majority occur within or near the spiral arms of their hosts (Marcote et al. 2020; Chittidi et al. 2021; Mannings et al. 2021; Tendulkar et al. 2021), although there are exceptions (Xu et al. 2022).

While such subgalactic details can be afforded by the fairly local  $z \lesssim 0.3$  FRB population, the bulk of newly discovered FRBs will be found at higher redshift by more sensitive searches, and only integrated galaxy properties will be available in almost all cases. As spectral energy distribution (SED) modeling techniques diversify in their specific assumptions and methodologies (see Pacifici et al. 2023, for a comparison of 14 SED fitting codes), it is necessary to compare the FRB host population to similarly modeled field galaxies and to derive their individual star formation histories (SFHs). Thus, it is timely and complementary to more local studies to perform a uniform analysis of the population of FRB host galaxies, their SFHs, and derive implications for their progenitors.

In this work, we compile a sample of 23 highly secure FRB host galaxies, including the hosts of six repeating and 17 apparent nonrepeating FRBs, discovered across a range of facilities, and perform uniform modeling of the stellar population properties and SFHs of their host galaxies. The FRBs in this sample were discovered over roughly a decade, 2012 November–2022 January. In Section 2 we discuss the sample selection. In Section 3 we detail the data acquisition and processing. We detail our modeling assumptions and methodology using the `Prospector` SED modeling code (Johnson et al. 2021) in Section 4. We present our results of the stellar population properties and SFHs and compare to the general galaxy population in Section 5 and discuss the implications of these results in Section 6. Finally, we summarize and conclude in Section 7.

## 2. Sample

Our sample comprises known FRB hosts from the literature as well as new FRBs and host identifications. We start with all FRBs localized before the end of 2022 January (FRB 20121102A to FRB 20220105A). As part of the Fast and Fortunate for FRB Follow-up<sup>23</sup> (F<sup>4</sup>) collaboration, we receive the positional information of new FRBs from the Commensal Real-Time ASKAP Fast-Transients (CRAFT; Macquart et al. 2010) survey on the Australian Square Kilometre Array Pathfinder (McConnell et al. 2016) and the More TRansients and Pulsars (MeerTRAP; Rajwade et al. 2022) project on the MeerKAT radio telescope (Jonas & MeerKAT Team 2016). We next search imaging archives such as the Sloan Digital Sky Survey (SDSS; Alam et al. 2015), Pan-STARRS1 (PS1; Chambers et al. 2016), and the Dark Energy Camera Legacy Survey (DECaLS; Dey et al. 2019) for any plausible host galaxies at or near the FRB position. If no host galaxy candidates are visible in these images, we obtain deep *r*- or *I*-band imaging with 4–10 m class telescopes to aid with host galaxy identification (see Section 3.1). We also use known FRB host identifications from the literature, with the FRBs discovered by Arecibo (Spitler et al. 2014; Scholz et al. 2016; Spitler et al. 2016), Parkes (Price et al. 2019), the Canadian Hydrogen Intensity Mapping Experiment (CHIME; CHIME/FRB Collaboration et al. 2019b), and the Five-hundred-meter Aperture Spherical radio Telescope (FAST; Niu et al. 2022).

### 2.1. Sample Selection

We begin with a parent sample of 27 events that have been localized to  $\lesssim 1''$ – $2''$ , which is necessary for unambiguous host associations with luminous  $L^*$  galaxies across the redshift range  $z \sim 0.1$ – $1$  (Eftekhari & Berger 2017). We then apply the following criteria for inclusion in this work:

1. We require a PATH (Probabilistic Association of Transients to their Hosts; Aggarwal et al. 2021) posterior probability  $\geq 90\%$ , following the same convention used in Bhandari et al. (2022b). PATH employs a Bayesian framework to calculate the likelihood that a transient is associated with a galaxy given the transient's localization, the galaxy's position on the sky and angular size, and its apparent magnitude. Combined with prior assumptions on the probability that the host is undetected (i.e., fainter than the flux limit of the imaging observations) and the offset of FRBs from the centers of their hosts, PATH reports the posterior probability of association to every galaxy in the field. Higher probabilities correspond to higher likelihood of association. By requiring the posterior probability to be  $\geq 90\%$ , we construct a sample of high-probability host galaxy associations. We apply PATH to four FRBs—20190520B (using CFHT *r'* archival data; Niu et al. 2022 and Gwyn 2008 for details on the *r'* transmission curve), 20211203C, 20210410D, and 20220105A—for which there are no published PATH probabilities. We otherwise use published PATH probabilities from Aggarwal et al. (2021), James et al. (2022), and Bhandari et al. (2022b). This criterion removes the hosts of FRB 20190614D and FRB 20190523A.
2. There is no bright ( $\lesssim 10$  AB mag) foreground star within 5' of the FRB position. We employ this criterion to ensure

that the observations are not contaminated by scattered light from a nearby bright star; in particular, this can inhibit accurate photometry of the host galaxy.

3. There are detections of the host galaxy in at least three photometric bands in the optical/IR or otherwise overlapping the observed spectrum's wavelength coverage. For our methodology used to model the FRB hosts, described in Section 4, the absolute flux calibration of the spectrum depends on the photometry. We have found three photometric bands to be the minimum required in order to obtain a trustworthy model.
4. We exclude FRBs with burst spectral energies below  $10^{27}$  erg Hz $^{-1}$ , to exclude low-energy bursts that would be undetectable over the majority of the redshift range spanned by our sample. Assuming an ASKAP detection limit of 4.4 Jy ms (James et al. 2022), this energy cut corresponds to excluding FRBs that can be seen to a maximum redshift of  $z \sim 0.003$  by the telescope that contributed the bulk of our sample. This criterion excludes two very nearby FRBs/FRB-like signals: FRB 20200120E and the Galactic source SGR J1935+2154. These sources are significant outliers in luminosity space, as is clear from fluence-redshift diagrams such as the one in Ryder et al. (2022). We note that while all bursts seen to date from both of these sources are excluded by this cut, the highest-energy bursts from the FRB-like SGR J1935+2154 are more energetic than the lowest-energy bursts of FRB 20200120E (Nimmo et al. 2022), making them more comparable to each other than to the higher- $z$  FRB population.
5. A spectrum of the host galaxy is available and contains detectable spectral features (i.e., emission and absorption lines) for redshift determination and a signal-to-noise ratio (S/N)  $\gtrsim 3/\text{\AA}$  in the continuum. We note that spectroscopy is essential for breaking the known degeneracy in age, dust, and metallicity in SED modeling (e.g., Bell & de Jong 2001; Leja et al. 2017). Additionally, the thousands of data points inherent in a spectrum provide more information to fit than photometry alone. We note that even though there is relative difficulty in detecting high S/N features for quiescent versus star-forming galaxies, no hosts are excluded on this criterion alone.

While these sample criteria are enforced for the majority of the FRBs, we made two exceptions (requiring additional care in our data processing) to ensure that the small sample of repeating FRBs was not further reduced. The repeating FRB 20190520B (Niu et al. 2022) fails the bright star criterion due to its  $\approx 1'$  proximity to the bright,  $r \sim 8$  AB mag, variable star V1042 Sco B. In addition to being a repeating FRB, this host contains the second known PRS, making it especially noteworthy. We took appropriate steps during the data collection and reduction phases to ensure the photometry and spectroscopy were not contaminated by extra flux from the star (see Sections 3.1 and 3.2 for details). As mentioned above, we use archival CFHT *r'* (which is close to Sloan *r'*; Gwyn 2008) data for calculating the PATH probability of this host galaxy. Our analysis assigns the host identified in Niu et al. (2022) a posterior probability of nearly 100%, robustly confirming the host association. The host galaxy of the repeating FRB 20190711A fails the spectroscopic continuum signal requirement; at a decl. of  $-80^\circ$ , the source is always at high airmass for most available follow-up resources and is also quite faint, making observation challenging. While

<sup>23</sup> <http://fib-f4.org/>

**Table 1**  
Basic FRB Properties

FRB	Survey/Facility <sup>a</sup>	R.A. (FRB) [J2000]	Decl. (FRB) [J2000]	$z$	Repeater	Host Magnitude [AB]	Filter	Reference
20121102A	Arecibo/VLA/EVN	05:31:58.70	33:08:52.6	0.1927	Y	23.73	GMOS-N <i>r</i>	1,2
20180301A	Parkes/VLA	06:12:54.44	04:40:15.8	0.3304	Y	21.21	NOT <i>r</i>	3
20180916B	CHIME/EVN	01:58:00.75	65:43:00.3	0.0337	Y	16.17	SDSS <i>r</i>	4.5
20180924B	CRAFT	21:44:25.26	-40:54:00.1	0.3212	N	20.33	DECaLS <i>r</i>	6, This Work
20181112A	CRAFT	21:49:23.63	-52:58:15.4	0.4755	N	21.68	DES <i>r</i>	7
20190102C	CRAFT	21:29:39.76	-79:28:32.5	0.2912	N	20.77	VLT/FORS2 <i>I</i>	8, 10
20190520B	FAST/VLA	16:02:04.27	-11:17:17.3	0.2418	Y	22.16	SOAR <i>r</i>	9, This Work
20190608B	CRAFT	22:16:04.77	-07:53:53.7	0.1178	N	17.41	DECaLS <i>r</i>	8, This Work
20190611B	CRAFT	21:22:58.94	-79:23:51.3	0.3778	N	22.15	GMOS-S <i>r</i>	4,8
20190711A	CRAFT	21:57:40.62	-80:21:28.8	0.522	Y	23.54	GMOS-S <i>r</i>	4,8
20190714A	CRAFT	12:15:55.13	-13:01:15.6	0.2365	N	20.34	Pan-STARRS <i>r</i>	4
20191001A	CRAFT	21:33:24.31	-54:44:51.9	0.234	N	18.36	DECaLS <i>r</i>	10
20200430A	CRAFT	15:18:49.54	12:22:36.3	0.1608	N	21.05	DECaLS <i>r</i>	4
20200906A	CRAFT	03:33:59.08	-14:04:59.5	0.3688	N	19.95	DES <i>r</i>	3
20201124A	CHIME/ASKAP	05:08:03.51	26:03:38.5	0.0979	Y	17.86	Pan-STARRS <i>r</i>	11
20210117A	CRAFT	22:39:55.07	-16:09:05.4	0.2145	N	22.97	DEIMOS <i>R</i>	12, 13, This Work
20210320C	CRAFT	13:37:50.09	-16:07:21.7	0.2797	N	19.47	SOAR <i>r</i>	13, 14, This Work
20210410D	MeerTRAP	21:44:20.70	-79:19:05.5	0.1415	N	20.65	SOAR <i>r</i>	15, This Work
20210807D	CRAFT	19:56:53.14	-00:45:44.5	0.1293	N	17.17	Pan-STARRS <i>r</i>	13, 16, This Work
20211127I	CRAFT	13:19:13.97	-18:50:16.1	0.0469	N	14.97	SOAR <i>r</i>	13, 16, 17, This Work
20211203C	CRAFT	13:38:15.00	-31:22:48.2	0.3439	N	19.64	SOAR <i>r</i>	13, 14, This Work
20211212A	CRAFT	10:29:24.22	01:21:39.4	0.0707	N	16.44	SOAR <i>r</i>	13, 16, This Work
20220105A	CRAFT	13:55:12.94	22:27:59.4	0.2785	N	21.19	Pan-STARRS <i>r</i>	13, 14, This Work

**Note.** Properties of FRBs included in this work. The localization uncertainties are of the order of 1", with the majority  $<1"$ . All photometry is corrected for Galactic extinction following the Fitzpatrick & Massa (2007) extinction law. Redshift values are pulled from the literature or derived from `PyPeIt`. <sup>a</sup>: This column denotes the discovery telescope or collaboration and the localization facility. For those with one entry, the FRB was discovered and localized by the same group. We note that FRB 20201124A was further localized with the European VLBI Network (EVN; Piro et al. 2021). The coordinates provided here correspond to the ASKAP localization.

**References.** (1) Bassa et al. (2017), (2) Chatterjee et al. (2017), (3) Bhandari et al. (2022b), (4) Heintz et al. (2020), (5) Marcote et al. (2020), (6) Bannister et al. (2019), (7) Prochaska et al. (2019), (8) Macquart et al. (2020), (9) Niu et al. (2022), (10) Bhandari et al. (2020a), (11) Fong et al. (2021), (12) Bhandari et al. (2022a), (13) James et al. (2022), (14) R. Shannon (2023, in preparation), (15) Caleb et al. (2023), (16) A. Deller+23, in preparation, (17) Glowacki et al. (2023).

we use the existing Gemini South/Gemini Multi-Object Spectrograph (GMOS) spectrum (first reported in Macquart et al. 2020) to determine the redshift, this spectrum does not have a high enough S/N for our subsequent modeling. In this case, we still include this host, and take advantage of the seven photometric data points for modeling.

When applying these criteria to the existing literature and new FRBs obtained from the ASKAP/CRAFT and MeerKAT/MeerTRAP collaborations, we obtain a sample of 23 FRB host galaxies (six repeating FRBs and 17 apparent nonrepeaters). We list the properties of the FRBs, discovery surveys, and optical host magnitudes in Table 1. This compilation is the largest sample of highly secure localized FRB host galaxies to date and allows for a systematic study of their host properties and SFHs.

### 3. Observations and Data Reduction

#### 3.1. Imaging

Once the host for a given FRB is identified, we first search for archival photometry from optical and near-infrared (NIR) surveys: the SDSS (Alam et al. 2015), DECaLS (Dey et al. 2019), the Dark Energy Survey (DES; Abbott et al. 2021), the PS1 3 $\pi$  survey (Chambers et al. 2016), the Two Micron All Sky Survey (2MASS; Skrutskie et al. 2006), the VISTA Hemisphere Survey (VHS; McMahon et al. 2013), and the Wide-field Infrared Survey Explorer (WISE; Wright et al. 2010).

For the VHS data, we use a custom script to stack the available, reduced frames. This script implements `SWarp` (Bertin et al. 2002) to coadd the frames. We then set a default zero-point of 27.5 AB mag using the flux calibration from the European Southern Observatory (ESO) archive data reductions. For the WISE data, for which there is a choice of aperture, we select photometry values from the 'aperture 2' instrumental aperture (8.25" for W1, W2, and W3, and 16.5" for W4); these apertures were chosen as a balance between encompassing the entire host galaxy, allowing for the change in point-spread function (PSF) with wavelength, and avoiding flux from unassociated sources. We then convert all values to the AB magnitude system if needed.

For nine observations, particularly for FRBs in crowded regions or for hosts of large angular size, which are not adequately encompassed by the default apertures, we perform manual photometry. We created a custom script that implements the `aperture_photometry` module of `photutils` (Bradley et al. 2021).<sup>24</sup> We determined the aperture and annuli sizes by loading the images into `SAOImageDS9` (Joye & Mandel 2003) and adjusting the region sizes to ensure the host and background were modeled accurately. In most cases, the zero-points were taken from the header of the images after verifying the values were consistent with nearby photometric standards, but in cases where no zero-point was provided, we

<sup>24</sup> <https://github.com/charliekilpatrick/photometry>

performed PSF photometry on all point sources in the image using `DoPhot` (Schechter et al. 1993) and compared their instrumental magnitudes to SkyMapper DR2 standard stars (Onken et al. 2019) for southern fields ( $\delta < -30^\circ$ ) or Pan-STARRS DR2 standard stars (Flewelling et al. 2020) for more northern fields ( $\delta > -30^\circ$ ). We then converted to the AB magnitude system if needed for consistency with the rest of the data. Finally, we corrected the values for Galactic extinction using the Fitzpatrick & Massa (2007) extinction law. We report the data source, filters, photometry, uncertainties, and references in Appendix C.

To complement the existing archival data and fill out the host SEDs, we observed the fields of 10 FRBs with the Goodman High Throughput Spectrograph on the 4 m Southern Astrophysical Research Telescope (SOAR; PIs Fong, Gordon; Clemens et al. 2004); GMOS on the 8 m Gemini South Telescope (PI Tejos; Gimeno et al. 2016); the Low Resolution Imaging Spectrometer (LRIS) on the 10 m Keck I Telescope (PI Nugent; Oke et al. 1995); the MMT and Magellan Infrared Spectrograph (MMIRS) on the 6.5 m MMT (PI Nugent; McLeod et al. 2012); and, the FOcal Reducer and low dispersion Spectrograph 2 (FORS2; Appenzeller et al. 1998) and High Acuity Wide-field K-band Imager (HAWK-I; Pirard et al. 2004) on the 8 m Very Large Telescope (VLT; PIs Macquart, Shannon). Details of these observations, including the observation dates, filter, and corresponding magnitude, are reported in Table 5 in Appendix C. For six FRBs, we duplicate filters used in archival observations to increase the S/N of the detected host, or perform deeper searches if they were previously undetected.

We reduced the new Gemini, Keck, and MMT imaging data with the `POTPvRI`<sup>25</sup> pipeline. `POTPvRI` creates master bias, master dark, and master flat frames (depending on the types of calibrations available). These calibrations are applied to the science frames before alignment and stacking. A World Coordinate System (WCS) is calculated then applied by calibrating to the Gaia DR3 catalog (Gaia Collaboration et al. 2016, 2023). In the case where automatic WCS alignment fails (i.e., the rms of the astrometric fit is  $\geq 0.^{\circ}5$ ), we perform manual WCS alignment by interactively matching sources detected in the science image with known counterparts in either the Gaia DR3 (for optical images) or 2MASS (for NIR images) catalogs. Once the rms of the astrometric fit is of the order of  $0.^{\circ}2$ , we calculate the zero-point and proceed with PSF photometry as described above.

For the SOAR data, we use the `photpipe` pipeline (Rest et al. 2005) for reduction. This pipeline performs bias correction and flat-fielding and aligns the WCS against the Gaia DR3 catalog. The science frames are then sky subtracted, stacked, and regressed to a common pixel scale and field center using `SWarp` (Bertin et al. 2002). PSF photometry is performed on all point sources in the stacked image using a custom version of `DoPhot`. Finally, the pipeline calculates the zero-point of the final calibrated science image by comparing the instrumental PSF magnitudes to SkyMapper DR2 and Pan-STARRS DR2 standard stars using the same methods described above. We then applied these zero-points to aperture magnitudes obtained using `photutils`. The VLT data were reduced and further processed using the procedure detailed in Bhandari et al. (2022a).

We show representative images of all FRB hosts in the sample, including new observations and images from the literature

(Heintz et al. 2020; Macquart et al. 2020; Mannings et al. 2021; Tendulkar et al. 2021; Bhandari et al. 2022a, 2022b; Caleb et al. 2023), in Figure 1. In total, we present 29 new photometric measurements from our own imaging and 53 measurements from archival imaging. Finally, we collect 114 published photometric values from the literature and archives for 17 FRBs. These values and their references are listed in Table 5 in Appendix C.

For FRB 20190520B, we aligned the SOAR/Goodman field of view so that the bright, nearby star would not land on the detector. We then reduced the data with `photpipe` following the procedure described above. However, even with the care taken to avoid excess flux from the neighboring star, the background surrounding the host was still significantly greater than the rest of the field. In order to accurately calculate the photometry of the host, we applied a more complex-background model to our photometry code,<sup>26</sup> assuming a spatially varying 1D background that varies with the  $x$ ,  $y$ , and  $x * y$  pixel value from the center of the host galaxy. We then placed a  $2.^{\circ}0$  aperture around the host galaxy and all pointlike sources of emission close to FRB 20190520B. The resulting values are within 0.1–0.3 AB magnitudes of the values derived from the original photometry script, but we proceed with the complex-background subtracted values in our modeling as these are more representative of the true brightness of the host.

### 3.2. Spectroscopy

We obtained long-slit optical spectroscopy for the host galaxies of seven FRBs (20180916B, 20210320C, 20210807D, 20211127I, 20211203C, 20211212A, and 20220105A) and one mask observation for the field of FRB 20190520B (with one of the slits centered on the host galaxy center, used in this work). The observations were taken with Keck/LRIS (PIs Miller, Blanchard; Programs O304, O314), Keck/DEIMOS (PI Blanchard; Programs O287, O300), and SOAR/Goodman (PI Fong; Programs SOAR2021A-010, SOAR2021B-002). We designed the observations to span wavelengths of  $\lambda \approx 5000$ –10000 Å. We list this new spectroscopy, along with the gratings/grisms, and slit widths for each data set in Table 2.

For our subsequent host galaxy modeling (Section 4), we require an S/N  $\gtrsim 3/\text{\AA}$  in the continuum across most of the wavelength range. The slits were oriented to cover the center of the host galaxy and the center of the FRB position to search for possible anomalous emission at the FRB location. We manually inspected all of the spectra and found no additional continuum or line-emission detected at the FRB positions.

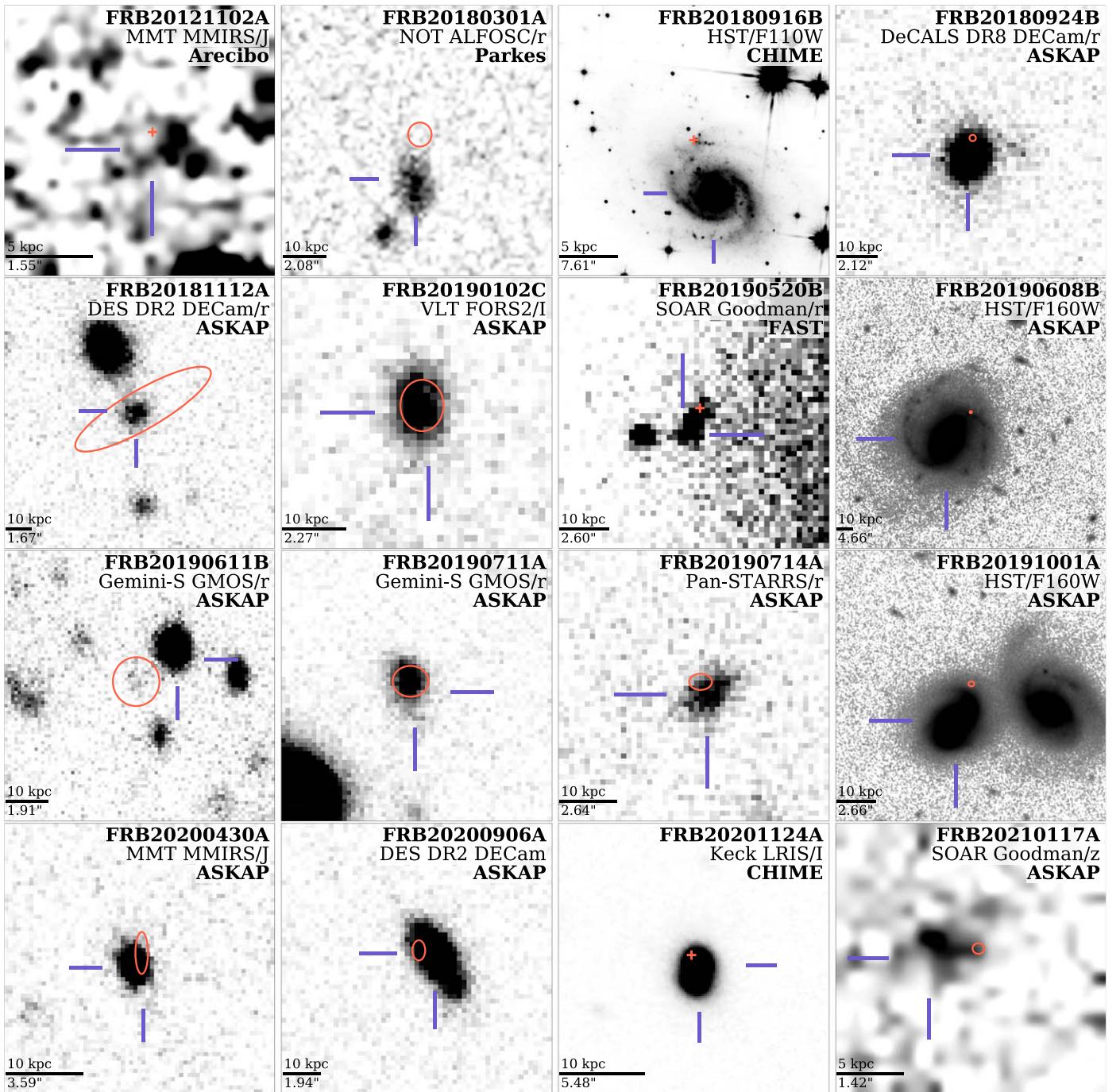
For the data taken with Keck, we obtained calibrations including arc lamps (Hg, Ne, Ar, Cd, Zn, Kr, Xe, or a subset of these), flat fields, bias frames, and spectrophotometric standard star spectra taken on the same night as the science data. For the SOAR data, we also obtained flat-field and arc lamp spectra (Hg, Ar, and Ne) on the same night as the science data and at a similar airmass. In order to flux calibrate the SOAR data, we used spectrophotometric standards from the SOAR archive<sup>27</sup> that used the same spectral setup and were observed as close to the date of the science observations as possible.

We reduced these data using the Python Spectroscopic Data Reduction Pipeline (`PypeIt`; Prochaska et al. 2020a, 2020b). `PypeIt` performs bias-subtraction, flat-fielding, cosmic-ray masking, and wavelength calibration of the raw frames. After

<sup>25</sup> <https://github.com/CIERA-Transients/POTPvRI>

<sup>26</sup> <https://github.com/charliekilpatrick/photometry>

<sup>27</sup> <https://archive.lco.global>



**Figure 1.** Imaging gallery of the 23 FRB hosts included in our sample, with images oriented with north up and east to the left. The host galaxies are marked by the purple crosshairs and the 68% confidence interval FRB localizations are denoted in red by an ellipse. For the three FRBs with milliarcsecond-scale localizations (FRB 20121102A; Marcote et al. 2017; FRB 20180916B; Marcote et al. 2020; and FRB 20201124A; Nimmo et al. 2022) and one with  $\sim 0.^{\prime\prime}1$  localization (FRB 20190520B; Niu et al. 2022), the position is indicated by a plus sign. The facility or survey that discovered the FRB is also listed.

the initial processing to generate a calibrated 2D spectral image, the pipeline extracts 1D spectra using the standard Horne algorithm (Horne 1986). At this step, we manually inspected the quality of the calibrated 1D and 2D spectra; in some cases, we implemented minor changes to default parameters to improve the extraction.

For instance, for SOAR/Goodman spectra, we include the flexure parameter `spec_method = boxcar` in the wavelength calibration module to account for instrumental flexure. In two cases, the host galaxy was too faint to be detected in the

individual frames with the default S/N threshold settings and required us to lower `snr_thresh`<sup>28</sup> in the object finding module to successfully identify the host trace. Finally, for two spectra, very strong emission lines in some of the host galaxies were misinterpreted as cosmic rays and masked in the extraction. If this was found to be the case during the manual inspection, we reran the pipeline with the profile masking turned off (`use_2dmodel_mask = False`).

<sup>28</sup> We note this was called `sig_thresh` in earlier versions.

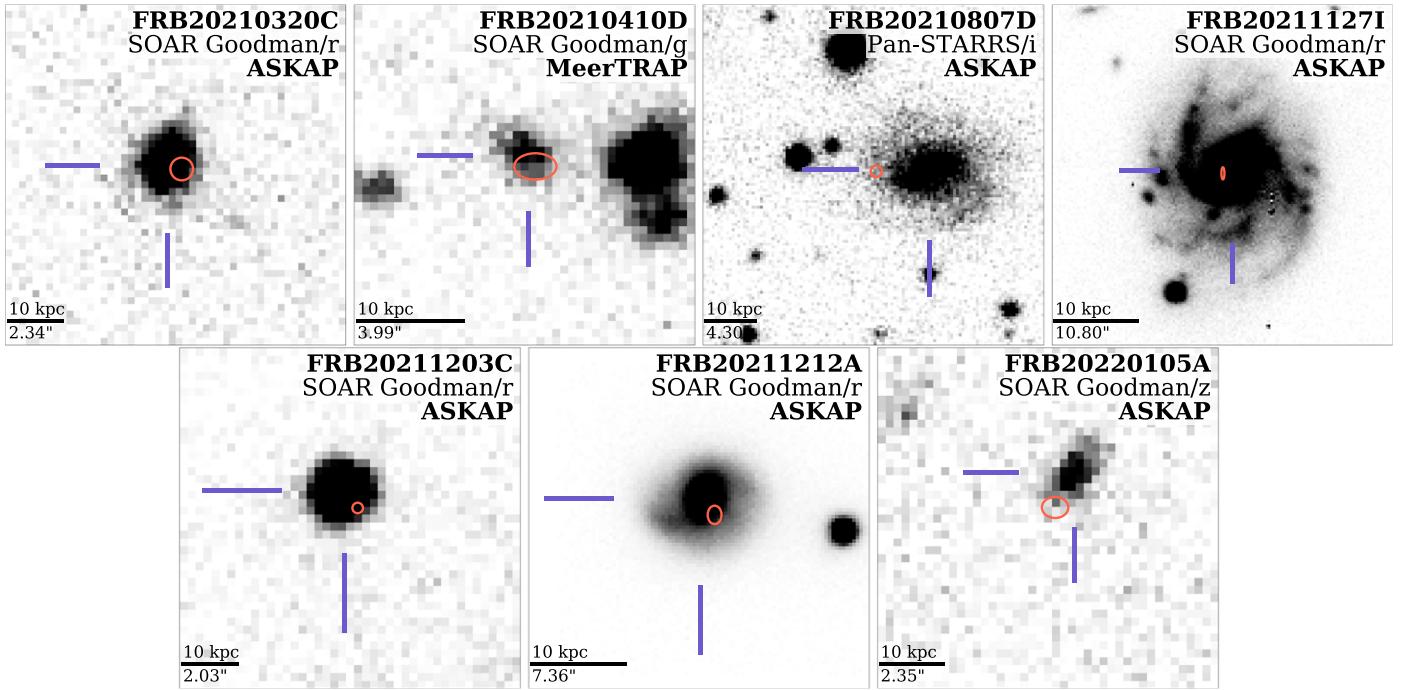


Figure 1. (Continued.)

**Table 2**  
FRB Host Galaxy Spectroscopy Details

FRB	Facility	Instrument	Observation Date	Grating/Grism	Slit Width (arcsec)	Program ID	Reference
20121102A	Gemini North	GMOS	2016 Nov 09 UT	R400	1.0	GN-2016B-DD-2	1
20180301A	Keck	DEIMOS	2020 Sept 17 UT	600ZD	1.0	O298	2
20180916B	Keck	LRIS	2020 Aug 18 UT	R400/8500, B400/3400	1.0	O304	This Work
20180924B	VLT	MUSE	2018 Nov 05 UT	VPHG	IFU	2101.A-5005	3
20181112A	VLT	FORS2	2018 Dec 05 UT	GRIS_300I	1.0	0102.A-0450(A)	4
20190102C	VLT	FORS2	2019 Mar 25 UT	GRIS_300I	1.3	0102.A-0450(A)	5
20190520B	Keck	DEIMOS	2022 Aug 28 UT	600ZD	1.0	O287	This Work
20190608B	SDSS 2.5-M	SDSS	2001 Oct 21 UT	...	...	...	5
20190611B	VLT	FORS2	2019 July 12 UT	GRIS_300I	1.3	0103.A-0101(A)	6
20190714A	Keck	LRIS	2020 Jan 28 UT	R600/7500	1.0	U180	6
20191001A	Gemini South	GMOS	2019 Oct 04 UT	R400	1.0	GS-2019B-Q-132	6
20200430A	Keck	DEIMOS	2020 June 07 UT	600ZD	1.0	E353	2
20200906A	Keck	DEIMOS	2020 Sept 17 UT	600ZD	0.7	O298	2
20201124A	MMT	Binospec	2021 Apr 03 UT	270 I	1.0	UAO-G195-21A	7
20210117A	VLT	FORS2	2021 Sept 06 UT	GRIS_300I	1.0	105.204W.003	8
20210320C	SOAR	Goodman	2021 Apr 05 UT	R400, M2	1.0	SOAR2021A-010	This Work
20210410D	Gemini South	GMOS	2021 Oct 14 UT	R400	1.0	GS-2021B-Q-138	9
20210807D	Keck	LRIS	2021 Aug 11 UT	R400/8500, B400/3400	1.0	O314	This Work
20211127I	SOAR	Goodman	2022 Jan 1 UT	R400, M2	1.0	SOAR2021B-002	This Work
20211203C	SOAR	Goodman	2022 Feb 1 UT	R400, M2	1.0	SOAR2021B-002	This Work
20211212A	SOAR	Goodman	2021 Dec 08 UT	R400, M2	1.0	SOAR2021B-002	This Work
20220105A	Keck	DEIMOS	2022 Mar 31 UT	600ZD	1.0	O300	This Work

**Note.** Details of the spectroscopic observations included in this work.

**References.** (1) Tendulkar et al. (2017), (2) Bhandari et al. (2022b), (3) Bannister et al. (2019), (4) Prochaska et al. (2019), (5) Bhandari et al. (2020a), (6) Heintz et al. (2020), (7) Fong et al. (2021), (8) Bhandari et al. (2022a), (9) Caleb et al. (2023).

After extraction, we apply relative flux calibration using spectrophotometric standard spectra. If multiple exposures were taken, we reduced each exposure separately and coadded the wavelength-calibrated 1D spectra. The final error spectrum generated by the pipeline is a combination of uncertainties

propagated from each calibration step and shot noise in the electron counts. We then perform telluric correction on the co-added spectra using the corresponding atmospheric grids for each observatory site and apply correction for Galactic extinction according to the Fitzpatrick & Massa (2007) extinction law.

To measure a preliminary redshift, we use the XSpecGUI viewer from `linetools` (Prochaska et al. 2017) included in `PypeIt` to determine the redshift of the host galaxies. This tool overlays the locations of common lines onto the observed spectrum after specifying a fiducial redshift. We adjust the redshift estimate until major features are matched. In particular, we base our initial redshift determination on the Balmer lines ( $\text{H}\alpha$ ,  $\text{H}\beta$ ),  $[\text{O III}]\lambda 4959$ , 5007 emission features, and Ca II H&K absorption features when available. These serve as input redshifts for our full galaxy modeling (Section 4).

We supplement our new spectra with those of 13 FRB hosts previously published in the literature. These include FRBs 20180301A, 20200430A, 20200906A (Bhandari et al. 2022b), 20180924B (Bannister et al. 2019), 20181112A (Prochaska et al. 2019), 20190102C, 20190608B (Bhandari et al. 2020a), 20190611B, 20190714A, 20191001A (Heintz et al. 2020), 20201124A (Fong et al. 2021), 20210117A (Bhandari et al. 2022a), and 20210410D (Caleb et al. 2023). These fully reduced data sets are publicly available and accessible via the F4 Github repository (FRBs/FRB; Prochaska et al. 2023). In addition, we retrieved archival Gemini North/GMOS spectroscopy for the host of FRB 20121102A (first published in Tendulkar et al. 2017, PI Tendulkar, Program GN-2016B-DD-2) from the Gemini Observatory Archive<sup>29</sup> and reduced the data with `PypeIt` as described above. As this host is faint, we reduced the S/N threshold so the host trace would be detectable in the individual frames and turned off the profile masking module.

In total, our sample comprises 22 FRB hosts with usable spectroscopy. Details of these observations and those taken from the literature are presented in Table 2. We use all of these spectra in the modeling (Section 4), with the exception of FRB 20190711A, which has insufficient S/N to be included in the fitting. In Figure 2, we show the spectra of all new observations presented in this work with major lines denoted and organized by chemical species (see Section 4 for more details on the normalization process).

#### 4. Host Galaxy Modeling

To determine the host stellar population properties, we use the Bayesian modeling code `Prospector` (Johnson et al. 2021). `Prospector` is a stellar population synthesis code that derives the posterior probability distributions of stellar population properties for a given observational data set. We use the stellar population synthesis library `python-fsps` to generate the model SEDs and `Prospector` to jointly fit the photometry and spectroscopy (Conroy et al. 2009; Conroy & Gunn 2010). The posteriors are sampled using the dynamic nested sampling routine `dynesty` (Speagle 2020). We initiate our fits with a number of assumptions. First, we employ a Kroupa (2001) initial mass function (IMF) and Kriek & Conroy (2013) dust attenuation curve. We also require that the fits roughly adhere to the Gallazzi et al. (2005) mass–metallicity ( $M$ – $Z$ ) relation by assuming a Gaussian scatter around the relationship with a standard deviation twice the measured scatter to allow for potential redshift evolution.

Unique to this work and the study of FRB host galaxies, we use a nonparametric SFH with a continuity prior (see, e.g., Leja et al. 2019a) represented by eight age bins. While more computationally expensive than stellar population modeling

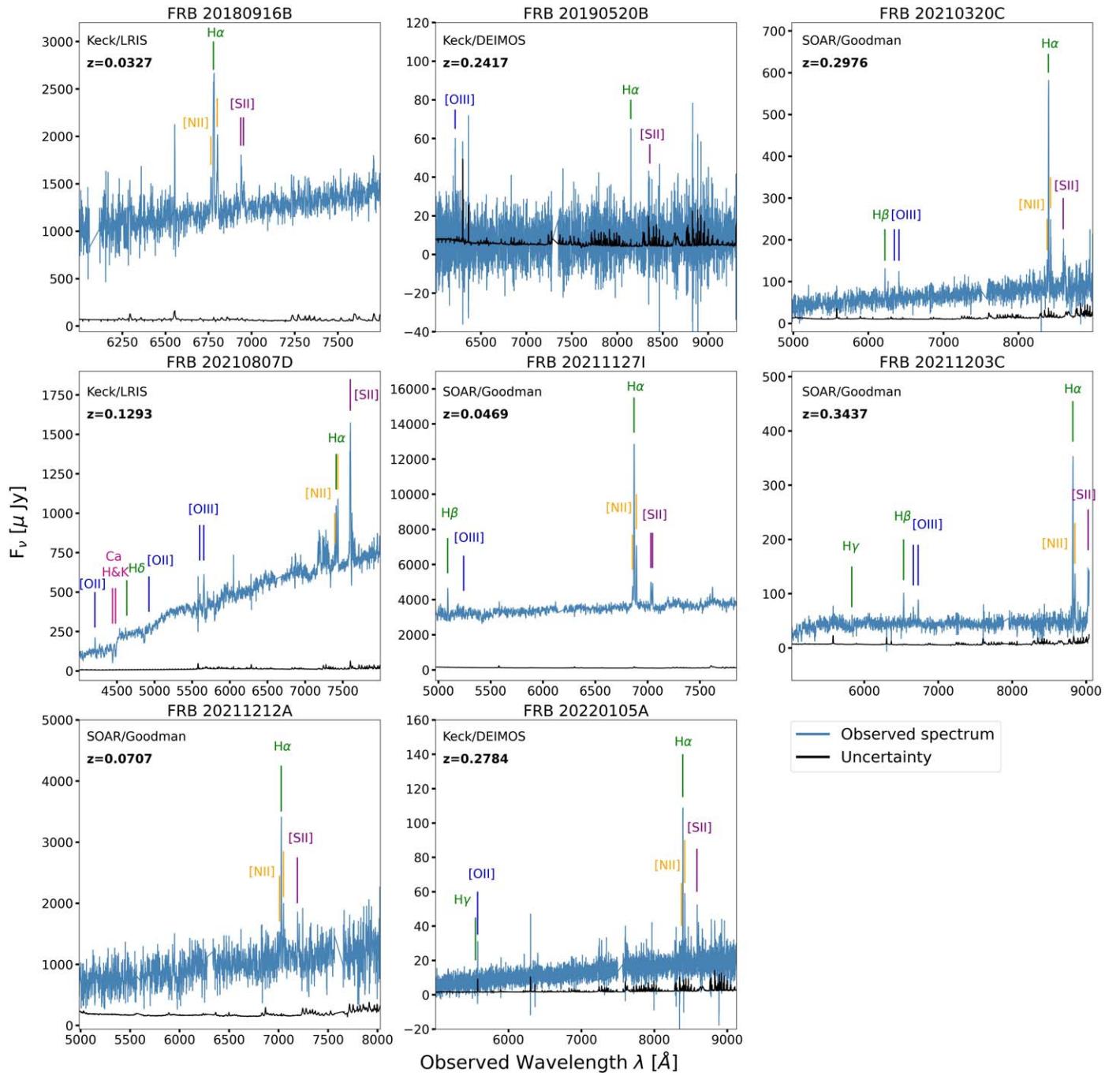
with a parametric SFH, nonparametric modeling is more physically realistic due to the lack of strong priors dictating how and when galaxies form their mass (Leja et al. 2017, 2019a). We provide further information on the implementation of the nonparametric SFH and the continuity prior in Appendix A. Furthermore, we employ a spectral smoothing model, a model to normalize the spectrum to the photometry, a pixel outlier model to marginalize over poorly modeled noise, and a jitter model to deal with noise in the observed spectrum (see Appendix D of Johnson et al. 2021 for further details of these procedures). For the spectrum normalization model, we use a 12th-order Chebyshev polynomial to fit the model spectrum to the observed spectrum.

In general, we fit for total mass formed ( $M_F$ ), stellar metallicity ( $Z_*$ ), redshift ( $z$ ), the dust attenuation of stellar light ( $\text{dust2}$ ), the fraction of dust attenuation of young stellar light ( $\text{dust1\_fraction}$ ), the offset in slope from the Calzetti et al. (2000) dust attenuation curve ( $\text{dust\_index}$ ), the velocity dispersion of the spectrum ( $\sigma_{\text{smooth}}$ ), and the ratios of star formation rate between each of the age bins ( $\text{logsfr\_ratios}$ ). If a spectrum is included, which is the case for all of our fits except the host of FRB 20190711A, we fit for the gas-phase metallicity ( $Z_{\text{gas}}$ ) and the gas ionization parameter ( $U_{\text{min}}$ ). For galaxies with rest-frame infrared data  $\geq 2 \mu\text{m}$ , we fit for the mass fraction of polycyclic aromatic hydrocarbons ( $q_{\text{PAH}}$ ) and include a two-component active galactic nucleus (AGN) model in the fit: the fraction of total AGN luminosity relative to the bolometric stellar luminosity ( $f_{\text{agn}}$ ) and the optical depth of the AGN dust torus ( $\tau_{\text{AGN}}$ ). We list further details on the exact prior ranges and distributions used in Table 6 of Appendix D.

To initiate the observations for fitting, we use the Galactic extinction-corrected photometry and spectroscopy and apply a mask to all spectra, which limits the rest-frame wavelength coverage to that of the MILES spectral library (masking everything above approximately 7500 Å, rest frame) and removes the Na I D absorption lines from the fit. We apply additional masking as needed to regions where the error spectrum dominates the observed spectrum or to account for detector chip gaps. While the redshifts are known for each of the hosts in the sample, we treat redshift as a free but tightly constrained parameter, allowing a  $\pm 0.01$  deviation from the initial value determined from our manual inspection of the spectral features. This freedom allows for some flexibility due to small uncertainties propagated from the data reduction and redshift determination. We report these redshifts in Table 3 and in Figure 2.

For the nonparametric SFH, we use eight age bins for the continuity SFH prior. Leja et al. (2019a) found that varying the number of age bins between 4 and 14 bins produced little variation in the results. We choose eight bins to balance resolving features in the SFH (e.g., starburst events) and the computational resources required to run the models (which increase with the model dimensionality). The first two bins are fixed to 0–30 Myr and 30–100 Myr, and the maximum of the last bin is fixed to the age of the Universe at the redshift of the host. The remaining six bins are spaced evenly in logarithmic time. We then use the SFH combined with other parameters to determine a number of key inferred properties: the star formation rate integrated over the past 100 Myr ( $\text{SFR}_{0-100 \text{ Myr}}$ ), the mass-weighted age ( $t_m$ ), dust attenuation of young and old stellar light ( $A_{V,\text{young}}$  and  $A_{V,\text{old}}$ , respectively),

<sup>29</sup> <https://archive.gemini.edu>



**Figure 2.** New spectroscopic observations included in this work from SOAR/Goodman, Keck/DEIMOS, and Keck/LRIS. Major emission and absorption lines are denoted by colored lines: Balmer lines are in green, oxygen lines are in blue, nitrogen lines are in orange, sulfur lines are in purple, and calcium lines are in pink. The spectra are normalized to the photometry in `Prospector`. The `Prospector`-derived redshifts are listed in each panel along with the facility/instrument of observation.

and stellar mass ( $M_*$ ). In particular, the mass-weighted age is more sensitive to the older stars in the galaxy than light-weighted ages, which tend to be dominated by younger, brighter stars (Conroy 2013). We allow `dust1_fraction`, to be a free parameter. We convert this to `dust1` by multiplying it by `dust2`. We then convert both `dust1` and `dust2` to extinction in the  $V$  band in magnitudes by multiplying by 1.086 to convert from optical depth to magnitudes of dust attenuation for  $A_{V,\text{young}}$  and  $A_{V,\text{old}}$ , respectively. We use the total mass formed, combined with the SFH, IMF, and metallicity, to calculate stellar mass by

multiplying  $M_F$  by the surviving mass fraction. For each of the inferred properties, we construct a posterior distribution and report the median, 16th, and 84th quantiles.

Finally, as part of the fits, we also self-consistently model and measure the strength of the emission lines using a nebular marginalization template. We refer the reader to Appendix A for further details on the `Prospector` fitting and conversions from fit to calculated parameters. We report the median of the posterior distributions of the stellar population properties for all 23 FRB hosts modeled, as well as the 68% credible intervals in Table 3. As an example of our process, we present the SED for

**Table 3**  
Stellar Population Properties

FRB	$z$	$\log(M_F/M_\odot)$	$\log(Z_*/Z_\odot)$	$A_{V,\text{young}}$ (mag)	$A_{V,\text{old}}$ (mag)	AGN	$\log(Z_{\text{gas}}/Z_\odot)$	$\text{SFR}_{0-100 \text{ Myr}}$ ( $M_\odot \text{ yr}^{-1}$ )	$\log(M_*/M_\odot)$	$t_m$ (Gyr)
20121102A	0.1931	$8.34^{+0.10}_{-0.11}$	$0.11^{+0.05}_{-0.11}$	$1.10^{+0.25}_{-0.26}$	$0.11^{+0.09}_{-0.06}$	N	$-0.62^{+0.07}_{-0.06}$	$0.05^{+0.02}_{-0.01}$	$8.14^{+0.09}_{-0.10}$	$5.71^{+0.96}_{-1.26}$
20180301A	0.3305	$9.84^{+0.12}_{-0.13}$	$-0.99^{+0.27}_{-0.21}$	$1.18^{+0.28}_{-0.27}$	$0.31^{+0.17}_{-0.12}$	N	$-0.33^{+0.05}_{-0.04}$	$1.91^{+0.64}_{-0.55}$	$9.64^{+0.11}_{-0.11}$	$4.34^{+1.10}_{-1.29}$
20180916B	0.0330	$10.13^{+0.04}_{-0.05}$	$-1.80^{+0.12}_{-0.11}$	$0.94^{+0.27}_{-0.25}$	$0.35^{+0.07}_{-0.01}$	N	$0.18^{+0.18}_{-0.18}$	$0.04^{+0.03}_{-0.02}$	$9.91^{+0.03}_{-0.03}$	$7.73^{+0.86}_{-1.22}$
20180924B	0.3212	$10.60^{+0.02}_{-0.03}$	$-0.14^{+0.04}_{-0.04}$	$1.10^{+0.30}_{-0.25}$	$0.11^{+0.03}_{-0.03}$	N	$0.03^{+0.08}_{-0.08}$	$0.62^{+0.32}_{-0.24}$	$10.39^{+0.02}_{-0.02}$	$5.63^{+0.53}_{-0.75}$
20181112A	0.4755	$10.06^{+0.07}_{-0.08}$	$-0.19^{+0.27}_{-0.32}$	$1.16^{+0.26}_{-0.31}$	$0.13^{+0.13}_{-0.08}$	N	$-0.17^{+0.12}_{-0.12}$	$1.54^{+0.99}_{-0.65}$	$9.87^{+0.07}_{-0.07}$	$3.82^{+0.84}_{-0.98}$
20190102C	0.2909	$9.90^{+0.09}_{-0.09}$	$-1.15^{+0.37}_{-0.39}$	$1.09^{+0.29}_{-0.29}$	$0.20^{+0.18}_{-0.13}$	N	$-0.51^{+0.78}_{-0.51}$	$0.40^{+0.31}_{-0.11}$	$9.69^{+0.09}_{-0.11}$	$4.76^{+1.02}_{-1.47}$
20190520B	0.2417	$9.30^{+0.08}_{-0.11}$	$-1.55^{+0.33}_{-0.29}$	$1.18^{+0.27}_{-0.33}$	$0.15^{+0.15}_{-0.10}$	N	$-0.68^{+0.45}_{-0.55}$	$0.04^{+0.04}_{-0.02}$	$9.08^{+0.08}_{-0.09}$	$5.27^{+1.02}_{-1.32}$
20190608B	0.1178	$10.78^{+0.02}_{-0.02}$	$-0.03^{+0.04}_{-0.04}$	$1.09^{+0.22}_{-0.21}$	$0.08^{+0.02}_{-0.02}$	Y	$0.02^{+0.05}_{-0.05}$	$7.03^{+1.43}_{-1.15}$	$10.56^{+0.02}_{-0.02}$	$7.13^{+0.70}_{-1.21}$
20190611B	0.3778	$9.77^{+0.13}_{-0.13}$	$-0.84^{+0.55}_{-0.54}$	$1.20^{+0.28}_{-0.30}$	$0.45^{+0.35}_{-0.23}$	N	$0.00^{+0.11}_{-0.42}$	$0.53^{+0.77}_{-0.26}$	$9.57^{+0.12}_{-0.12}$	$4.45^{+0.98}_{-1.34}$
20190711A	0.5218	$9.29^{+0.17}_{-0.25}$	$-0.99^{+0.53}_{-0.54}$	$1.06^{+0.26}_{-0.28}$	$0.28^{+0.34}_{-0.16}$	N	...	$0.95^{+0.96}_{-0.50}$	$9.10^{+0.15}_{-0.23}$	$3.54^{+0.96}_{-1.36}$
20190714A	0.2365	$10.42^{+0.04}_{-0.05}$	$-0.09^{+0.22}_{-0.55}$	$1.05^{+0.28}_{-0.27}$	$0.69^{+0.32}_{-0.19}$	Y	$0.12^{+0.22}_{-0.21}$	$1.89^{+1.22}_{-0.72}$	$10.22^{+0.04}_{-0.04}$	$5.48^{+0.75}_{-1.02}$
20191001A	0.2342	$10.92^{+0.08}_{-0.09}$	$-0.52^{+0.11}_{-0.10}$	$1.15^{+0.28}_{-0.25}$	$1.06^{+0.10}_{-0.10}$	N	$-0.08^{+0.11}_{-0.11}$	$18.28^{+17.24}_{-8.95}$	$10.73^{+0.07}_{-0.08}$	$3.89^{+1.68}_{-1.56}$
20200430A	0.1607	$9.51^{+0.07}_{-0.10}$	$-0.99^{+0.32}_{-0.35}$	$1.08^{+0.32}_{-0.33}$	$0.38^{+0.14}_{-0.15}$	Y	$-0.12^{+0.06}_{-0.06}$	$0.11^{+0.06}_{-0.04}$	$9.30^{+0.07}_{-0.10}$	$5.99^{+0.96}_{-1.31}$
20200906A	0.3688	$10.57^{+0.05}_{-0.06}$	$-0.39^{+0.18}_{-0.15}$	$1.09^{+0.27}_{-0.23}$	$0.20^{+0.10}_{-0.10}$	Y	$-0.26^{+0.14}_{-0.13}$	$4.93^{+3.46}_{-2.34}$	$10.37^{+0.05}_{-0.05}$	$4.30^{+0.86}_{-1.11}$
20201124A	0.0980	$10.43^{+0.05}_{-0.05}$	$-0.58^{+0.11}_{-0.11}$	$1.25^{+0.27}_{-0.25}$	$0.73^{+0.10}_{-0.10}$	Y	$0.18^{+0.19}_{-0.11}$	$2.72^{+1.65}_{-1.22}$	$10.22^{+0.05}_{-0.05}$	$6.13^{+0.95}_{-1.16}$
20210117A	0.2145	$8.80^{+0.05}_{-0.07}$	$-1.82^{+0.18}_{-0.12}$	$1.19^{+0.26}_{-0.32}$	$0.05^{+0.06}_{-0.03}$	N	$-0.30^{+0.07}_{-0.08}$	$0.02^{+0.01}_{-0.01}$	$8.59^{+0.05}_{-0.06}$	$5.01^{+0.95}_{-1.21}$
20210320C	0.2796	$10.57^{+0.06}_{-0.06}$	$-0.82^{+0.16}_{-0.17}$	$1.26^{+0.26}_{-0.26}$	$0.64^{+0.15}_{-0.17}$	N	$0.01^{+0.12}_{-0.16}$	$3.51^{+2.44}_{-1.45}$	$10.37^{+0.05}_{-0.06}$	$4.56^{+0.99}_{-1.15}$
20210410D	0.1415	$9.70^{+0.05}_{-0.06}$	$-1.04^{+0.19}_{-0.27}$	$1.14^{+0.28}_{-0.30}$	$0.39^{+0.13}_{-0.11}$	N	$0.03^{+0.26}_{-0.23}$	$0.03^{+0.03}_{-0.01}$	$9.47^{+0.05}_{-0.05}$	$6.78^{+1.02}_{-1.48}$
20210807D	0.1293	$11.20^{+0.02}_{-0.02}$	$-0.52^{+0.04}_{-0.05}$	$1.08^{+0.17}_{-0.15}$	$0.04^{+0.03}_{-0.03}$	Y	$-0.26^{+0.07}_{-0.07}$	$0.63^{+0.18}_{-0.17}$	$10.97^{+0.02}_{-0.02}$	$8.36^{+2.25}_{-1.84}$
20211127I	0.0469	$9.58^{+0.08}_{-0.02}$	$-0.53^{+0.03}_{-0.02}$	$1.22^{+0.25}_{-0.31}$	$0.06^{+0.01}_{-0.01}$	Y	$0.29^{+0.13}_{-0.12}$	$35.83^{+1.02}_{-1.46}$	$9.48^{+0.06}_{-0.02}$	$3.85^{+2.13}_{-3.65}$
20211203C	0.3437	$9.90^{+0.09}_{-0.10}$	$0.00^{+0.12}_{-0.19}$	$1.08^{+0.26}_{-0.25}$	$0.04^{+0.04}_{-0.02}$	N	$-0.25^{+0.15}_{-0.14}$	$15.91^{+2.82}_{-2.98}$	$9.76^{+0.07}_{-0.09}$	$2.47^{+2.00}_{-1.25}$
20211212A	0.0707	$10.49^{+0.06}_{-0.07}$	$-0.77^{+0.11}_{-0.12}$	$1.19^{+0.26}_{-0.27}$	$0.19^{+0.04}_{-0.03}$	N	$0.20^{+0.17}_{-0.26}$	$0.73^{+0.62}_{-0.39}$	$10.28^{+0.05}_{-0.06}$	$5.83^{+1.05}_{-1.16}$
20220105A	0.2784	$10.22^{+0.06}_{-0.07}$	$-0.81^{+0.16}_{-0.14}$	$1.15^{+0.26}_{-0.28}$	$0.76^{+0.15}_{-0.17}$	Y	$-0.14^{+0.13}_{-0.13}$	$0.42^{+0.31}_{-0.19}$	$10.01^{+0.05}_{-0.07}$	$5.67^{+0.73}_{-1.24}$

**Note.** Median and 68% confidence intervals of the stellar population properties.  $z$  is the *Prospector*-derived redshift. These values are highly consistent with those reported in Table 1 to within 0.1%.  $\log(M_F/M_\odot)$  represents total mass formed.  $\log(Z_*/Z_\odot)$  is the stellar metallicity.  $A_{V,\text{young}}$  and  $A_{V,\text{old}}$  are the magnitudes of dust extinction for young and old stars, respectively. AGN denotes if the AGN model was used in the fitting process—this does not necessarily imply the presence of a known AGN in the system.  $\log(Z_{\text{gas}})$  is the gas-phase metallicity.  $\text{SFR}_{0-100 \text{ Myr}}$  is the integrated 0–100 Myr star formation rate.  $\log(M_*/M_\odot)$  is the stellar mass. Finally,  $t_m$  is the mass-weighted age. The values and uncertainties for all derived measurements will be made available via the F4 repository (FRBs/FRB; Prochaska et al. 2023).

FRB 20211127I in Figure 3, while the remaining host SED fits are presented in Appendix B.

## 5. Results

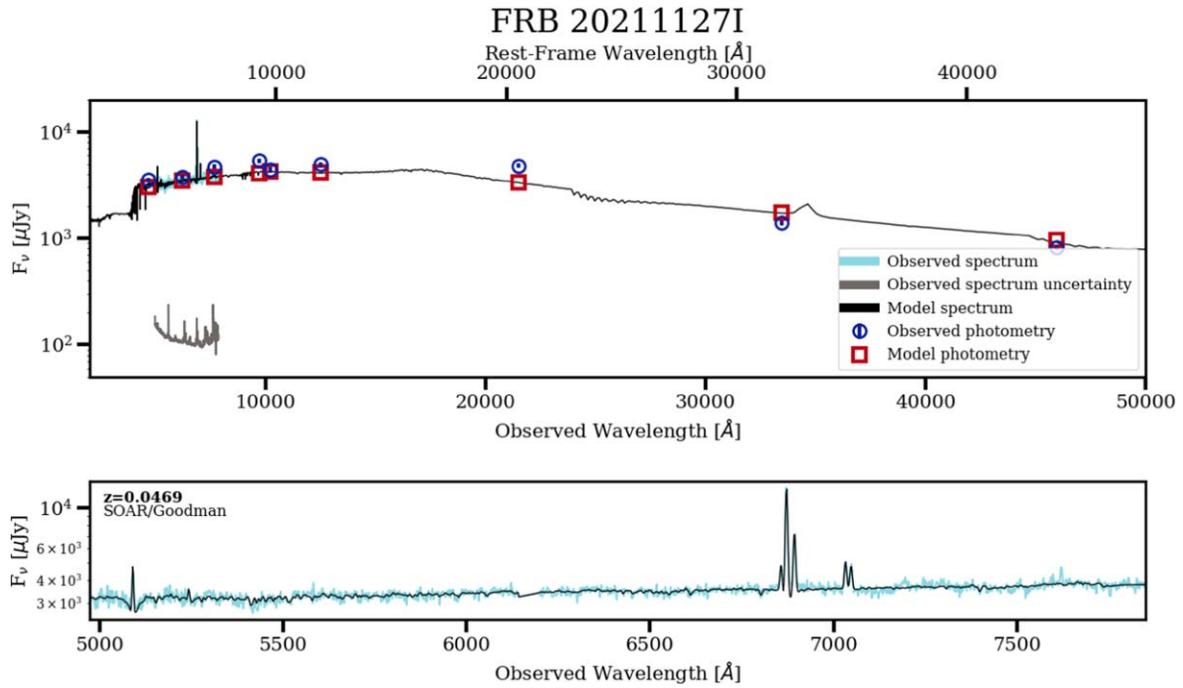
### 5.1. Stellar Population Properties

We now present the inferred stellar population properties of the 23 FRB host galaxies in our sample as a whole. To calculate population medians, we draw 1000 representative samples of  $\log(M_*/M_\odot)$ ,  $\log(Z_*/Z_\odot)$ ,  $t_m$ ,  $A_{V,\text{young}}$ , and  $A_{V,\text{old}}$ , and construct distributions of  $\log(\text{SFR}_{0-100 \text{ Myr}})$  and specific star formation rate (sSFR; star formation rate divided by stellar mass;  $\log(\text{sSFR}_{0-100 \text{ Myr}})$ ) as described above for each host galaxy. We chose 1000 draws as this constitutes a representative sample from which deviations in the median and 68% confidence intervals are negligible with increasing numbers of draws. We then combine the distributions for each parameter and derive the medians and 68% credible intervals for the total population.

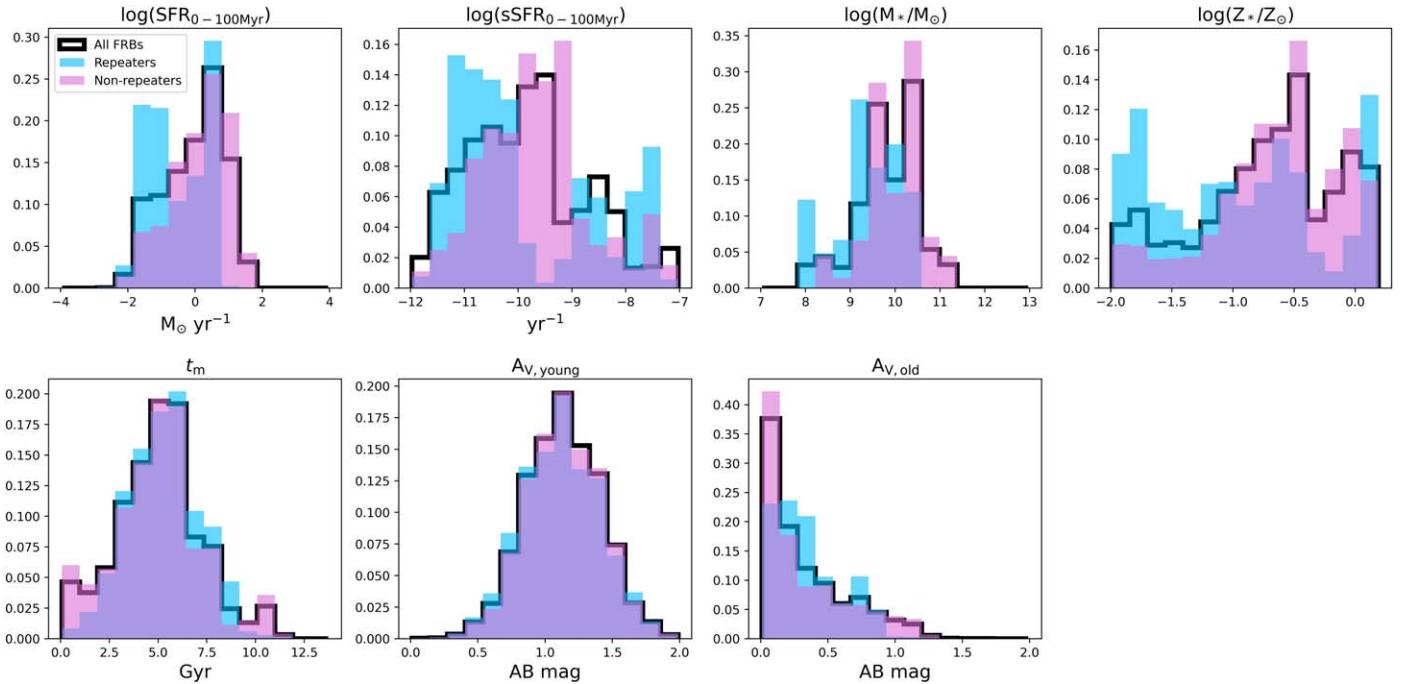
We find that the FRB host population has a median  $t_m \approx 5.12$  Gyr (interquartile range of 3.72–6.30 Gyr) and  $\log(M_*/M_\odot) \approx 9.86$  (interquartile range of 9.46–10.33). The two hosts with the lowest  $\log(M_*/M_\odot)$  are those of the repeating FRB 20121102A and the nonrepeating FRB 20210117A, with  $\approx 8.1$  and  $8.6$ , respectively; both fall in the dwarf galaxy class ( $\lesssim 10^9 M_\odot$ ; Bullock & Boylan-Kolchin 2017). For comparison, these are 1 order of magnitude less massive than the Large

Magellanic Cloud with  $\log(M_*/M_\odot) \approx 9.43$  (van der Marel et al. 2002) and closer to that of the Small Magellanic Cloud with  $\log(M_*/M_\odot) \approx 8.49$  (van der Marel et al. 2009). The median  $\text{SFR}_{0-100 \text{ Myr}} \approx 1.3 M_\odot \text{ yr}^{-1}$  (interquartile range of 0.20–4.0  $M_\odot \text{ yr}^{-1}$ ), while the median  $\log(\text{sSFR}_{0-100 \text{ Myr}}) \approx -9.86 \text{ yr}^{-1}$  (interquartile range of  $-10.69$  to  $-9.17 \text{ yr}^{-1}$ ). We present the posterior distributions of a selection of stellar population properties and derived properties for the full host sample in Figure 4. We report these results numerically in Table 4.

We next compare the host galaxy properties of repeating and nonrepeating FRBs by presenting their five-number summaries derived from the full posterior distributions as described above. These statistics are represented visually by boxplots in Figure 5. We find that their distributions of mass-weighted ages, stellar metallicities, and sSFR values are similar, spanning nearly the full range available to galaxies (although in the latter property, nonrepeaters span a wider range). We also find that the hosts of nonrepeaters tend to have slightly larger stellar masses (population median  $\log(M_*/M_\odot) \approx 10.01$  versus 9.40 for the hosts of repeaters). To test whether the stellar population properties of repeaters and nonrepeaters could originate from the same underlying distribution, we perform an Anderson–Darling (A-D) two-sample test with a chosen cutoff  $p$ -value of 0.05 (95% confidence). We find  $p$ -values  $> 0.2$  in all properties, with the exception of stellar mass for which we derive a  $p$ -value of 0.060 and stellar metallicity for which we derive a  $p$ -value of 0.164. Thus, we do not find



**Figure 3.** Example SED for the host of FRB 20211127I. Top panel: the observed spectrum (light blue) and its associated error spectrum (light gray) are modeled jointly with the observed photometry (blue circles). The best-fit Prospector model spectrum (black) and corresponding model photometry (red squares) are also displayed. Bottom panel: zoom-in of the observed and model spectra following the same color scheme as the top panel. As the nebular emission lines are self-consistently modeled, the Prospector model provides excellent agreement to the spectroscopic data. The remaining SEDs are in Appendix B.

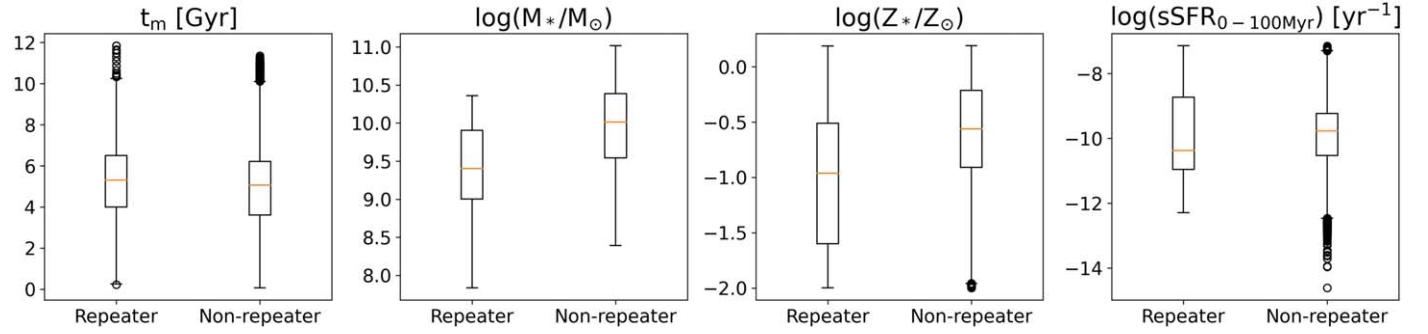


**Figure 4.** Posterior distributions of  $\log(SFR_{0-100 \text{ Myr}})$ ,  $\log(sSFR_{0-100 \text{ Myr}})$ ,  $\log(M_*/M_\odot)$ ,  $\log(Z_*/Z_\odot)$ ,  $t_m$ ,  $Av_{\text{young}}$ , and  $Av_{\text{old}}$  for the full sample. We show the repeater (blue) and nonrepeater (pink) populations separately. While the two populations are similar for most properties, repeaters tend to have lower  $\log(M_*/M_\odot)$  than nonrepeaters.

any evidence that the stellar population properties of repeaters and nonrepeaters are statistically distinct.

We also note a few outliers from this analysis. The host of the nonrepeating FRB 20211127I has an  $sSFR_{0-100 \text{ Myr}} \approx 10^{-8.29} \text{ yr}^{-1}$ , over 1 order of magnitude higher than the next-greatest FRB in the same redshift range—the highly active

FRB 20201124A at  $10^{-9.73} \text{ yr}^{-1}$ . At  $z = 0.0469$ , FRB 20211127I is a relatively young ( $\approx 4$  Gyr), nearby spiral galaxy with an age and redshift among the lowest in the sample. This host additionally shows an elevated H I-to-stellar mass ratio and has a slight asymmetry in H I (Glowacki et al. 2023). The other notable outlier is the host age of FRB 20210807D. This is the



**Figure 5.** Boxplots of the full sample of FRB hosts split by repeater and nonrepeaters derived from 1000 representative samples of the hosts’ posterior probability distributions. The box represents the range between the first and third quartiles, with the median denoted by an orange line. The whiskers denote the maxima and minima, and outliers are represented by circles.

**Table 4**  
FRB Host Galaxy Stellar Population Property Statistics

Population	$\log(\text{SFR}_{0-100 \text{ Myr}})$ ( $M_{\odot} \text{ yr}^{-1}$ )	$\log(\text{sSFR}_{0-100 \text{ Myr}})$ ( $\text{yr}^{-1}$ )	$\log(M_{\text{F}}/M_{\odot})$	$\log(M_{*}/M_{\odot})$	$\log(Z_{*}/Z_{\odot})$	$t_{\text{m}}$ (Gyr)	$A_{\text{V, young}}$ (mag)	$A_{\text{V, old}}$ (mag)
Full Sample	$0.11^{+0.81}_{-1.31}$	$-9.86^{+1.26}_{-1.16}$	$10.06^{+0.55}_{-0.67}$	$9.86^{+0.55}_{-0.68}$	$-0.63^{+0.54}_{-0.75}$	$5.12^{+1.97}_{-2.15}$	$1.13^{+0.28}_{-0.28}$	$0.23^{+0.46}_{-0.17}$
Repeaters	$-0.56^{+1.01}_{-0.95}$	$-10.37^{+2.39}_{-0.77}$	$9.59^{+0.75}_{-1.11}$	$9.40^{+0.73}_{-1.11}$	$-0.96^{+0.89}_{-0.80}$	$5.31^{+1.83}_{-1.83}$	$1.11^{+0.29}_{-0.29}$	$0.30^{+0.37}_{-0.2}$
Nonrepeaters	$0.26^{+0.84}_{-1.03}$	$-9.77^{+0.86}_{-1.06}$	$10.23^{+0.50}_{-0.63}$	$10.01^{+0.54}_{-0.55}$	$-0.56^{+0.48}_{-0.54}$	$5.07^{+1.99}_{-2.30}$	$1.13^{+0.28}_{-0.27}$	$0.20^{+0.51}_{-0.14}$

**Note.** Median and 68% confidence intervals of the stellar population properties for the full sample, repeaters, and nonrepeaters.  $\log(\text{SFR}_{0-100 \text{ Myr}})$  is the logarithm of the integrated 0–100 Myr star formation rate.  $\log(\text{sSFR}_{0-100 \text{ Myr}})$  is the logarithm of the specific star formation rate.  $\log(M_{\text{F}}/M_{\odot})$  represents total mass formed.  $\log(M_{*}/M_{\odot})$  is the stellar mass.  $\log(Z_{*}/Z_{\odot})$  is the stellar metallicity.  $t_{\text{m}}$  is the mass-weighted age. Finally,  $A_{\text{V, young}}$  and  $A_{\text{V, old}}$  are the magnitudes of dust extinction for young and old stars, respectively.

oldest and most-massive FRB host ( $8.36^{+2.25}_{-1.84}$  Gyr and  $\log(M_{*}/M_{\odot}) \approx 10.97$ ) and is also the only quiescent galaxy in the sample (see Section 6.1) with an  $\text{sSFR}_{0-100 \text{ Myr}} \approx 10^{-11.41} \text{ yr}^{-1}$ , the lowest in the sample.

Heintz et al. (2020) and Bhandari et al. (2022b) were the first FRB host population studies based on 12 and 16 hosts, respectively. They found FRB hosts span  $\log(M_{*}/M_{\odot}) \approx 8 - 10.8$ ,  $t_{\text{m}} \approx 0.06 - 1.6$  Gyr, and SFRs  $\approx 0.05 - 10 M_{\odot} \text{ yr}^{-1}$ , essentially much of the parameter space expected for galaxies within the redshift ranges of their samples. Their SFRs were primarily derived from H $\alpha$  emission line measurements, which trace more recent SF (timescales of 10–30 Myr). These previous studies performed stellar population modeling using the photometry-only code CIGALE (Boquien et al. 2019), employing a parametric delayed- $\tau$  SFH. One known difference between parametric and nonparametric SFHs is that nonparametric SFHs allow for older, more-massive galaxies (Leja et al. 2019b), essentially giving the galaxies the freedom to form more mass over a longer time period, and are more physically realistic. In our analysis, the strength of the 4000 Å break in the spectrum also drives the older ages, with more considerable breaks implying older stellar populations. Indeed, our new analysis finds significantly older ages by a factor of  $\approx 5$  and slightly larger stellar masses compared to previous studies (see Section 6.3 for further discussion). An additional difference between earlier works and this one is the IMF used (Chabrier IMF in Heintz et al. 2020 and Bhandari et al. 2022b versus Kroupa here). However, the expected differences in mass and SFR attributed to the assumed IMF between these models are very small (Comroy 2013).

## 5.2. The Relationship between FRBs and Current Star Formation

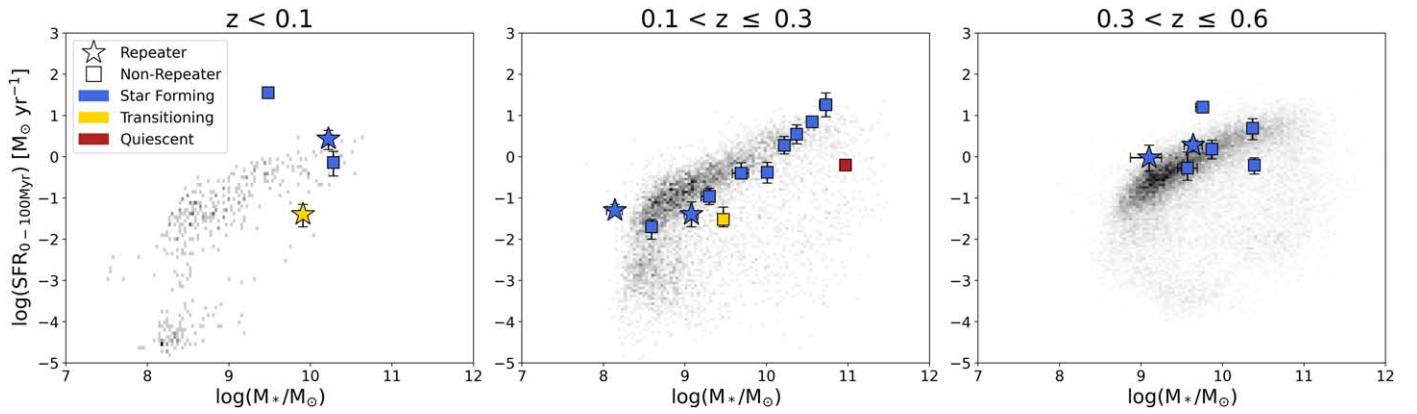
One of the main context clues for transients and their host galaxies is how they trace active star formation in galaxies.

This is particularly important for FRBs given their potential association with magnetars (CHIME/FRB Collaboration et al. 2020a; Bochenek et al. 2020). To systematically classify the degree of star formation in FRB hosts, we use the mass-doubling number criterion from Tacchella et al. (2022) to classify the hosts into star-forming, transitioning (off the main sequence), or quiescent galaxies. From Equation (2) of Tacchella et al. (2022),

$$\mathcal{D}(z) = \text{sSFR}(z) \times t_{\text{H}}(z) \quad (1)$$

where  $t_{\text{H}}(z)$  is the age of the Universe at the redshift of the host galaxy. Following their classification, if  $\mathcal{D}(z) > 1/3$ , the galaxy is star-forming; if  $1/3 < \mathcal{D}(z) < 1/20$ , the galaxy is transitioning; and, if  $\mathcal{D}(z) < 1/20$ , the galaxy is quiescent. To determine the classification, we take the distribution of  $\log(\text{sSFR}_{0-100 \text{ Myr}})$  (generated from 1000 representative draws of  $\text{sSFR}_{0-100 \text{ Myr}}$  and  $\log(M_{*}/M_{\odot})$ ) and 1000 draws of  $t_{\text{m}}$ , ensuring the values come from the same models. We then calculate the mass-doubling number for each of the 1000 models and take the mode to determine the most common classification. We find that the large majority of FRB hosts are star-forming (20 hosts), two are transitioning (FRBs 20180916B and 20210410D), and one is quiescent (FRB 20210807D). Two of the transitioning and/or quiescent hosts are associated with apparent nonrepeating FRBs, although the repeating FRB 20180916B is classified as transitioning as well.

We next compare the SFRs and stellar masses of FRB hosts (specifically, the  $\log(\text{SFR}_{0-100 \text{ Myr}})$ – $\log(M_{*}/M_{\odot})$  phase space) to field galaxies from the COSMOS sample (Laigle et al. 2016), as shown in Figure 6. We emphasize that these background galaxies were similarly modeled using Prospector with a nonparametric continuity SFH in Leja et al. (2020),



**Figure 6.** The recent star formation rate vs. stellar mass for the full host sample plotted against the COSMOS field galaxies, tracing the star-forming main sequence. We split the sample into three redshift bins (individual panels) to account for evolution in the sequence. Repeaters and nonrepeaters are denoted by stars and squares, respectively. The symbols are color-coded by their Taccella et al. (2022) classification.

allowing for a direct comparison to our derived properties for FRB hosts. We divide the FRB hosts and COSMOS galaxies into three redshift bins, spanning  $z < 0.1$ ,  $0.1 < z \leq 0.3$ , and  $0.3 < z \leq 0.6$ , to enable a proper comparison as there is redshift evolution in this phase space. The well-known star-forming main sequence of galaxies (SFMS; e.g., Whitaker et al. 2012; Speagle et al. 2014; Leja et al. 2022) is apparent; in general, galaxies below the SFMS are transitioning off or completely quiescent.

We find that the majority of FRB hosts trace the SFMS across all redshifts.<sup>30</sup> This demonstrates that FRB hosts are forming stars at a similar rate to field galaxies at a given stellar mass. The one star-forming outlier is the host of the apparent nonrepeating FRB 20211127I, which lies well above the main sequence and is the most active galaxy in our sample. We otherwise note that the classification of an FRB as a repeater or nonrepeater does not appear to have an effect on the placement of star-forming hosts relative to the SFMS.

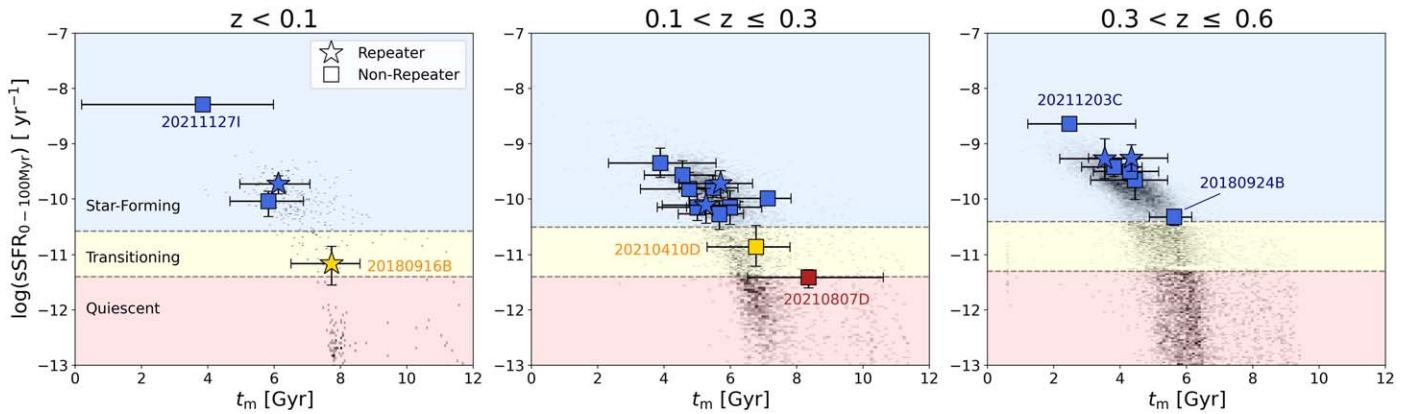
In previous works on FRB host galaxies, the majority of the FRB hosts were found to be slightly offset from the SFMS, with smaller star-forming rates than field galaxies of similar stellar mass (e.g., Figure 4 of Bhandari et al. 2022b). As discussed in Section 5.1, we find slightly larger stellar masses and otherwise similar SFRs. However, previous studies used the PRIMUS catalog (Moustakas et al. 2013) for their field galaxy comparison. When compared to that of COSMOS, the SFMS of PRIMUS is higher by 1 order of magnitude, effectively resulting in an upward shift in the background galaxy comparison sample and a relative downward shift in the locations of the FRB hosts. The specific interpretation of why the PRIMUS SFMS is significantly higher is beyond the scope of this work, but is likely due to their inclusion of a bursty SFH and lack of IR information. In this work, we use the analysis of the COSMOS data set from Leja et al. (2020) derived using identical methodology to our FRB hosts, and are thus free of inter-code systematics. By performing a direct comparison for the first time and employing a quantitative criterion for degree of star formation, we find that only a few are formally “off” the SFMS. In other words, the primary difference is the field galaxy modeling, as opposed to any large systematic differences in stellar population properties.

<sup>30</sup> We stress that this is not a selection effect in our data. Although the criteria outlined in Section 2.1 require that the host galaxy spectrum shows clear features such as optical emission lines, in practice, no quiescent galaxies were excluded from our sample by this requirement.

We next examine the phase space of sSFR versus mass-weighted age (Figure 7). This comparison is meaningful because for nonparametric SFHs, both of these parameters are moments of the SFH. Thus, this serves as a proxy for comparing the SFHs of the FRB hosts to those of field galaxies. We find the star-forming FRB hosts lie in the densest regions occupied by the majority of the COSMOS galaxies, and that there is no apparent distinction between the host galaxies of repeaters and nonrepeaters in this phase space. This demonstrates that the SFHs of FRB hosts are also not unique among field galaxies (although we note the presence of outliers such as the host of the very star-forming and relatively young FRB 20211127I); we discuss further in Section 6.1.

### 5.3. Star Formation Histories

Complementary to comparisons involving recent star formation in hosts, we can also leverage our derived SFHs. In particular, given the higher apparent activity of repeating FRBs, it is useful to examine if their progenitors might depend on the level of SF activity over time. In Figure 8, we show the SFHs of the 23 hosts in our sample over lookback time ( $t_{\text{lookback}}$ ), color-coded by SFH type. Specifically, we classify the FRB host SFHs into five types: rising (purple), delayed- $\tau$  exponentially declining (teal),  $\tau$ -linear exponentially declining (green), post-starburst (yellow), and rejuvenating (orange). Rising SFHs, which comprise five galaxies in the sample, are typically associated with dwarf and/or irregular galaxies, and naturally are classified by a consistent rise in SF over time (Papovich et al. 2011). The exponentially declining SFHs are characteristic of typical  $L_*$  galaxies. The delayed- $\tau$  (10 hosts) and  $\tau$ -linear (five hosts) exponentially declining SFHs are functional forms commonly invoked for parametric SFH modeling (e.g., Carnall et al. 2019). Galaxies of both SFH types form most of their stars at early times and decrease in their activities to the present day, with the delayed- $\tau$  model having an important “delay” in the onset of the peak of star formation (contributing to a “rise-and-fall” shape in the SFH). Post-starburst SFH galaxies have undergone a recent epoch of high star formation followed by a quenching event (e.g., Wild et al. 2009; Suess et al. 2020, 2022), and comprise two of the hosts. There is a singular possibly rejuvenating host galaxy, FRB 20210807D. This type of galaxy SFH is fairly rare and is characterized by a recent increase in SF activity after a period of quiescence (e.g., Zhang 2022).



**Figure 7.**  $\log(sSFR_{0-100 \text{ Myr}})$  vs.  $t_m$  of FRB host galaxies compared to COSMOS field galaxies for three redshift bins. The parameter space is divided into star-forming, transitioning, and quiescent following the Tacchella et al. (2022) classification. Repeaters are denoted by stars, and nonrepeaters are denoted by squares. Both are color-coded by their classification type. Error bars correspond to 68% confidence. While FRB 20210807D is on the borderline between transitioning (445 model draws) and quiescent (555 model draws), the mode favors a quiescent classification and is thus classified as such.

Overall, we find that the population of FRB hosts exhibits a diverse range of SFHs, with the majority of FRB hosts (43%) falling into the delayed- $\tau$  exponentially declining class in which the peak of SF occurred in the last  $\sim 0.1$ –1 Gyr; this class includes potentially unexpected hosts like the dwarf-like FRB 20190520B. Notably, we find that the majority of hosts with clear and prolonged rising SFHs (e.g., increase in SFRs over time) are those of repeating FRBs (FRBs 20121102A, 20180301A, 20190711A, and 20201124A); however, the nonrepeating FRB 20211203C shows this SFH type as well. We also find repeating FRB hosts with delayed- $\tau$  and  $\tau$ -linear SFHs. We find evidence of past starburst activity in two host galaxies, both of which originated nonrepeating FRBs, corresponding to an occurrence rate of 9% (2/23 hosts). This is in stark contrast to the rate of post-starburst galaxies in SDSS (0.2%), although we note that the selection criteria for the SDSS sample may underestimate the total fraction of galaxies having undergone a starburst event (French et al. 2018). The SDSS criteria is also based on Balmer absorption lines, whereas ours is from the SFHs. Within the final  $\sim$ Gyr of lookback time, most FRB hosts are rising or at their peak SF activity; some exhibit this behavior even in the final  $\sim 100$  Myr. Other than these distinctions, we otherwise find no clear patterns or correlations between the host SFHs of repeaters or nonrepeaters.

#### 5.4. Optical Host Luminosities

Given the low luminosity of the first identified FRB host galaxy (FRB 20121102A; Tendulkar et al. 2017), it is worthwhile to compare the luminosities of repeating and nonrepeating FRBs across redshift. We present the distribution of host optical luminosities ( $\nu L_\nu$ ) and redshift in our sample in Figure 9, divided into repeaters and nonrepeaters. We supplement our sample of 23 FRB hosts with identified hosts of seven FRBs from the literature that did not meet the criteria for inclusion in our sample (a combination of low PATH probabilities were detected past the date cutoff of 2022 January, or have burst energetics below our cutoff) but nonetheless have claimed host identifications and redshifts. These include the CHIME FRB 20190425A (Panther et al. 2023), DSA FRB 20190523A (Ravi et al. 2019), realfast FRB 20190614D (Law et al. 2020), CHIME FRB 20190110C (Ibik et al. 2023), CHIME FRB 20200120E (Kirsten et al. 2022), CHIME FRB 20200223B (Ibik et al. 2023), DSA

FRB 20220319D (Ravi et al. 2023), DSA FRB 20220509G (Connor et al. 2023; Sharma et al. 2023), ASKAP/CRAFT FRB 20220610A (Ryder et al. 2022), DSA FRB 20220912A (Ravi et al. 2022b), and DSA FRB 20220914A (Connor et al. 2023; Sharma et al. 2023). We also plot a demarcation at  $\nu L_\nu = 10^9 L_\odot$  below which a host can be classified as a dwarf galaxy (Figure 9).

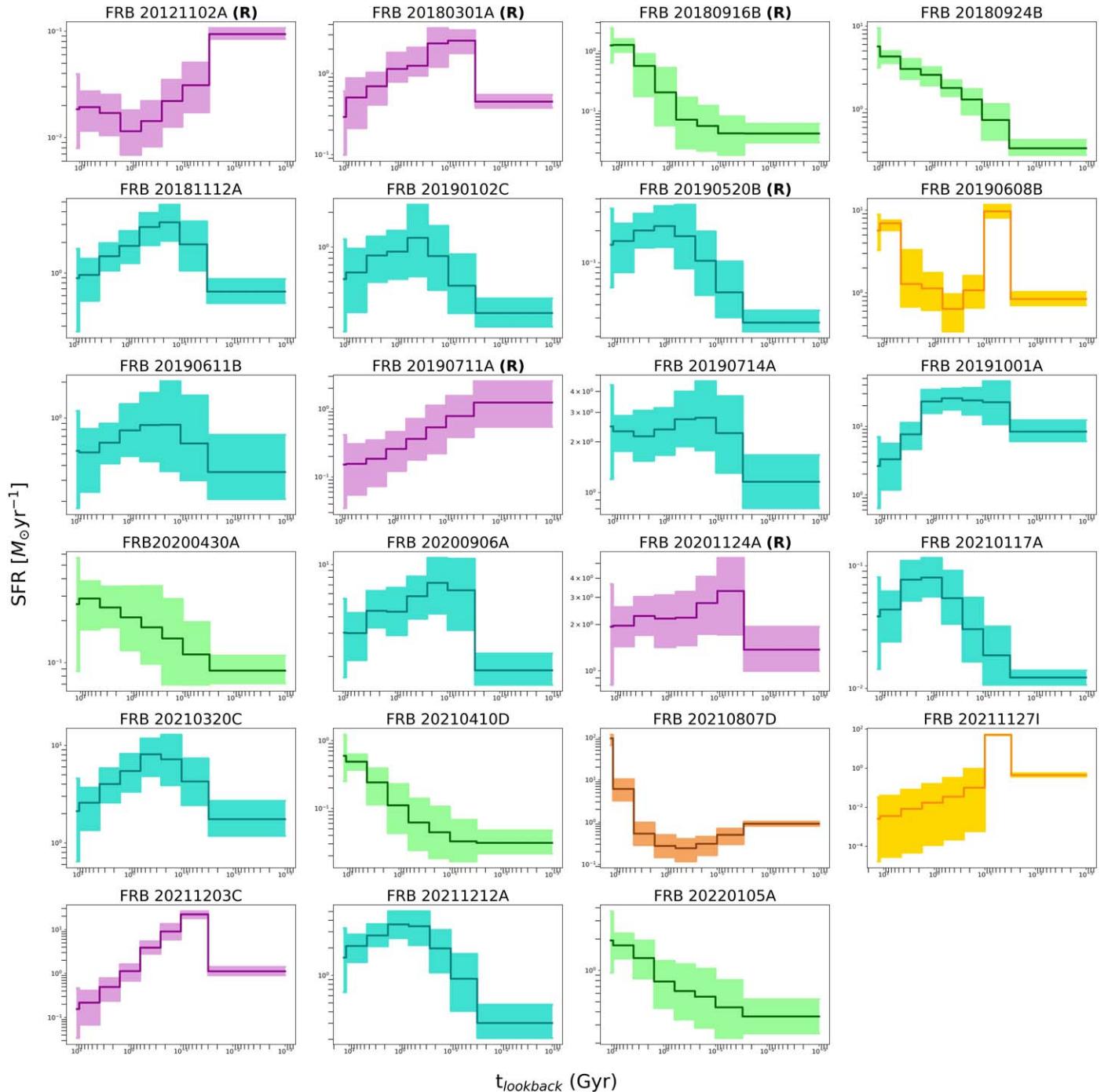
First, we find that FRB hosts have a median luminosity of  $\approx 6 \times 10^9 L_\odot$ , and span a wide range from the faintest at  $\approx 2 \times 10^8 L_\odot$  (FRB 20121102A) to the most luminous at  $\approx 3 \times 10^{10} L_\odot$  (FRB 20191001A). Next, we find that the hosts of repeaters extend to lower luminosities than those of nonrepeaters. Moreover, no repeating FRB hosts in our sample have  $\nu L_\nu \gtrsim 10^{10} L_\odot$  while nine nonrepeating FRB hosts (or 53% of the total nonrepeating host population in our sample) have luminosities in this range. This is consistent with the finding that nonrepeaters also exist in galaxies with larger stellar masses (Section 5.1). We also note that for  $z \lesssim 0.6$ , repeating and nonrepeating FRBs appear to have similar redshift distributions (Figure 9), although only nonrepeating FRBs have been observed at higher redshifts.

Finally, the only repeating FRB whose host falls into the category of dwarf galaxy is FRB 20120112A, while two additional hosts of repeaters, FRBs 20190520B and 20220912A (Ravi et al. 2023a) sit just above the borderline at  $\approx 1.1 \times 10^9 L_\odot$ . FRB 20190520B has been described as a dwarf galaxy in the literature based on the *J*-band color (Niu et al. 2022), but our modeling reveals it to be slightly more massive than a canonical dwarf galaxy. Notably, the dwarf galaxy luminosity space is not only occupied by repeating FRB hosts; indeed, two nonrepeating FRB hosts (FRBs 20210117A and 20220319D) have low luminosities of  $\approx 4 \times 10^8 L_\odot$  and can be classified as dwarfs (Bhandari et al. 2022a; Ravi et al. 2023). This is again consistent with their low stellar masses as discussed in Section 5.1.

## 6. Discussion

### 6.1. The Relationship between FRBs, Star Formation, and Implications for the Progenitors

Numerous lines of evidence support the scenario that at least some fraction of the FRB progenitor population is composed of magnetars: the FRBs’ coherent emission (Katz 2014), energetics (Margalit et al. 2020b), durations (Nimmo et al. 2022),

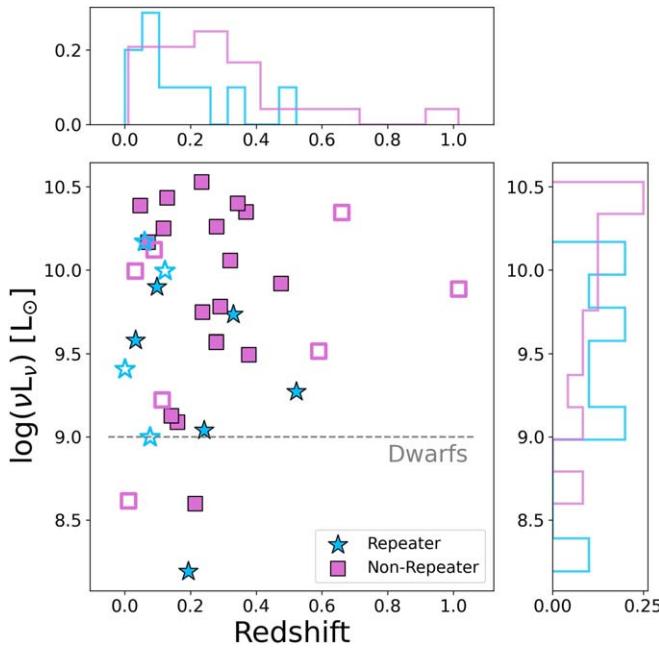


**Figure 8.** Star formation histories (SFHs) of all FRB host galaxies in the sample. The  $x$ -axis is the lookback time, such that the left-hand side is the age of the Universe at the redshift of the galaxy, and the right-hand side is the present day. The SFHs are color-coded by SFH type: rising (purple), delayed- $\tau$  exponentially declining (teal),  $\tau$ -linear exponentially declining (green), post-starburst (yellow), and rejuvenating (orange). We denote repeating FRBs with an (R) in the titles.

rates (CHIME/FRB Collaboration et al. 2021), stochastic cycles of strong activity or “burst storms” (Lanman et al. 2022; Marthi et al. 2022), evidence for strongly magnetized local environments via their RMAs (Wang et al. 2022), and occasional detection of luminous PRSs colocated with FRBs (Chatterjee et al. 2017; Marcote et al. 2017; Law et al. 2022; Niu et al. 2022; Ravi et al. 2022). The possibility of magnetars as FRB progenitors was strengthened by the repeating FRB-like emission from a known Galactic magnetar SGR 1935+2145 (CHIME/FRB Collaboration et al. 2020a; Bochenek et al. 2020; Zhang et al. 2023). It is therefore natural to consider

whether the observed FRB host galaxy population is consistent with all FRBs originating from a magnetar progenitor (although with present data it cannot be ruled out that there are multiple progenitors altogether).

The best-studied pathway to magnetar formation is through the core-collapse supernovae (CCSNe) of recently formed massive stars. Indeed, a young, massive star channel for the origins of Galactic magnetars is supported by observations of core-collapse supernova remnants (see, e.g., Gaensler 2004; Vink 2008; Zhou et al. 2019, 2020). In addition, isochrone dating of Galactic magnetars shows that they occur in stellar



**Figure 9.** Luminosity-redshift distribution for all FRB hosts to date. We denote repeaters by blue stars and nonrepeaters by pink squares. We also include FRB hosts from the literature that did not meet our sample criteria as open symbols.

populations with a range of main-sequence turnoff masses from  $17\text{--}50 M_{\odot}$  (implying lifetimes of 5–12 Myr; Muno et al. 2006; Bibby et al. 2008; Davies et al. 2009; Tendulkar et al. 2012).

However, observations of FRB environments as a whole are difficult to reconcile with a single, young production channel for magnetars that is responsible for all observed FRBs. For instance, FRB 20200120E was pinpointed to a  $\sim 9$  Gyr old globular cluster environment in M81 (Bhardwaj et al. 2021; Kirsten et al. 2022), signifying that at least some FRBs can originate from delayed channels that do not rely on recent massive star formation. It is still viable that magnetars could be responsible for events that originate in older stellar populations, via close binary evolution or the accretion-induced collapse of a white dwarf (Moriya 2016; Margalit et al. 2019; Kremer et al. 2021), although progenitors not involving magnetars could also be at play, especially for repeaters (i.e., a neutron star interacting with a companion; Ioka & Zhang 2020; Lyutikov et al. 2020; or accreting black hole binaries; Sridhar et al. 2021). It has also been predicted that the mergers of two neutron stars (NSs), which can experience potentially long delay times of several gigayears or more, could produce magnetars that may be indefinitely stable to collapse and eventually produce observable FRBs (Totani 2013; Wang et al. 2016; Pan et al. 2022). The recent claim of an association between the binary NS merger GW190425 and an FRB 20190425A would be definitive evidence for another such delayed channel (Moroiyanu et al. 2023; Panther et al. 2023). These pieces of evidence are consistent with the results of Li & Zhang (2020) who found that the current sample of FRB host environments are consistent with magnetars formed through multiple formation channels. Multiwavelength observations of the local environment were also informative for the repeating FRB 20180916B. Due to its relative proximity (149 Mpc), Tendulkar et al. (2021) found that the FRB was 250 pc from the nearest star-forming region, a location

inconsistent with a young magnetar had the progenitor been kicked from this region. Kaur et al. (2022) performed HI mapping of the host and larger-scale environment, finding evidence for a past minor galaxy merger. While they find that the progenitor was likely born from a massive star originating in a burst of star formation triggered by the merger, they still conclude that the progenitor likely traveled from the nearest star-forming knot identified in Tendulkar et al. (2021). Studies of the local environments provide unique constraints on progenitor models, but are limited to the closest FRB hosts ( $z < 0.05$ ). As the majority of hosts are at redshifts higher than this, we must also rely on the properties gleaned from global host studies.

It is thus instructive to examine the FRB host population and its relation to star formation and SFH. On subgalactic scales, high-resolution UV and NIR imaging of a smaller number of FRB hosts have demonstrated that several FRBs occur in or near the spiral arms of their host galaxies, and thus their locations track active star formation within their galaxies (Chittidi et al. 2021; Mannings et al. 2021). Additional studies based on global properties of FRB hosts have found the majority are near to or slightly below the SFMS, in the band typically occupied by galaxies that are transitioning off the main sequence (Heintz et al. 2020; Bhandari et al. 2022b; Ravi et al. 2022). A number of these also occur outside of the “blue cloud” of a color-magnitude diagram, although none to date have formally been categorized as quiescent.

Here, based on uniformly derived properties and an accurate comparison to like-modeled field galaxies, we find that the majority lie on the SFMS (i.e., they are forming stars at similar rates to field galaxies of the same stellar mass). Furthermore, based on quantitative criteria to classify galaxies by degree of star formation (Tacchella et al. 2022), we find that 87% (20/23) of FRB hosts are star-forming, two are transitioning, and one is quiescent. We also find a wide range of SFRs (integrated over the past 100 Myr), spanning  $2 \times 10^{-2} M_{\odot} \text{ yr}^{-1} - 36 M_{\odot} \text{ yr}^{-1}$ . Two of the galaxies that are transitioning and quiescent host apparently nonrepeating FRBs (FRBs 20210410D and 20210807D), although we note that the repeating FRB 20180916B host is transitioning as well. Both hosts additionally have older ages of  $\approx 7\text{--}8$  Gyr.

The SFH can also inform progenitor models of transients. For example, the declining SFHs of so-called Ca-rich transients indicate that core-collapse SNe progenitors are unlikely (Dong et al. 2022), while the post-starburst nature of the hosts of tidal disruption events have been used to exclude O, B, and massive A type stars as likely progenitors (French et al. 2017). In our sample, we find that only a few have monotonically declining SFHs (which signifies that the large majority of the host stellar mass formed early on in the first few gigayears). Instead, examining the last  $\sim 1$  Gyr, most FRB hosts are either rising in SF activity or at their peak, while all four FRB hosts with prolonged rises are repeaters; see Section 6.2 for a further discussion. We also find a few hosts with evidence of past starburst activity  $\sim 100$  Myr, commensurate with HI mapping studies, which have shown evidence for minor mergers (Michałowski 2021; Kaur et al. 2022). While a complete analysis to determine probable progenitor rates would require constructing mass build-up histories and assumptions on delay-time distributions, our results indicate that most FRB hosts were fairly active over the last  $\lesssim 0.1\text{--}1$  Gyr.

Finally we note that there are three hosts in our sample for which diffuse radio emission has been detected and attributed

to star formation (Bhandari et al. 2020a, 2020b; Fong et al. 2021; Ravi et al. 2022b), and in one case, possibly more localized to the burst site (Piro et al. 2021). While these hosts are not distinct in their SFHs, we find that they all have generally larger SFRs from their SEDs, and two have higher extinction values (in particular,  $A_{V,\text{old}}$ ). While many bursts in our sample lack constraining radio observations, it would be useful to compare if bursts with more recent SF activity from their SFHs also have detectable radio emission.

Taken together, FRB hosts thus originate from galaxies of different levels of star formation activity, but have a clear preference for star-forming galaxies representative of those from the field. Our demographics and SFHs also imply that while the majority of FRB progenitor systems are unlikely to come from highly evolved stellar populations (e.g., white dwarfs; Liebert et al. 1988; Wood 1992) or other transient events with long delay times (such as merging neutron stars and black holes; e.g., Zevin et al. 2022), the existence of at least a couple of known hosts in less-active environments leaves open this possibility. Already, more FRBs are being found in these types of environments. Recent analysis from Sharma et al. (2023) presented the first quiescent, elliptical FRB host galaxy association (FRB 20220509G), which is additionally part of the galaxy cluster Abell 2311. However, the connection between most FRBs and active star formation supports the young magnetar model theory, where magnetars are formed through the core-collapse supernovae of recently formed massive stars in the past 100 Myr, for the majority of FRBs.

## 6.2. Comparison of the Host Properties for Repeating and Apparently Nonrepeating FRBs

As the number of distinct FRB sources now exceeds 600,<sup>31</sup> various properties have been proposed to distinguish repeating and nonrepeating FRBs. For instance, repeaters first exhibited both a downward drift in frequency known as the “sadtrombone” effect (Hessels et al. 2019) and high linear polarization and/or no circular polarization (Nimmo et al. 2021). However, as more apparent nonrepeating FRBs were discovered, examples in this class also shared some of these properties (see Petroff et al. 2022; Zhang et al. 2023 for a more detailed history). Recently, based on a sample of 18 repeating and 474 nonrepeating CHIME FRBs, it was proposed that the populations may be distinct in the duration-bandwidth phase space. Specifically, repeating FRBs exhibit longer intrinsic durations (after de-dispersion) and narrower bandwidths ( $\sim$ 100–200 MHz) while apparent nonrepeaters have shorter durations and wider bandwidths (e.g., Figure 5 of Pleunis et al. 2021). Pleunis et al. (2021) suggested this could be due to a propagation effect, a result of beaming (Connor et al. 2020), different types of bursts from the same source, or factors intrinsic to the populations. The CHIME/FRB Collaboration et al. (2023) again performed a similar analysis with a larger sample of 25 repeaters and found a distinction in DM between the two populations (although they additionally found the burst rates between repeaters and nonrepeaters are not distinctly bimodal, implying a portion of the nonrepeaters may be eventually observed to repeat.) Thus, it is still unclear if the observed distinctions between repeaters and nonrepeaters are intrinsic to the objects themselves or not.

<sup>31</sup> <https://www.wis-tns.org/>

Now we have leveraged new surveys that have enabled a consistent stream of well-localized events (both repeating and nonrepeating) and thus robust host associations. From our sample of 23 FRB host galaxies, we find that repeaters and nonrepeaters share largely similar distributions of stellar population properties (e.g., mass-weighted age, stellar mass, stellar metallicity, SFH, and ongoing SF), with no statistically significant differences.

To test the statistical power of our sample, we simulate larger samples of FRBs with one major assumption that the current posterior distributions for repeaters and nonrepeaters are representative of the true distributions. We double and triple the current sample while maintaining the same ratio of repeaters to nonrepeaters (i.e., 12 repeaters and 34 nonrepeaters for the doubled sample). For each stellar population property, we draw random samples from the total posterior distributions of the nonrepeating and repeating FRBs. We then perform an A-D test in which the null hypothesis is that the classes are from the same parent distribution in that stellar population property. A  $p$ -value of 0.05 indicates the null hypothesis can be rejected. We then repeat this process 5000 times to obtain a distribution of A-D test results. We choose 5000 tests because this is the point at which the percentage of statistically significant results are not dependent on the number of tests run. We find that with twice (three times) the current sample size, the null hypothesis is rejected for 84% (96%) of the tests in stellar mass, demonstrating that increasing the sample sizes by a modest amount produces statistically distinct distributions in this property. Indeed, even an increase in the sample size by 50% results in a majority of A-D tests with  $p < 0.05$ . Performing this same exercise for all other properties, we find that SFR and stellar metallicity could greatly benefit from sample sizes two and three times the current sample, respectively. Meanwhile, all other properties have distributions in which the repeating and nonrepeating hosts remain statistically indistinguishable. We caution that these projections assume that the current posterior distributions of repeaters and nonrepeaters are representative of the true parent distributions. Ultimately, continued follow-up and stellar population modeling of new, robustly associated FRB host galaxies will be required to uncover the true population statistics.

While our current sample is not large enough to reveal statistically significant distinctions (if they do exist), it still shows a few noteworthy distinctions. For example, the repeating FRB host population as a whole tends to exist in hosts with lower stellar masses than those of nonrepeating FRBs. Similarly, only nonrepeating FRBs have been found in galaxies with optical luminosities  $\nu L_\nu \gtrsim 10^{10} L_\odot$ . Additionally, two of the FRBs in the environments with the least star formation activity are apparent nonrepeaters (FRBs 20210410D and 20210807D). Finally, the majority of galaxies with clear and prolonged rises in their SFHs host repeating FRBs (FRBs 20121102A, 20180301A, 20190711A, and 20201124A), indicating a heightened level of recent SF activity. While expected for low-mass galaxies like the hosts of FRBs 20121102A and 20190711A (Papovich et al. 2011; Leitner 2012), this is particularly surprising for more-massive galaxies like the hosts of FRBs 20201124A and possibly 20180301A. It is plausible that such distinctions in SFH could be enhanced in the context of a larger sample. Overall, with a sample of six repeaters and 17 nonrepeaters, our findings are consistent with two possibilities: the progenitor is the same for

both populations, or they have distinct progenitors but do not strongly select on any single galaxy property given the still small number of FRB hosts.

Finally, among the highly secure FRB host sample, we do not find significant differences in the redshift distribution of repeating and nonrepeating FRBs. However, when including bursts detected after our date cutoff or with less secure host associations, there are three nonrepeating FRB host galaxies identified at  $z \gtrsim 0.6$  while no repeating FRB hosts in this regime are known. Actual interpretation is muddled by selection biases based on different discovery experiments with varied observational biases and inconsistent criteria for host galaxy follow-up. However, one might expect that repeating FRBs are easier to identify at low- $z$ , as several bursts (presumably some with lower luminosities) must be detected, and we cannot rule out that apparent nonrepeaters also have repeat bursts at lower fluences than the detected burst. Moreover, it might be more difficult to discover FRBs in star-forming environments, which could potentially harbor foreground columns of ionized gas associated with the host galaxy. The increased dispersion contributions result in larger detected pulse widths, which would result in a reduced sensitivity to repeating bursts. If these excess columns contain turbulent gas (as would be expected), scatter-broadening of the emission would also reduce search sensitivity to repeating FRBs.

With the advantage of a large sample of uniformly modeled hosts, we briefly investigate if repeating FRBs with unique burst properties correlate to unique host properties. FRB 20121102A has a PRS (Chatterjee et al. 2017; Marcote et al. 2017), large and variable RM (Michilli et al. 2018), high burst rate (Li et al. 2021), and a potential 160 day activity period (Rajwade et al. 2020). Additionally, its RM is decreasing whereas its DM is increasing (Hilmarsson et al. 2021). FRB 20190520B is the second known host to feature a PRS (Niu et al. 2022) and has a high and rapidly varying RM (Anna-Thomas et al. 2023). Both hosts are notable for having lower stellar masses, optical luminosities, and gas-phase metallicities than the bulk of the population; FRB 20121102A also has a rise in SFH within the last  $\sim 0.1$  Gyr. As a counter-example, Bhandari et al. (2022a) recently found the nonrepeating FRB 20210117A to be in a dwarf galaxy, and indeed this is one of the lowest-mass galaxies in our sample. However, this burst lacks a PRS, and its environment was not found to be highly magnetized. There may be evidence for the sad-trombone effect commonly associated with repeaters, but it was not detected as strongly as in confirmed repeaters. The repeating FRB 20180916B has a quasiperiodic  $\approx 5$  day activity window every 16.4 days (CHIME/FRB Collaboration et al. 2020b), and resides in an old ( $\sim 8$  Gyr) transitioning host with a lesser degree of star formation than most repeaters. However, as discussed above, it is possible the merger had some effect on local star formation at the site of the FRB despite its overall low global SFR and declining SFH. Finally, the highly active repeating FRB 20201124A undergoes sudden high activity rates (Lanman et al. 2022), showing 1863 bursts in 82 hr over 54 days, dramatic RM variations, circular polarization (Kumar et al. 2022; Xu et al. 2022), and has the widest mean burst width of any repeater (Marthi et al. 2022). It also has a rising SFH, but is otherwise unremarkable in terms of its galaxy properties.

At face value, there is no strong connection between outliers in FRB burst properties and outliers in host properties. Furthermore, FRB hosts that are outliers in their stellar population properties, such as FRBs 20210807D and 20211127I in regard to age and SFR, respectively, are unremarkable in their burst properties (R. Shannon 2023, in preparation). The detailed interpretation of the connection between FRB burst properties and host properties may be a fruitful path toward constraining progenitor models.

### 6.3. Comparison of Stellar Population Properties

To fully contextualize the stellar population properties we derive in this work, it is important to compare to previous studies of FRB host galaxies, as this can inform if there are any systematic biases in stellar population modeling and methodologies. While stellar population properties in some form exist for 16 of the hosts in our sample of 23 (e.g., Tendulkar et al. 2017; Bannister et al. 2019; Prochaska et al. 2019; Heintz et al. 2020; Marcote et al. 2020; Fong et al. 2021; Bhandari et al. 2022a; Ravi et al. 2022; Bhandari et al. 2022b; Niu et al. 2022), our study presents uniform modeling, assumes nonparametric SFHs (an assumption that can percolate to systematic offsets in other stellar population properties; e.g., Leja et al. 2019b), and derives full posterior distributions in each property allowing for a realistic estimate of uncertainties, which we make use of in our population distributions. In addition, while previous papers generally derived SFR and metallicity from nebular emission lines, we use the full SED.

For the 14 hosts that were also modeled in these previous compilations, we compare their stellar population properties. For SFR, while those derived from  $\text{H}\alpha$  and the SED may track different timescales, we do not find that there are any systematic differences. We derive slightly larger stellar masses by  $\sim 0.1$ – $0.5$  dex (an expected byproduct of nonparametric versus parametric SFHs; Leja et al. 2019b). We also find systematically older mass-weighted ages than Heintz et al. (2020) by a factor of  $\approx 5$  (previously ranging from 0.06–1.6 Gyr, versus 2.47–8.36 Gyr here). This is not surprising, as nonparametric SFH modeling is known to result in older ages than the parametric SFH assumption (Leja et al. 2019b) as the flexible SFH gives galaxies more time to form mass. Since the nonparametric SFH is a more physically realistic assumption than parametric SFHs (the method employed by the majority of the literature), our ages can be considered more representative of the average age of a star in the galaxy. Furthermore, the placement of the FRB hosts in relation to field galaxies in Figure 7 shows that the ages we derive for the FRB hosts are consistent with the field galaxy population given the hosts' sSFRs. In fact, if the hosts have younger ages by 1 order of magnitude, as found in previous studies, they would occupy a phase space not probed by any galaxies in the COSMOS sample. As FRB hosts appear to track typical galaxies in the Universe in their stellar population properties, significantly younger ages than these galaxies would be highly unusual.

Finally, we emphasize the importance of a direct comparison field galaxy sample for an unambiguous interpretation of results. As discussed in Section 6.1, our finding that most FRB hosts trace the main sequence of star-forming galaxies (as opposed to offset from it) is primarily due to the background field galaxy catalog used. As each SED modeling code uses different frameworks and libraries for modeling the stellar populations, which introduces their own systematic

uncertainties, one must somehow account for the systematic uncertainties in the codes' assumptions, which is difficult to quantify. Instead, our work demonstrates the importance of modeling hosts in the same manner as the field galaxy population to perform direct comparisons.

## 7. Conclusions and Future Prospects

We have presented the largest collection of highly secure, uniformly modeled FRB host galaxies to date, totaling 23 hosts. We inferred the stellar population properties and SFHs of the hosts of six repeaters and 17 nonrepeaters using the `Prospector` stellar population synthesis code with nonparametric SFHs. Our major conclusions are as follows:

1. FRB hosts have a range of stellar masses of  $10^{8.1}\text{--}10^{11.0} M_{\odot}$  with a median of  $\approx 10^{9.9} M_{\odot}$ . Their mass-weighted ages range from 2.5–8.4 Gyr with a median of  $\approx 5.1$  Gyr. We find SFRs (integrated over the last 100 Myr) ranging from  $0.02\text{--}35.8 M_{\odot} \text{ yr}^{-1}$  with a median of  $\approx 1.3 M_{\odot} \text{ yr}^{-1}$ .
2. We find that of the 23 hosts, 87% (20/23) are actively star-forming. Two hosts (FRB 20180916B and FRB 20210410D) are transitioning from star-forming to quiescent, and another (FRB 20210807D) is quiescent.
3. Compared to similarly modeled field galaxies in the COSMOS sample at comparable redshifts, star-forming hosts trace the SFMS, demonstrating that they form stars at similar rates compared to field galaxies of the same stellar mass. The one notable exception is FRB 20211127I, which lies well above the SFMS.
4. We find no statistically significant differences in the stellar population properties of repeating and nonrepeating host galaxies. However, the hosts of repeaters tend to extend to lower stellar masses, and the hosts of nonrepeaters tend to be more optically luminous. Moreover, the two hosts with the lowest degrees of star formation are both nonrepeaters.
5. FRBs show a diverse range of SFHs. We classify the SFHs into five categories: rising, delayed- $\tau$  exponentially declining,  $\tau$ -linear exponentially declining, post-starburst, and rejuvenating. The majority peak in star formation in the final gigayear. Repeaters tend to show a clear and prolonged rise in star formation over time indicating a heightened level of more recent activity (although there are also repeaters with delayed- $\tau$  and falling SFHs and one nonrepeater with a rising SFH).
6. FRB hosts are not distinct from the SFH moments (e.g., sSFR and mass-weighted age) of field galaxies in the COSMOS sample. FRB hosts trace the main loci of these phase spaces across redshift evolution.
7. The large percentage of actively star-forming FRB host galaxies, coupled with recent star formation activity, support the young magnetar progenitor model in which the progenitors formed through core-collapse supernovae. However, the presence of transitioning and/or quiescent hosts implies at least a small fraction could originate in more delayed channels.

Our work takes advantage of state-of-the-art galaxy modeling techniques that utilize the full power of photometry and spectroscopy to model the parent stellar populations that host FRBs. While we have outlined several implications for their progenitors, the derived SFHs can be further leveraged to

construct probabilistic progenitor rates assuming different delay-time distributions. In addition, a full comparison of FRB host SFHs to field galaxy archetypes could further inform if there is anything unusual in their past star formation activity.

Thanks to concerted advancements in radio searches and instrumentation, the era of multiple (sub)arcsecond host localizations per day is fast approaching, and the number of known FRB host galaxies will rapidly increase. Moreover, increases in sensitivity will push the FRB detection horizon to higher redshifts of  $z \gtrsim 1$  (e.g., Ryder et al. 2022). Our analysis can soon be extended to hundreds of well-localized FRB host galaxies, which will be crucial for understanding whether subtle differences between the hosts of repeating and nonrepeating FRBs are robust, and hence indicative of distinct populations, or a result of small number statistics. Furthermore, the first large-scale studies of FRB properties and rates as a function of redshift, as well as the FRB delay-time distributions with respect to cosmic star formation, will provide additional constraints on their progenitors and usage as cosmic probes. Spectroscopic redshifts and photometric coverage of FRB hosts to  $z \sim 1$  and beyond are the only way to probe their progenitor systems in the cosmic era of peak star formation and uniformly short delay times. In parallel, high-quality stellar population parameter modeling of these galaxies will remain key to understanding the global environments of these events and placing unique constraints on progenitor models.

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Based on observations obtained as part of the VISTA Hemisphere Survey, ESO Program, 179.A-2010 (PI: McMahon)

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*Facilities:* Blanco (DECam), CTIO:2MASS, Gemini:Gillett (GMOS), Gemini:South (GMOS), HST (WFC3), Keck:I (LRIS), Keck:II (DEIMOS), MMT (MMIRS, Binospec), NOT (ALFOSC), PS1, Sloan (SDSS), SOAR (Goodman), Spitzer (IRAC), Subaru (MOIRCS), ESO:VISTA (VIRCAM), VLT:Antu (FORS2), VLT:Yepun (HAWK-I), WISE.

*Software:* astropy (Astropy Collaboration et al. 2022), DoPhot (Schechter et al. 1993), dynesty (Speagle 2020), FRBs/FRB (Prochaska et al. 2023), linetools (Prochaska et al. 2017), matplotlib (Hunter 2007), numpy (Harris et al. 2020), pandas (Reback et al. 2022), photpipe (Rest et al. 2005), photutils (Bradley et al. 2021), POTPyRI (<http://github.com/CIERA-Transients/POTPyRI>), Prospector (<http://ui.adsabs.harvard.edu/abs/2022zndo...6192136J/abstract>; Johnson et al. 2021), PypeIt (Prochaska et al. 2020a, 2020b), python-fsps (Conroy et al. 2009; Conroy & Gunn 2010), SAOImageDS9 (Joye & Mandel 2003), scipy (Virtanen et al. 2020), sedpy (Johnson 2021), SWarp (Bertin et al. 2002).

## Appendix A Prospector Modeling Details

Here we present additional details on our Prospector modeling. For hosts with photometric coverage  $\geq 2 \mu\text{m}$  in the rest frame (i.e., WISE or *Spitzer* coverage), we include additional parameters on IR dust emission and/or the presence of an AGN. To model IR dust emission, we use the three-component Draine & Li (2007) dust emission model included in FSFS. As the WISE and *Spitzer* data available for these hosts do not extend into the far-IR, we choose to only set `dust_e_qpah`, the polycyclic aromatic hydrocarbon mass fraction, as a free parameter and not include the other two components. This choice balances the dimensionality of the model with the available data, ensuring the model is not underconstrained by our data set. For the AGN prior, we use the two-component AGN model from Nenkova et al. (2008) with both components set free. We alternate turning the dust emission and AGN models on and off in various linear combinations with the other parameters in order to determine which model fits the data best. The final model is then chosen through a combination of visual inspection of the agreement between the model and data and the evidence value of the model, a statistical measure of the “goodness” of the fit.

For the fitting of nebular emission lines, Prospector’s nebular marginalization template fits a Gaussian to each emission line. The Gaussians have the same widths in velocity-space. As the marginalization procedure is purely mathematical (see Appendix E of Johnson et al. 2021 for further details), there are no physics in place to prevent the prediction of negative emission lines; this more likely to happen for spectra with low S/N. In order to determine when to include this template in the final model, we use a combination of visual inspection of the model spectrum and the convergence of the `eline_sigma` parameter (which describes the emission line widths). Fourteen FRB hosts had spectra with high enough S/Ns to include nebular marginalization in the final model. For the remaining eight hosts with usable spectra, we instead use the `nebemlineinspec` prior, which adds the emission lines to the model spectrum following a pre-built CLOUDY grid (Byler et al. 2017).

In this work, we use a nonparametric SFH, characterized by the continuity prior in Prospector. This prior prefers a flat SFH: in other words, any observed deviation from a constant SFH is driven by the data. By definition, a nonparametric SFH does not impose an a priori functional form onto the galaxy’s SFH. Instead, the galaxy is allowed to form mass as it sees fit within each age bin, leading to a data-

driven SFH that is more physically realistic than parametric models.

As we use eight age bins in this work, the continuity prior outputs seven parameters describing the logarithm of the ratio of the star formation rates between adjacent age bins. To convert this to star formation rates in each age bin, we use the convenience function `logsfr_ratios_to_sfirs` in the `prospect.models.transforms` module of `Prospector` (see footnote 33). We then construct the SFH from these values. We calculate mass-weighted age by summing the product of the SFR for each age bin and the square of the length of the age bin, then dividing by the mass formed. This value is calculated for each model iteration, weighted by their likelihood weights. We then construct a distribution of these values and report the median, and 16th and 84th quantiles. Additionally, we report the 100 Myr integrated star formation rate ( $\log(SFR_{0-100\text{ Myr}})$ )—the average of the two most recent age bins, spanning 0–30 Myr and 30–100 Myr, weighted by the

width of the age bin. This calculation is done using 1000 representative samples of the model, weighted by their likelihood weights. This metric describes the current-day star formation rate and is sensitive to both the older (30–100 Myr) and younger (0–30 Myr) recently formed stars.

To calculate the stellar mass formed, we retrieve the mass fraction by calling `model.predict` for a random sample of 1000 model iterations. We multiply by the total mass formed for the associated model iteration. The resulting 1000 values are thus a representative distribution of stellar masses, from which we report the median and 68% confidence intervals.

## Appendix B SEDs

Here we present the SEDs of all hosts modeled in this work in Figures 10–32. See Section 4 for more details on the `Prospector` modeling.

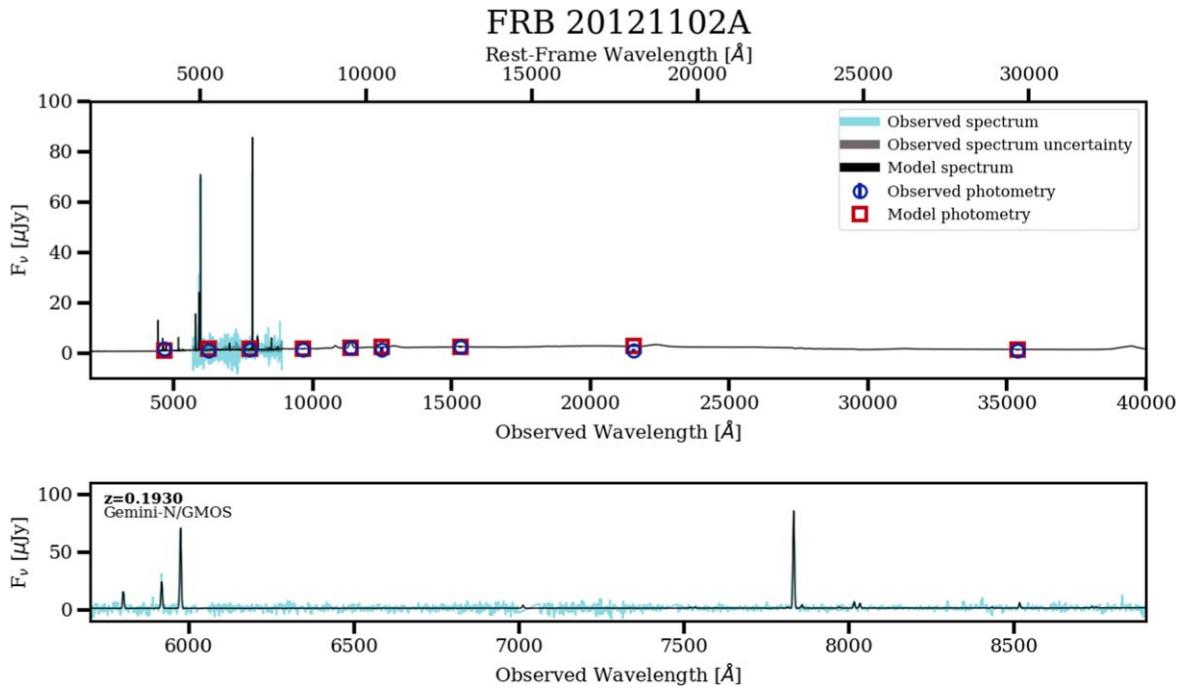
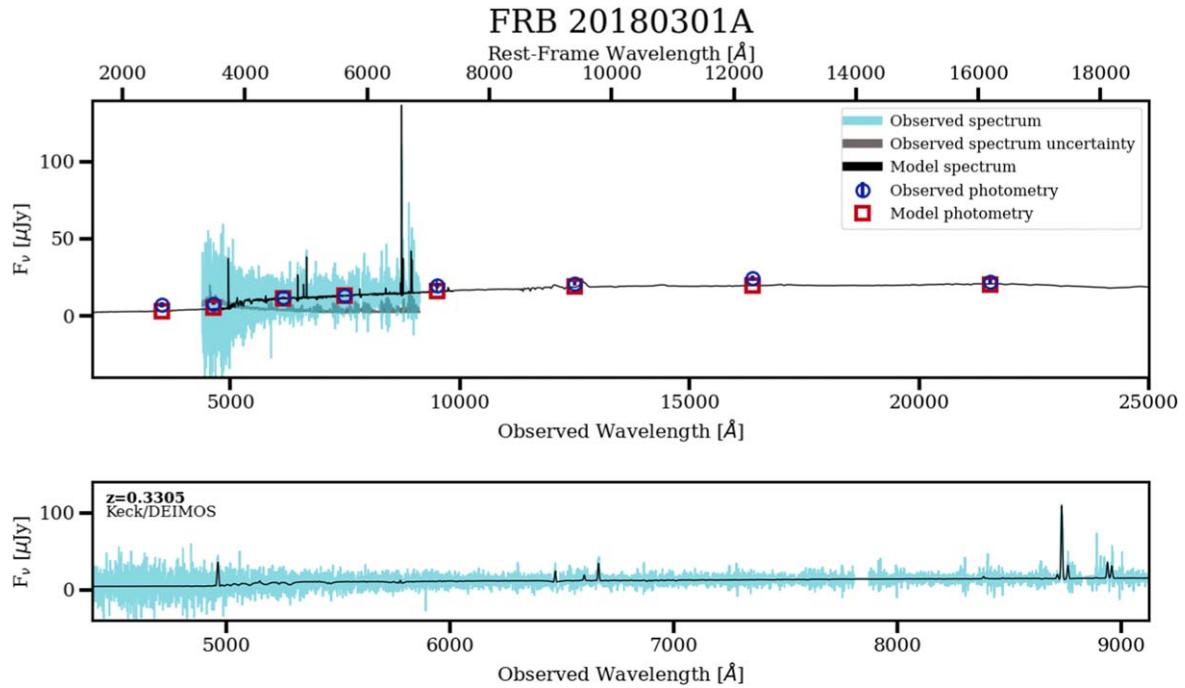
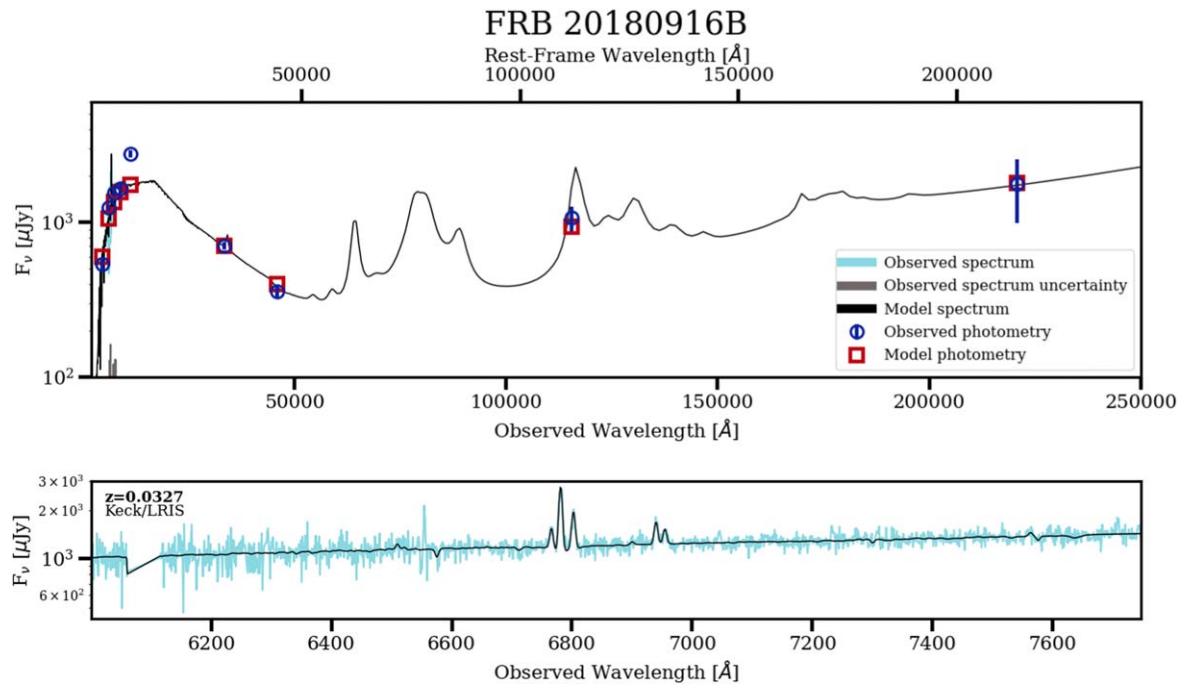


Figure 10. SED of FRB 20121102A.

**Figure 11.** SED of FRB 20180301A.**Figure 12.** SED of FRB 20180916B.

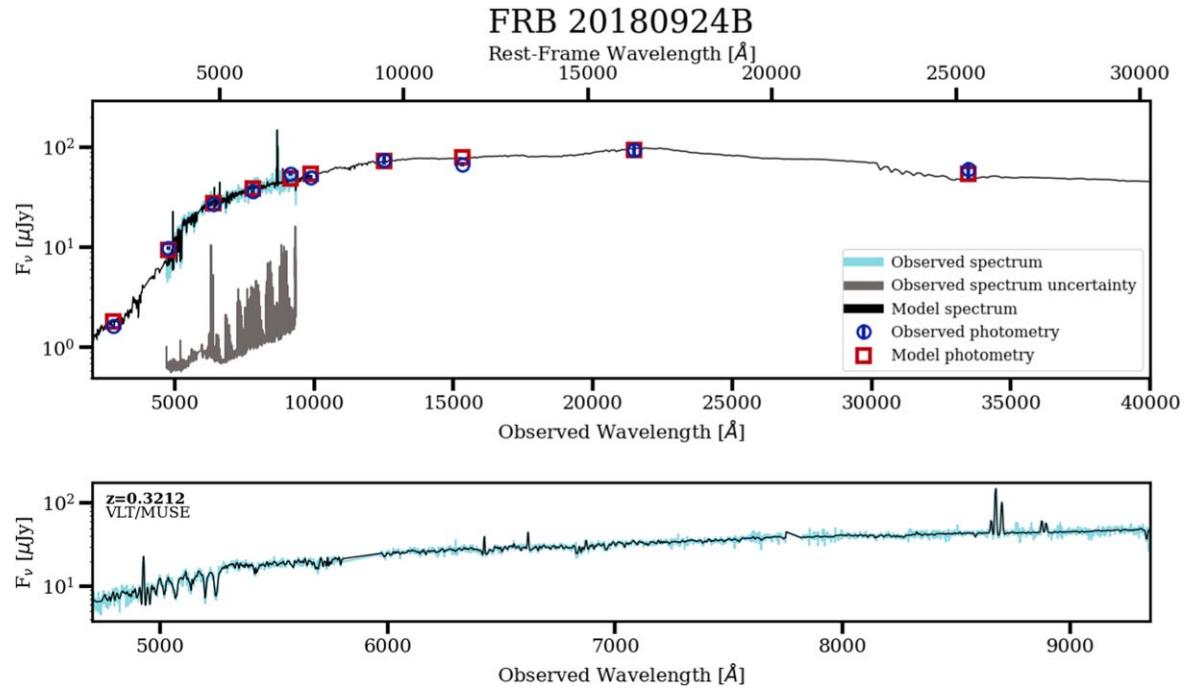


Figure 13. SED of FRB 20180924B.

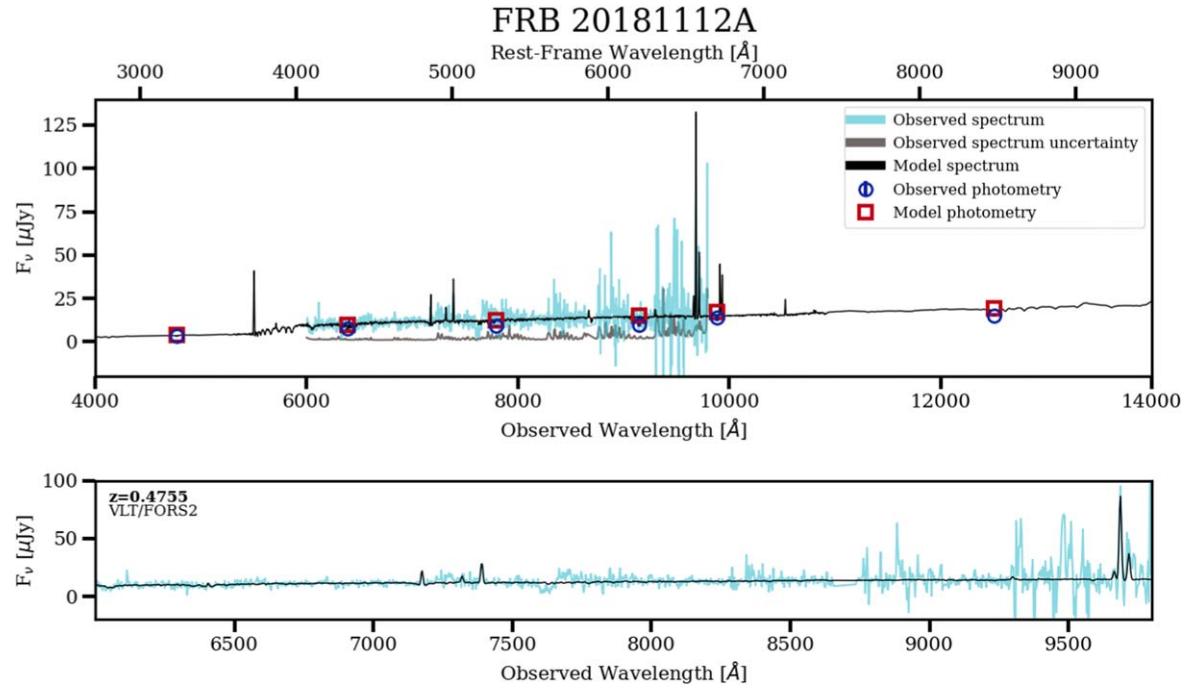


Figure 14. SED of FRB 20181112A.

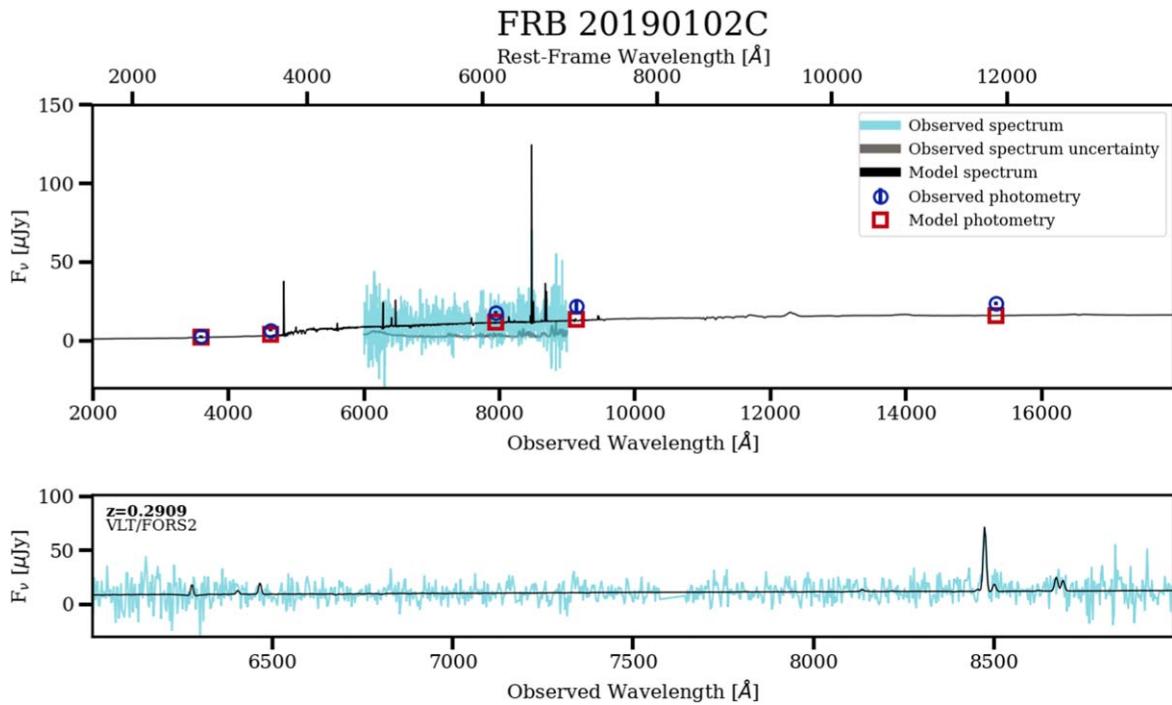


Figure 15. SED of FRB 20190102C.

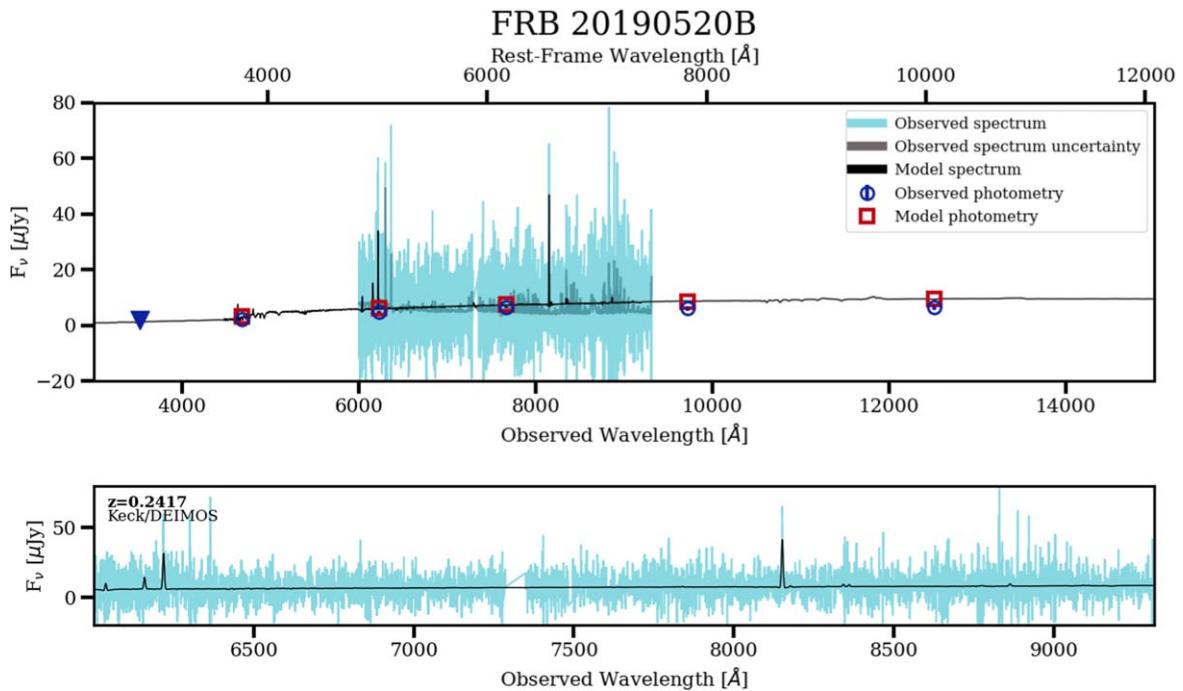
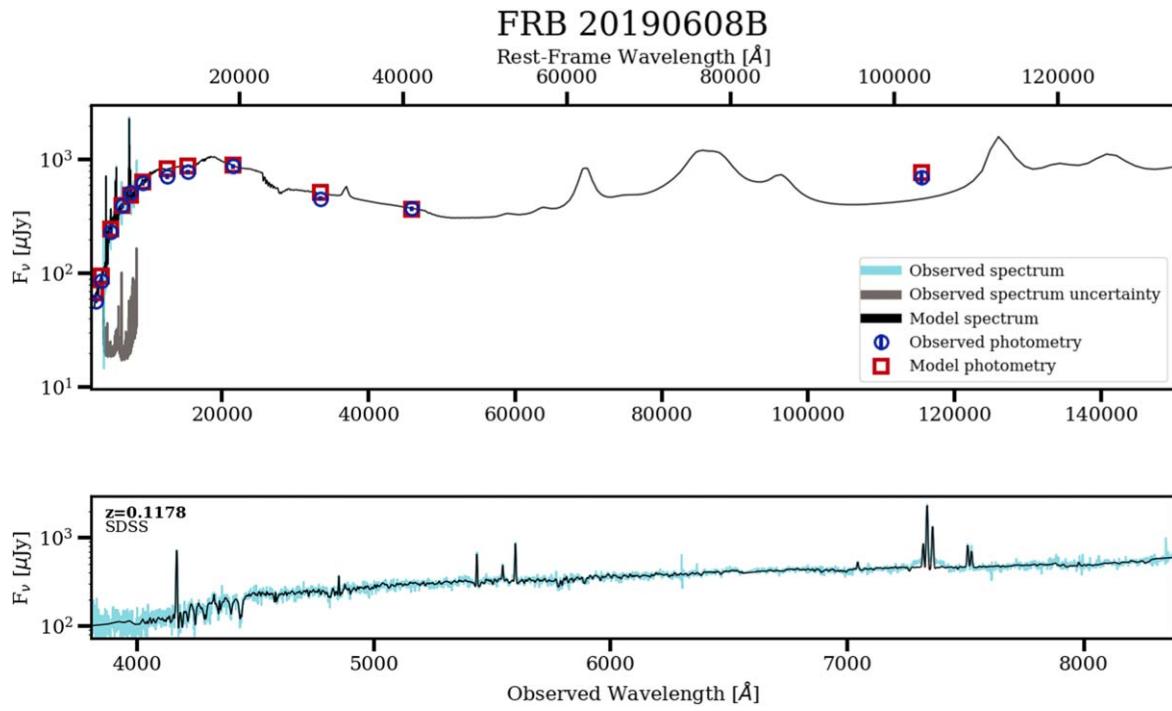
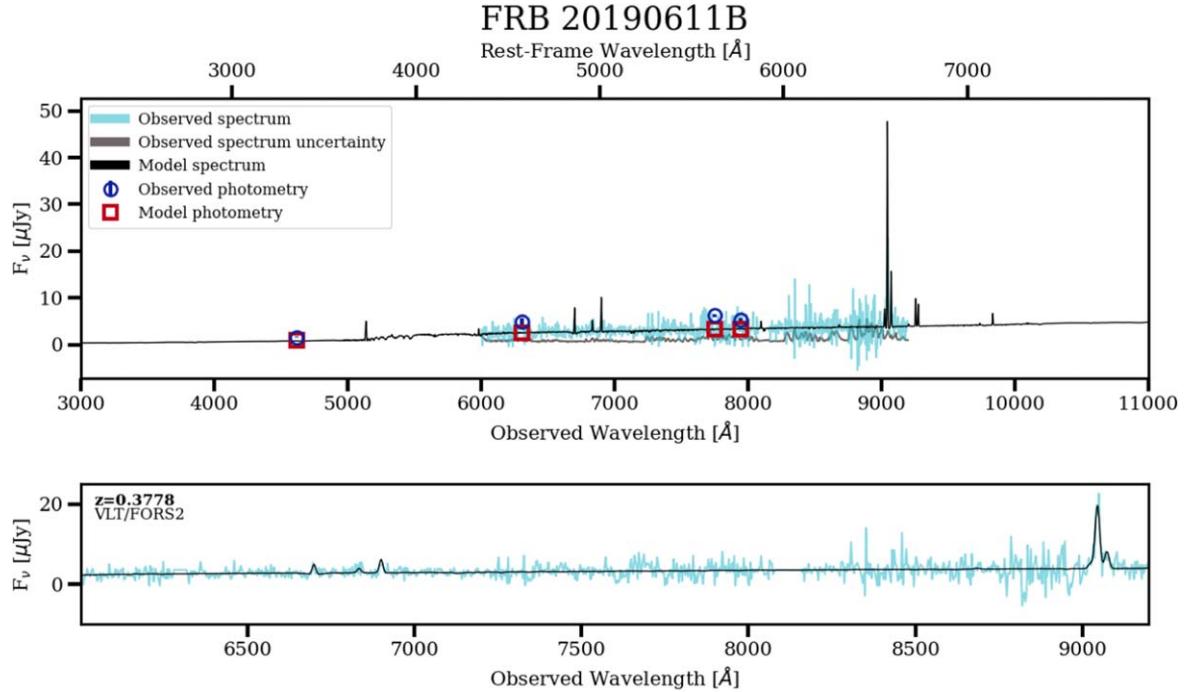


Figure 16. SED of FRB 20190520B.

**Figure 17.** SED of FRB 20190608B.**Figure 18.** SED of FRB 20190611B.

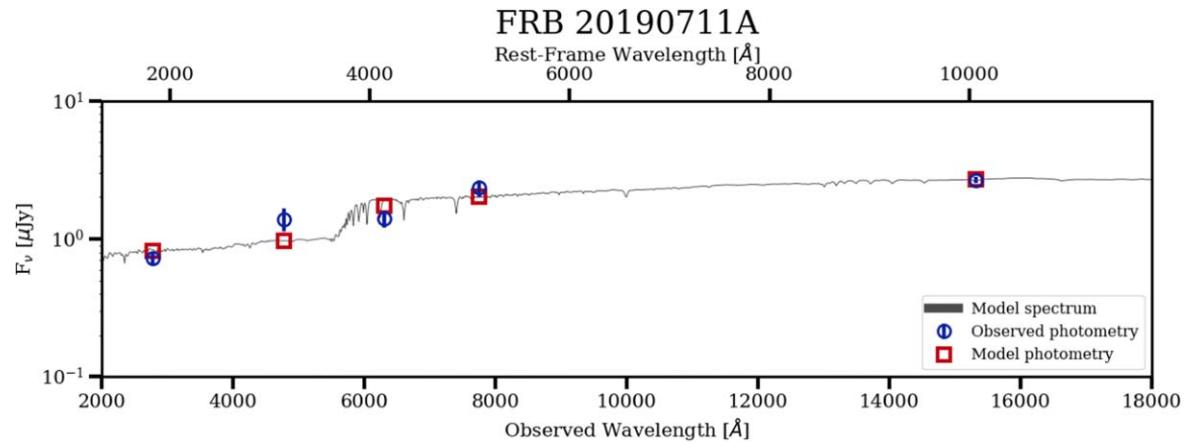


Figure 19. SED of FRB 20190711A.

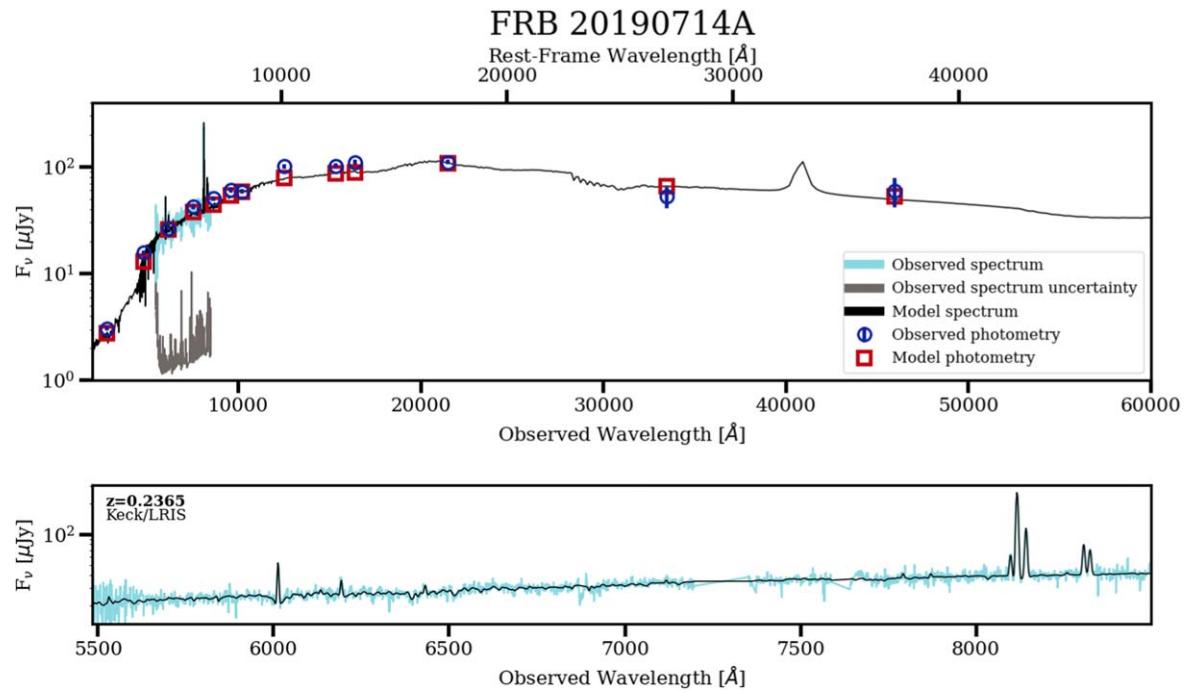
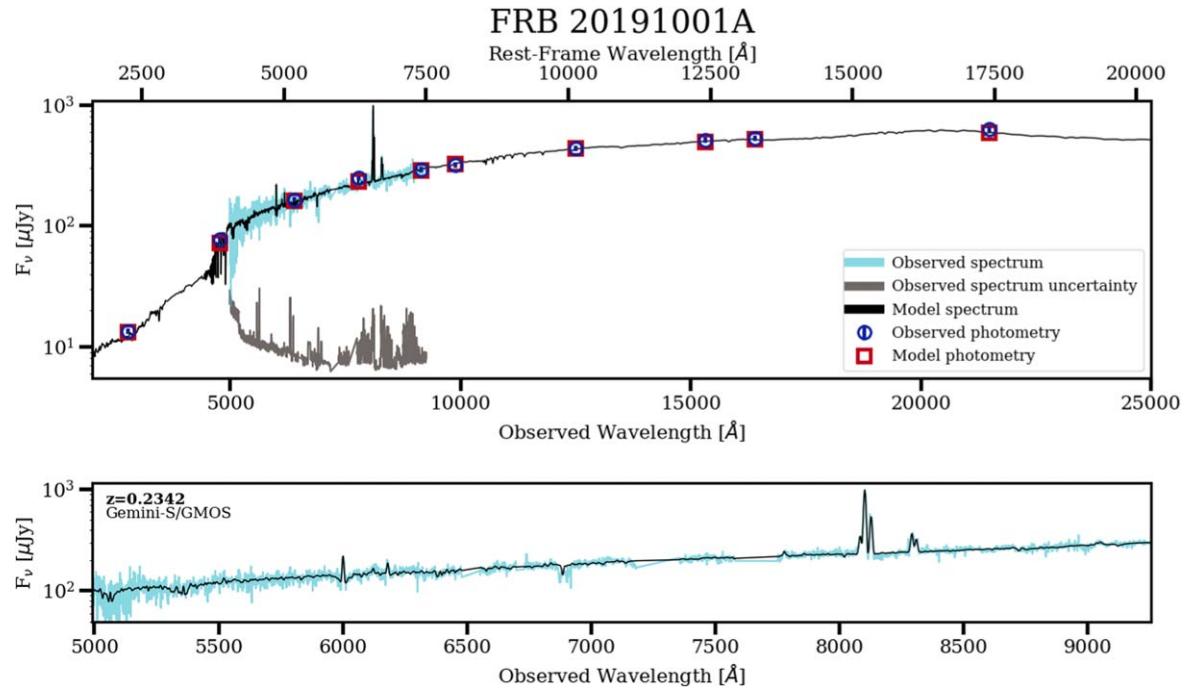
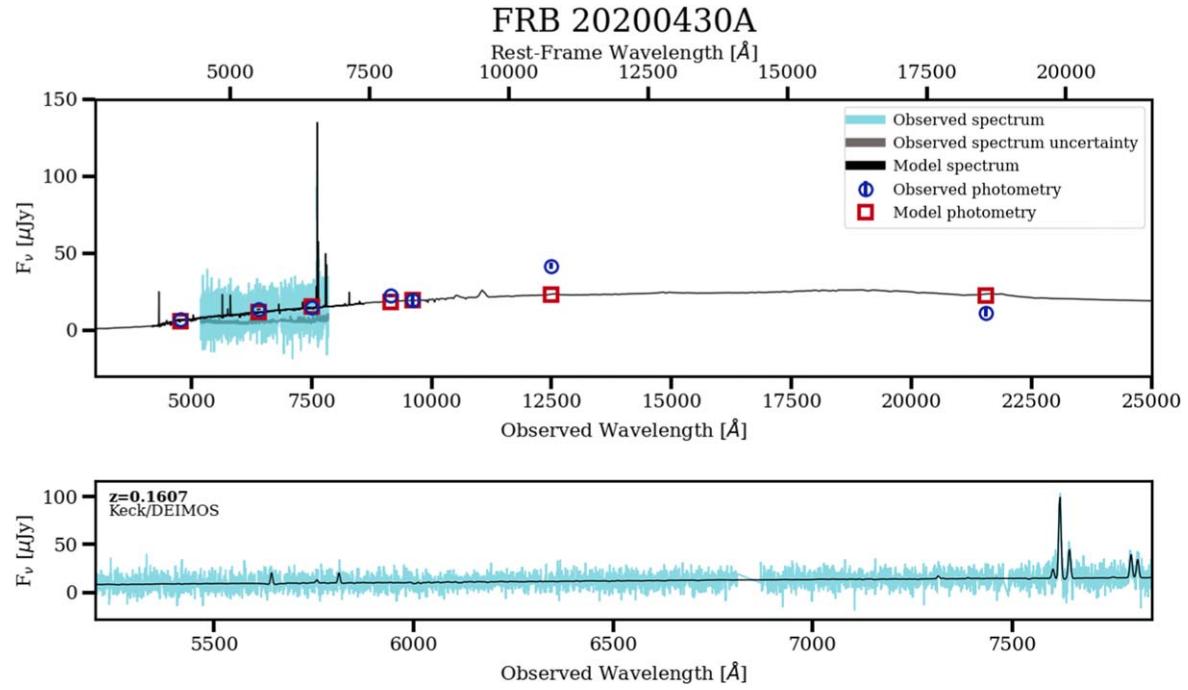
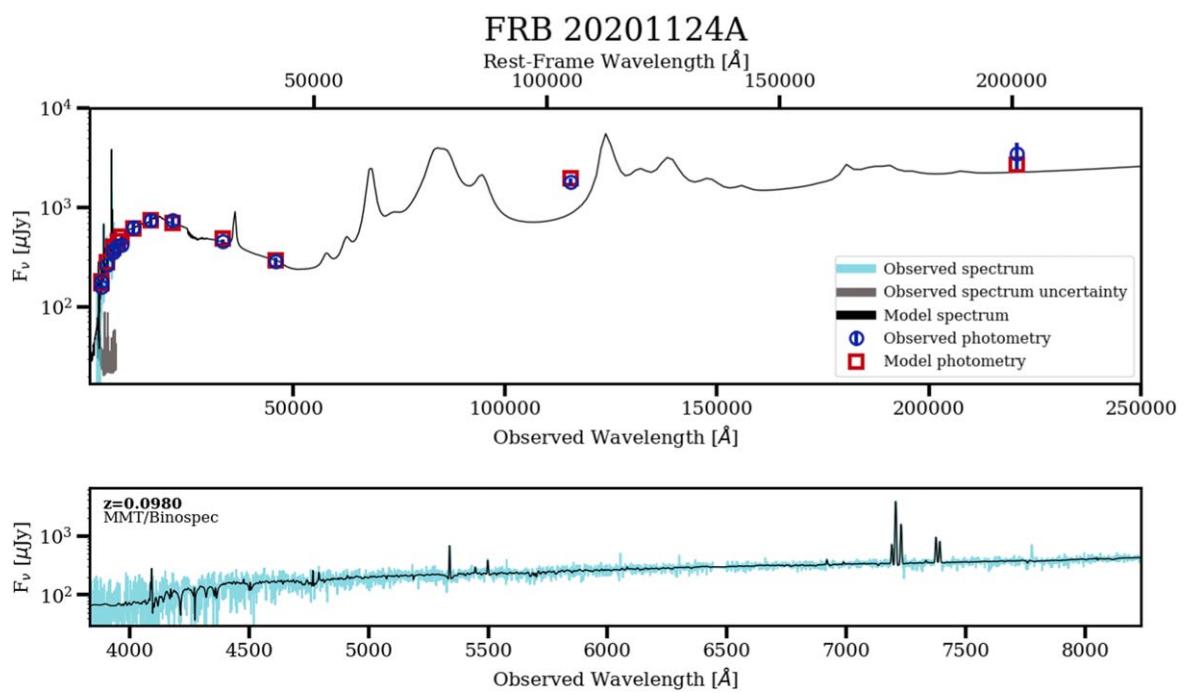
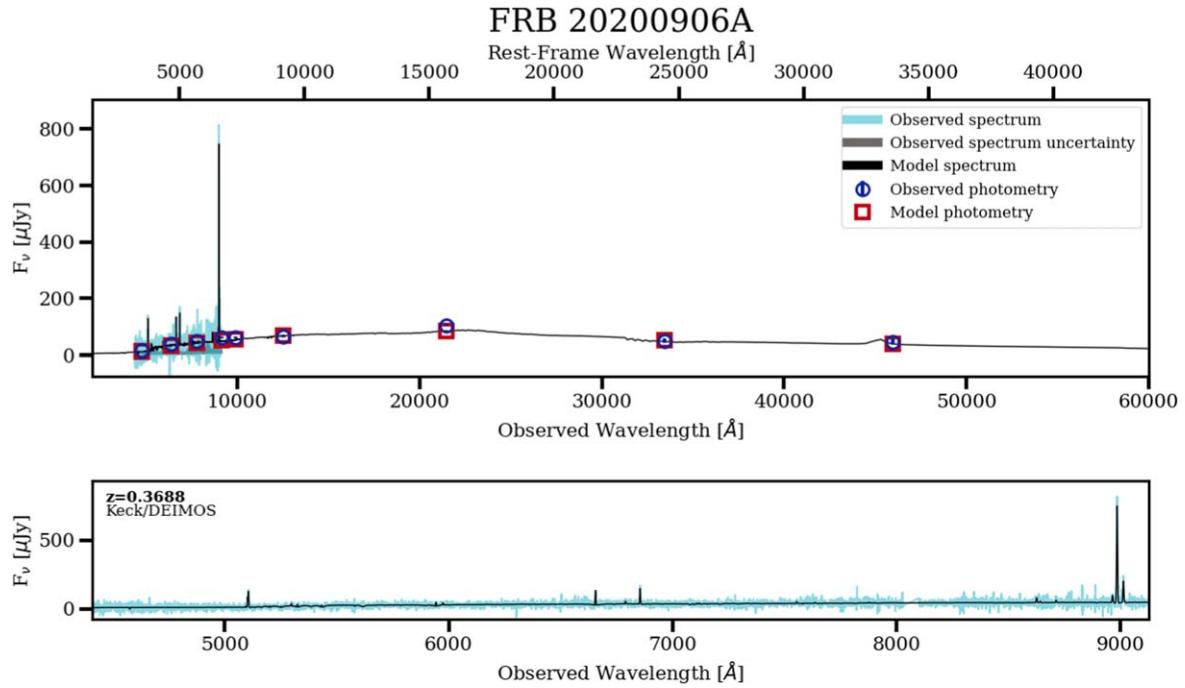


Figure 20. SED of FRB 20190714A.

**Figure 21.** SED of FRB 20191001A.**Figure 22.** SED of FRB 20200430A.



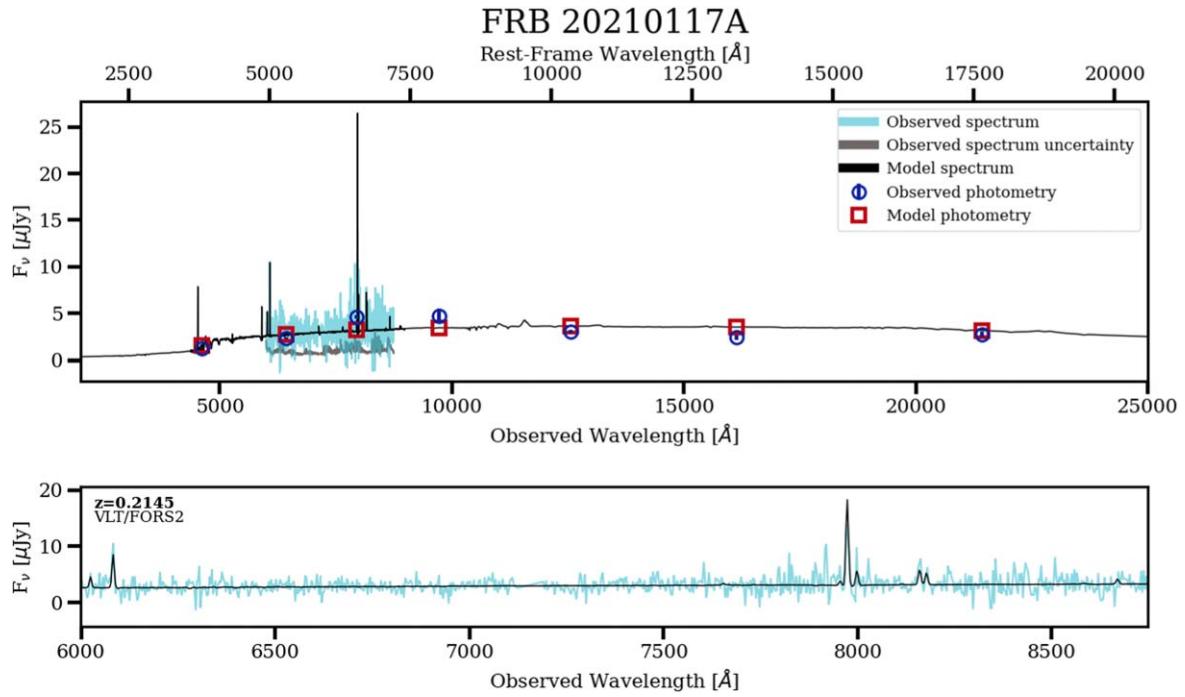


Figure 25. SED of FRB 20210117A.

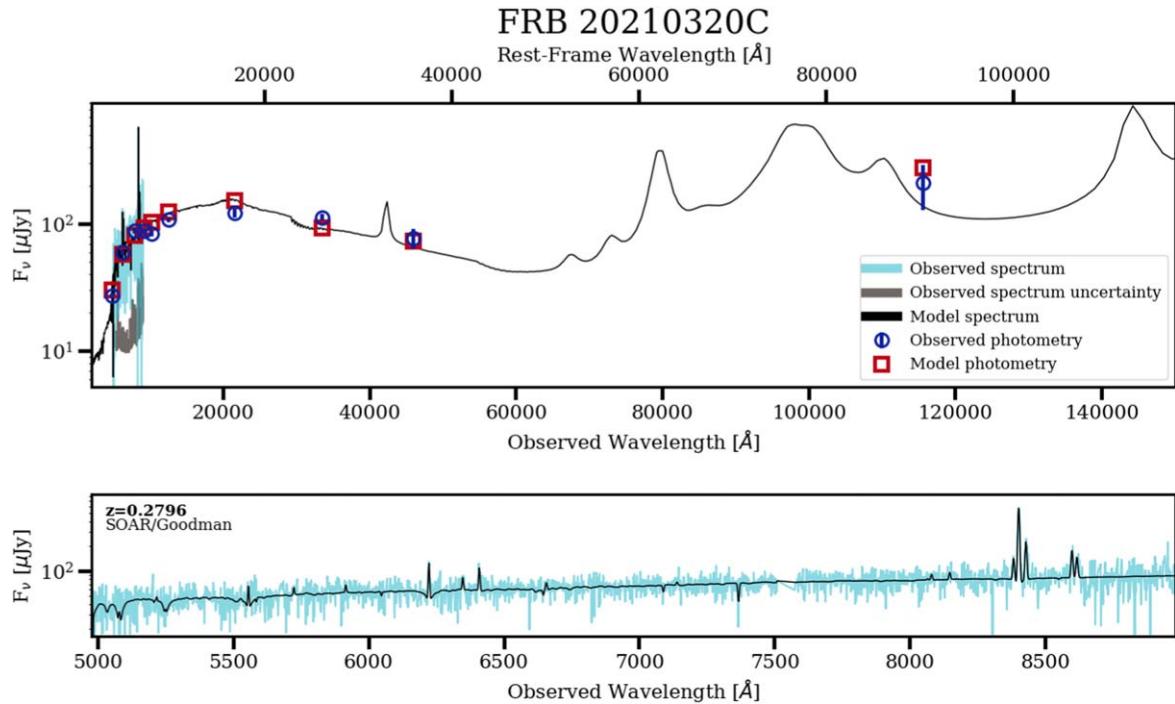


Figure 26. SED of FRB 20210320C.

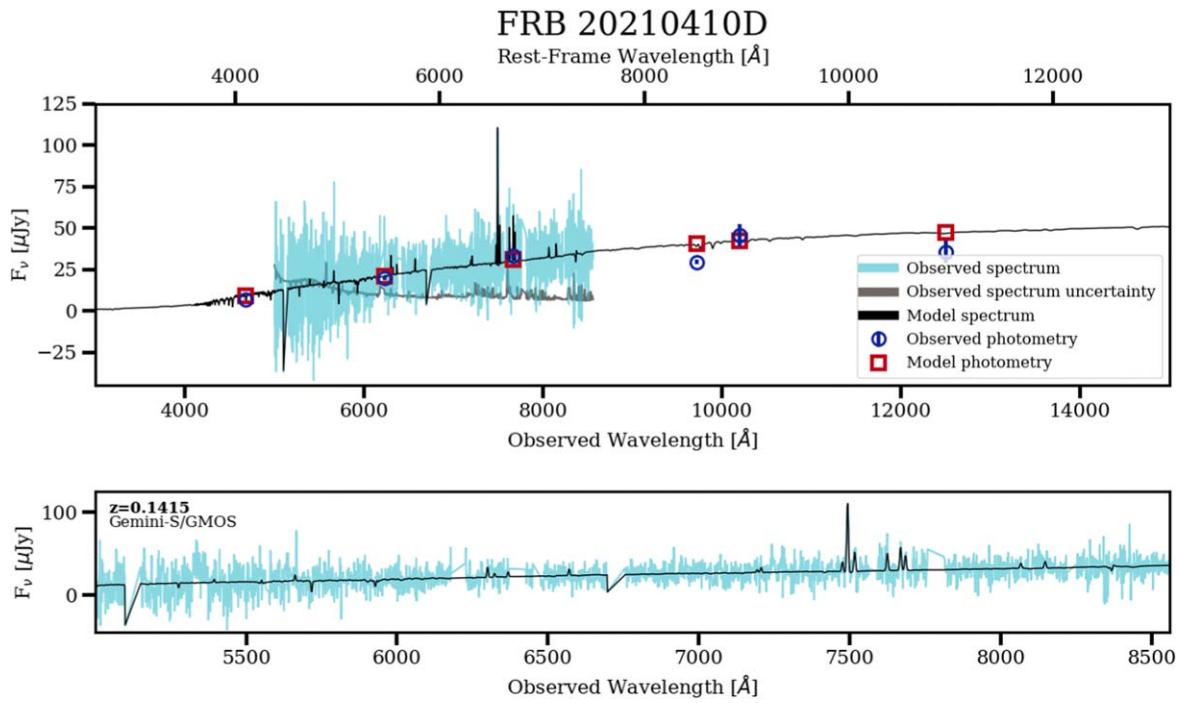


Figure 27. SED of FRB 20210410D.

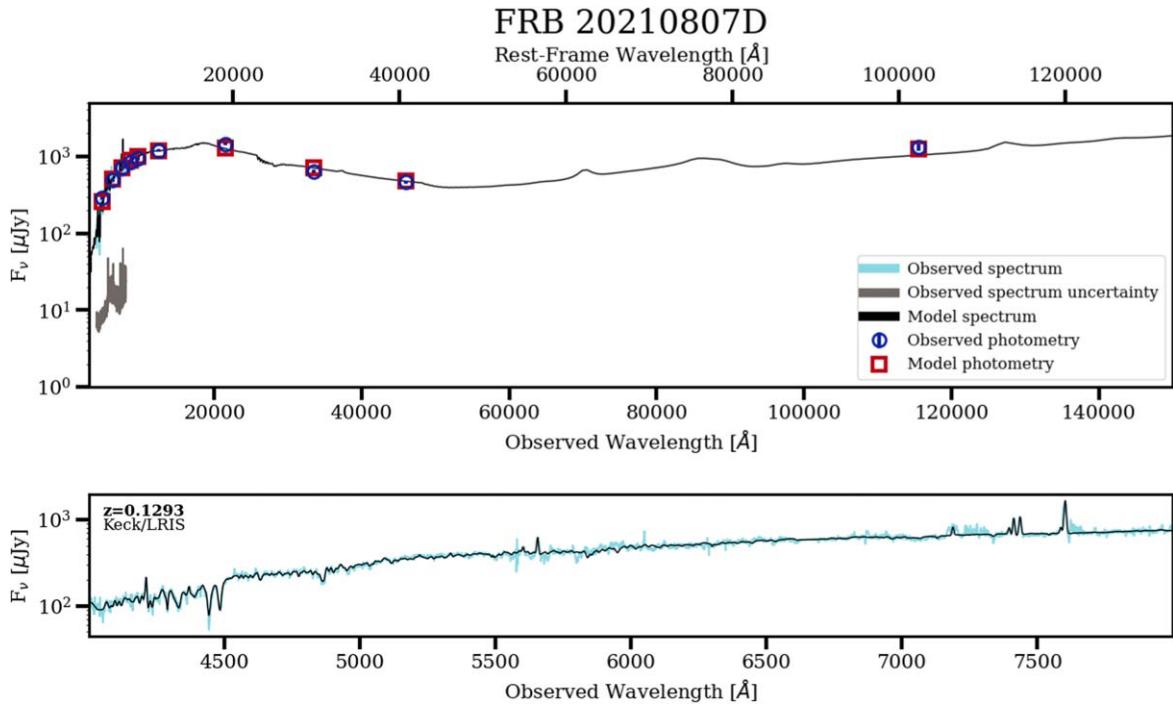
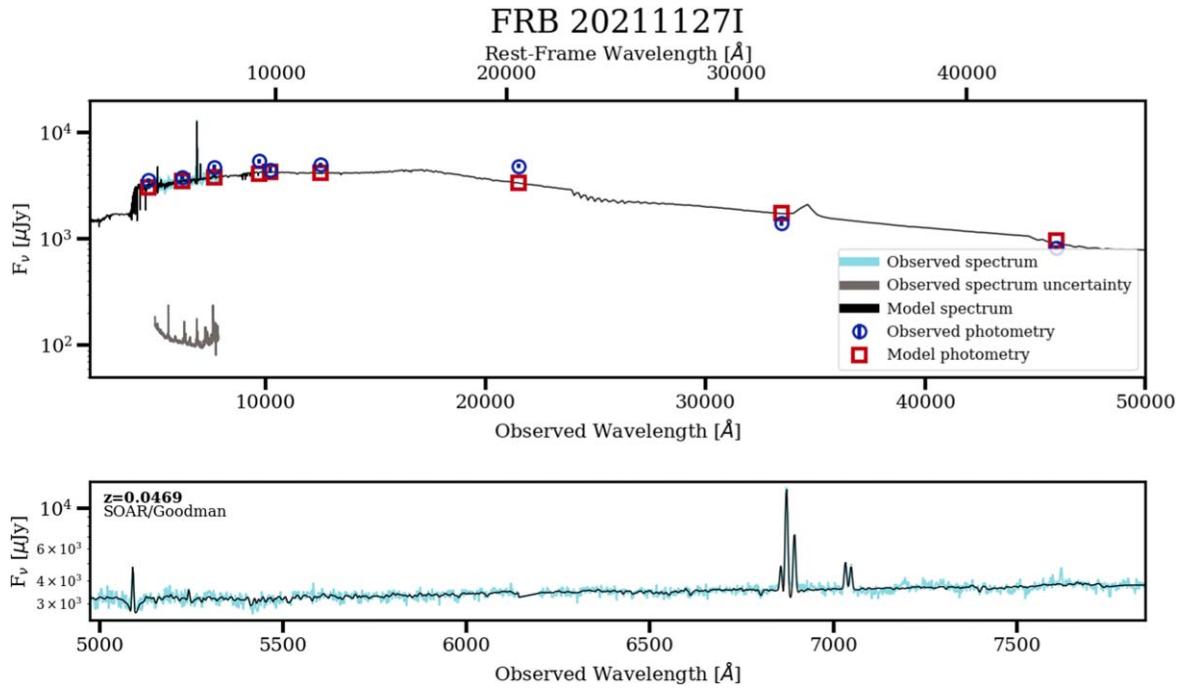
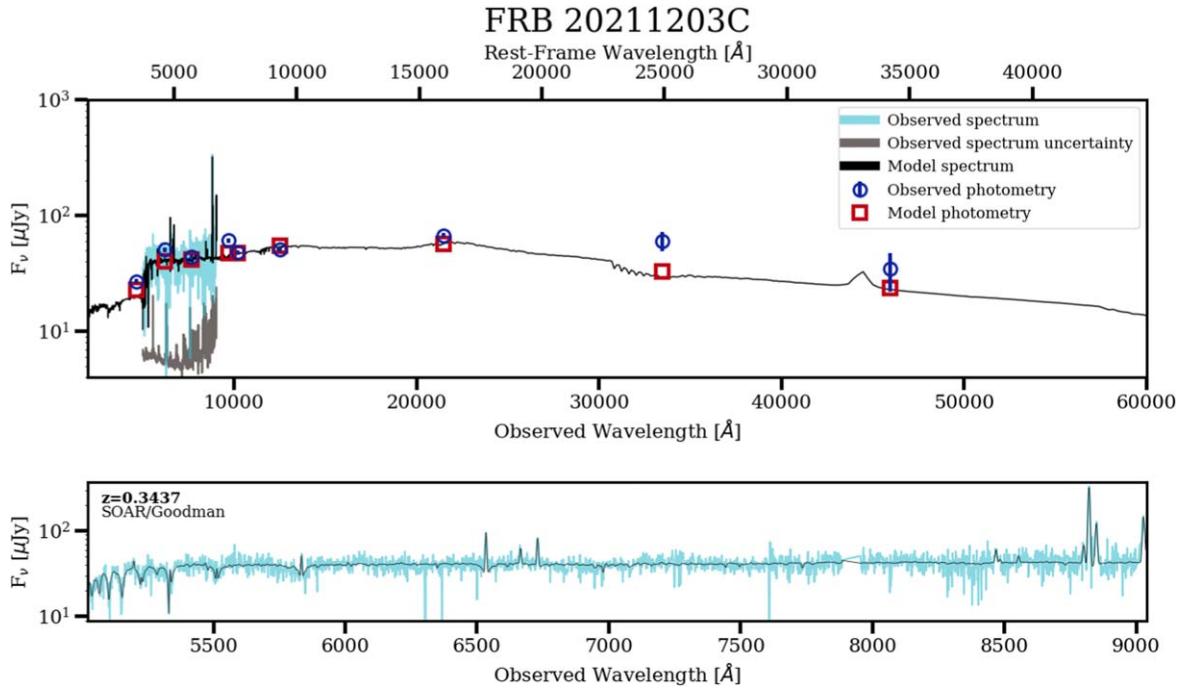
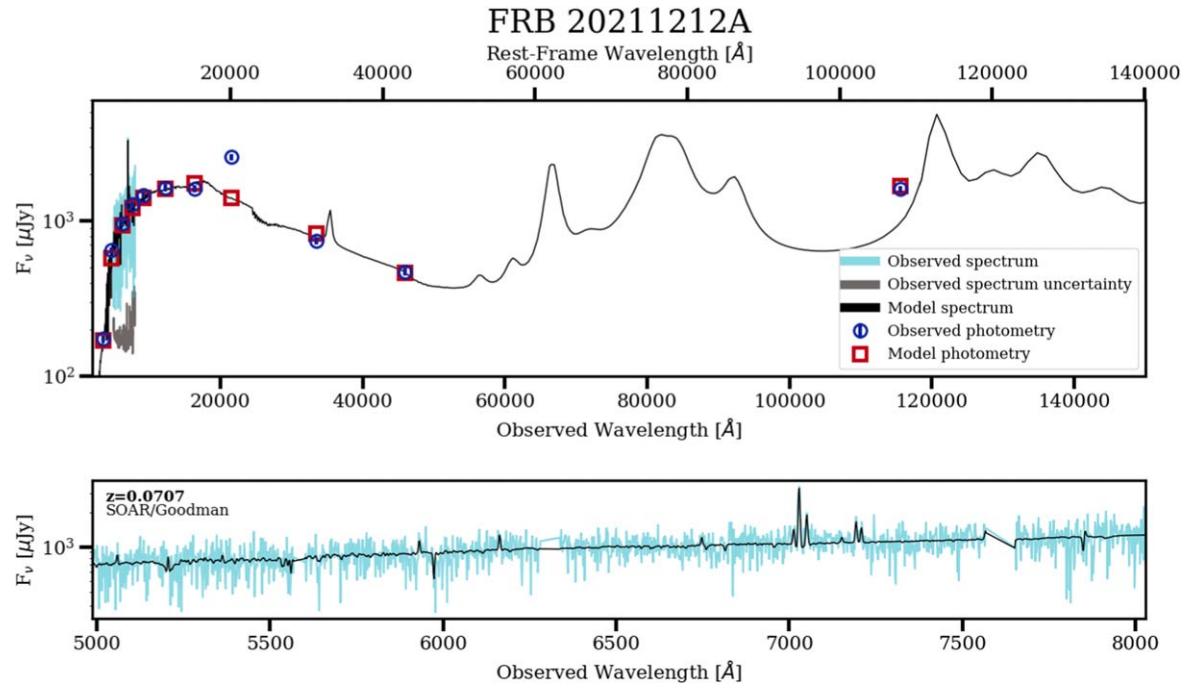
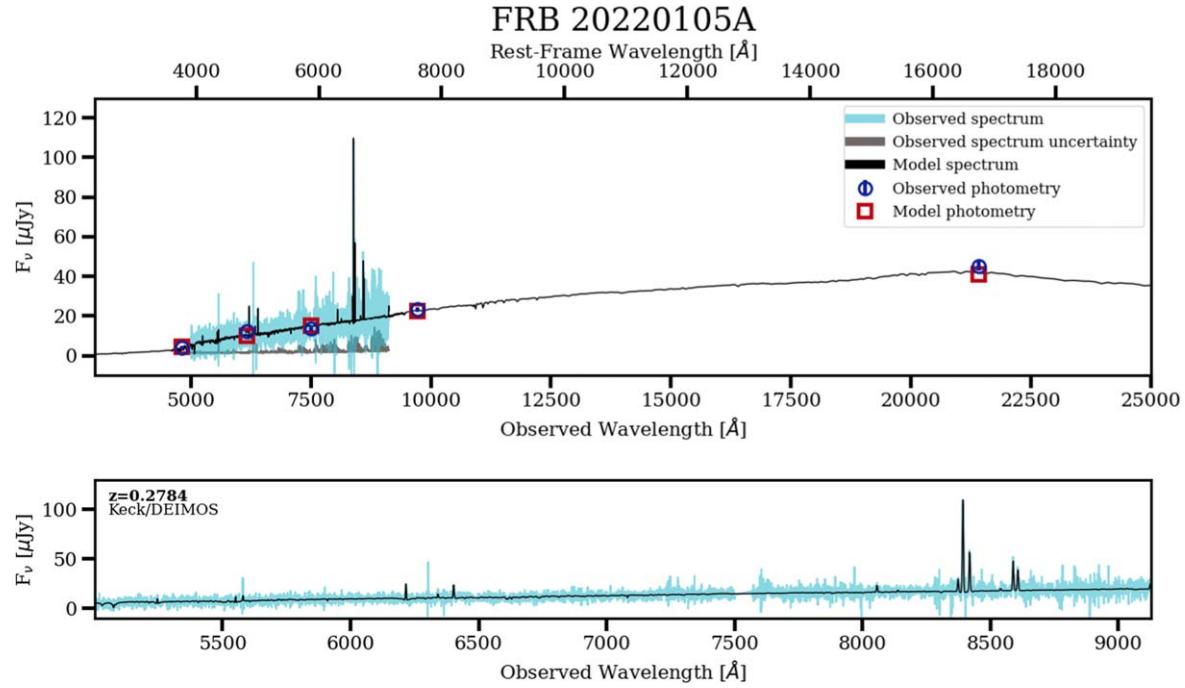


Figure 28. SED of FRB 20210807D.

**Figure 29.** SED of FRB 20211127I.**Figure 30.** SED of FRB 20211203C.

**Figure 31.** SED of FRB 20211212A.**Figure 32.** SED of FRB 20220105A.

## Appendix C

### Photometry

Here we present all FRB host galaxy photometry used in our modeling. We include details on the facility, instrument,

observation date, filter, photometry, and references in Table 5. See Section 3.1 for additional details about the observation and data reduction procedures.

**Table 5**  
Log of FRB Host Galaxy Imaging

FRB	Facility	Instrument	Observation Date(s)	Filter	Magnitude [AB]	Program ID	Reference
20121102A	Gemini North	GMOS	2016 Dec 29 UT	<i>g</i>	23.33 ± 0.12	GN-2016B-DD-2	1
	Gemini North	GMOS	2016 Dec 29 UT	<i>r</i>	23.73 ± 0.14		1
	Gemini North	GMOS	2016 Nov 2 UT	<i>i</i>	23.54 ± 0.09		2
	Gemini North	GMOS	2016 Nov 2 UT	<i>z</i>	23.49 ± 0.13		2
	MMT	MMIRS	2021 Dec 21, 22 UT	<i>J</i>	23.51 ± 0.051		This Work
	MMT	MMIRS	2021 Dec 17 UT	<i>Ks</i>	23.73 ± 0.59		This Work
	HST	WFC3	2017 Feb 23 UT	F110W	23.08 ± 0.01		GO-14890
	HST	WFC3	2017 Feb 23 UT	F160W	22.96 ± 0.03		1, 3
	Spitzer	IRAC	2017 Jan 4 UT	CH1	23.79 ± 0.20		1, 3
						Obs ID 62322432	1
20180301A	NOT	ALFOSC	2021 Oct 26-Dec 14 UT	<i>u</i>	21.77 ± 0.30	62-503	4
	NOT	ALFOSC	2021 Oct 26-Dec 14 UT	<i>g</i>	21.64 ± 0.09		4
	NOT	ALFOSC	2021 Oct 26-Dec 14 UT	<i>r</i>	21.21 ± 0.06		4
	NOT	ALFOSC	2021 Oct 26-Dec 14 UT	<i>i</i>	21.11 ± 0.06		4
	NOT	ALFOSC	2021 Oct 26-Dec 14 UT	<i>z</i>	20.66 ± 0.11		4
	MMT	MMIRS	2021 Feb 27 UT	<i>J</i>	20.61 ± 0.07		4
	MMT	MMIRS	2021 Feb 27 UT	<i>H</i>	20.43 ± 0.08		4
	MMT	MMIRS	2021 Feb 28 UT	<i>Ks</i>	20.53 ± 0.08		4
20180916B	SDSS			<i>g</i>	17.08 ± 0.08	16072	5
	SDSS			<i>r</i>	16.17 ± 0.03		5
	SDSS			<i>i</i>	15.93 ± 0.02		5
	SDSS			<i>z</i>	15.85 ± 0.06		5
	HST	WFC3	2020 July 17 UT	F110W	15.30 ± 0.01		3, 6
	WISE			W1	17.04 ± 0.03		7
	WISE			W2	17.73 ± 0.05		7
	WISE			W3	15.71 ± 0.08		7
	WISE			W4	15.67 ± 0.52		7
20180924B	DECaLS	DECam		<i>g</i>	21.42 ± 0.02	15878	8
	DECaLS	DECam		<i>r</i>	20.33 ± 0.01		8
	DES	DECam		<i>i</i>	20.01 ± 0.01		9
	DECaLS	DECam		<i>z</i>	19.56 ± 0.01		8
	DES	DECam		<i>Y</i>	19.65 ± 0.05		9
	HST	WFC3	2019 Nov 26 UT	F300X	23.37 ± 0.06		3
	HST	WFC3	2019 Nov 27 UT	F160W	19.34 ± 0.002		3
	VISTA	VIRCAM		<i>J</i>	19.24 ± 0.11		10, This Work
	VISTA	VIRCAM		<i>Ks</i>	18.97 ± 0.17		10, This Work
	WISE			W1	19.46 ± 0.22		7
20181112A	DES	DECam		<i>g</i>	22.64 ± 0.09	10, This Work	9
	DES	DECam		<i>r</i>	21.68 ± 0.05		9
	DES	DECam		<i>i</i>	21.46 ± 0.06		9
	DES	DECam		<i>z</i>	21.42 ± 0.11		9
	DES	DECam		<i>Y</i>	21.05 ± 0.17		9
	VISTA	VIRCAM		<i>J</i>	20.96 ± 0.02		10, This Work
20190102C	VLT	FORS2	2019 Jun 17 UT	<i>u</i>	22.77 ± 0.20	0103.A-0101(A)	4
	VLT	FORS2	2019 Jan 12 UT	<i>g</i>	21.87 ± 0.10		4
	VLT	FORS2	2019 Jan 12 UT	<i>I</i>	20.77 ± 0.05		4
	VLT	FORS2	2019 Jun 17 UT	<i>z</i>	20.54 ± 0.20		4
	HST	WFC3	2020 Jan 14 UT	F160W	20.45 ± 0.01		3
20190520B	SOAR	Goodman	2022 Sept 1 UT	<i>u</i>	<23.23	SOAR2022B-007	This Work
	SOAR	Goodman	2022 Sept 14 UT	<i>g</i>	23.03 ± 0.14		This Work
	SOAR	Goodman	2022 Aug 26 UT	<i>r</i>	22.16 ± 0.06		This Work
	SOAR	Goodman	2022 Aug 20 UT	<i>i</i>	21.85 ± 0.07		This Work
	SOAR	Goodman	2022 Sept 14, 29 UT	<i>z</i>	21.95 ± 0.16		This Work
	Subaru	MOIRCS	2020 Aug 5 UT	<i>J</i>	21.88 ± 0.14		11
20190608B	SDSS			<i>u</i>	19.06 ± 0.04	15878	5
	DECaLS	DECam		<i>g</i>	17.98 ± 0.001		8
	DECaLS	DECam		<i>r</i>	17.41 ± 0.002		8
	SDSS			<i>i</i>	17.12 ± 0.01		5
	DECaLS	DECam		<i>z</i>	16.92 ± 0.001		8
	HST	WFC3	2019 Oct 11 UT	F300X	19.51 ± 0.01		3

**Table 5**  
(Continued)

FRB	Facility	Instrument	Observation Date(s)	Filter	Magnitude [AB]	Program ID	Reference
	HST	WFC3	2019 Dec 1 UT	F160W	16.67 ± 0.001		3
	VISTA	VIRCAM		J	16.76 ± 0.02		10, This Work
	VISTA	VIRCAM		K <sub>s</sub>	16.55 ± 0.04		10, This Work
	WISE			W1	16.97 ± 0.03		7
	WISE			W2	17.13 ± 0.06		7
	WISE			W3	15.93 ± 0.15		7
20190611B	VLT	FORS2	2020 Sept 19 UT	g	23.36 ± 0.09	105.204W.001	4
	Gemini South	GMOS	2019 Sept 26 UT	r	22.15 ± 0.15	GS-2019B-Q-132	4
	Gemini South	GMOS	2019 Dec 27 UT	i	21.90 ± 0.02		4
	VLT	FORS2	2019 July 12 UT	I	22.07 ± 0.07	0103.A-0101(A)	4
20190711A	Gemini South	GMOS	2019 Nov 28 UT	g	23.55 ± 0.20	GS-2019B-Q-132	12
	Gemini South	GMOS	2019 Nov 23, 27 UT	r	23.54 ± 0.15		12
	Gemini South	GMOS	2019 Nov 28 UT	i	22.98 ± 0.15		12
	HST	WFC3	2020 May 9 UT	F300X	24.25 ± 0.12	16080	3
	HST	WFC3	2020 May 11 UT	F160W	22.84 ± 0.01		3
20190714A	Pan-STARRS			g	20.91 ± 0.04		13
	Pan-STARRS			r	20.34 ± 0.03		13
	Pan-STARRS			i	19.84 ± 0.02		13
	Pan-STARRS			z	19.64 ± 0.03		13
	Pan-STARRS			y	19.44 ± 0.06		13
	HST	WFC3	2020 May 19 UT	F300X	22.68 ± 0.05	16080	3
	HST	WFC3	2020 Apr 30 UT	F160W	18.88 ± 0.002		3
	VISTA	VIRCAM		Y	19.48 ± 0.02		10, This Work
	VISTA	VIRCAM		J	18.90 ± 0.01		10, This Work
	VISTA	VIRCAM		H	18.80 ± 0.01		10, This Work
	VISTA	VIRCAM		K <sub>s</sub>	18.79 ± 0.01		10, This Work
	WISE	VIRCAM		W1	19.31 ± 0.24		7
	WISE	VIRCAM		W2	19.11 ± 0.33		7
20191001A	DECaLS	DECam		g	19.18 ± 0.01		8
	DECaLS	DECam		r	18.36 ± 0.003		8
	DES	DECam		i	17.92 ± 0.002		9
	DECaLS	DECam		z	17.73 ± 0.004		8
	DES	DECam		Y	17.64 ± 0.01		9
	HST	WFC3	2020 Apr 25 UT	F300X	21.07 ± 0.02	16080	3
	HST	WFC3	2020 Apr 28 UT	F160W	17.12 ± 0.001		3
	VISTA	VIRCAM		J	17.30 ± 0.01		10, This Work
	VISTA	VIRCAM		H	17.09 ± 0.01		10, This Work
	VISTA	VIRCAM		K <sub>s</sub>	16.90 ± 0.01		10, This Work
20200430A	DECaLS	DECam		g	21.78 ± 0.03		8
	DECaLS	DECam		r	21.05 ± 0.02		8
	Pan-STARRS			i	20.98 ± 0.05		13
	DECaLS	DECam		z	20.52 ± 0.03		8
	Pan-STARRS			y	20.68 ± 0.18		13
	MMT	MMIRS	2022 June 12 UT	J	19.85 ± 0.05	UAO-G193-22A	This Work
	MMT	MMIRS	2022 June 15 UT	K <sub>s</sub>	21.26 ± 0.25		This Work
20200906A	DES	DECam		g	20.84 ± 0.01		9
	DES	DECam		r	19.95 ± 0.01		9
	DES	DECam		i	19.69 ± 0.01		9
	DES	DECam		z	19.43 ± 0.02		9
	DES	DECam		Y	19.40 ± 0.06		9
	VISTA	VIRCAM		J	19.36 ± 0.01		10, This Work
	VISTA	VIRCAM		K <sub>s</sub>	18.84 ± 0.01		10, This Work
	WISE	VIRCAM		W1	19.35 ± 0.15		7
	WISE	VIRCAM		W2	19.36 ± 0.23		7
20201124A	Pan-STARRS			g	18.40 ± 0.04		13
	Keck	LRIS	2022 Oct 29 UT	G	18.26 ± 0.02	O287	This Work
	Pan-STARRS			r	17.86 ± 0.03		13
	Pan-STARRS			i	17.53 ± 0.03		13
	Keck	LRIS	2022 Oct 29 UT	I	17.46 ± 0.02	O287	This Work
	Pan-STARRS			z	17.36 ± 0.03		13
	Pan-STARRS			y	17.34 ± 0.06		13
	2MASS			J	16.92 ± 0.12		14
	2MASS			H	16.74 ± 0.12		14
	2MASS			K <sub>s</sub>	16.74 ± 0.12		14
	WISE			W1	17.01 ± 0.04		7
	WISE			W2	17.34 ± 0.05		7
	WISE			W3	15.01 ± 0.06		7

**Table 5**  
(Continued)

FRB	Facility	Instrument	Observation Date(s)	Filter	Magnitude [AB]	Program ID	Reference
	WISE			W4	14.59 ± 0.26		7
20210117A	VLT	FORS2	2021 June 12 UT	<i>g</i>	23.06 ± 0.02	105.204W.001	15
	Keck	DEIMOS	2021 June 10, 11 UT	R	22.97 ± 0.04	O316	15
	VLT	FORS2	2021 June 12 UT	I	22.23 ± 0.05	105.204W.001	15
	SOAR	Goodman	2022 Nov 14 UT	<i>z</i>	22.20 ± 0.16	SOAR2022B-007	This Work
	VLT	HAWK-I	2022 June 10 UT	<i>J</i>	22.69 ± 0.08	108.21ZF.005	15
	VLT	HAWK-I	2022 June 10 UT	H	22.94 ± 0.10		15
	VLT	HAWK-I	2022 June 10 UT	<i>Ks</i>	22.80 ± 0.10		15
20210320C	Pan-STARRS			<i>g</i>	20.31 ± 0.04		13, This Work
	SOAR	Goodman	2022 Feb 2 UT	<i>r</i>	19.47 ± 0.02	SOAR2021B-002	This Work
	VLT	FORS2	2021 Apr 15 UT	I	19.04 ± 0.005	105.204W.003	This Work
	Gemini South	GMOS	2022 Jan 19 UT	<i>z</i>	19.04 ± 0.03	GS-2021B-Q-138	This Work
	VISTA	VIRCAM		<i>J</i>	19.09 ± 0.04		10, This Work
	VISTA	VIRCAM		H	18.82 ± 0.05		10, This Work
	VISTA	VIRCAM		<i>Ks</i>	18.68 ± 0.08		10, This Work
	WISE			W1	18.77 ± 0.07		7
	WISE			W2	19.18 ± 0.19		7
	WISE			W3	18.10 ± 0.42		7
20210410D	SOAR	Goodman	2022 Aug 10, 20 UT	<i>g</i>	21.77 ± 0.05	SOAR2022B-007	16
	SOAR	Goodman	2021 July 19 UT	<i>r</i>	20.65 ± 0.03	SOAR2021A-010	16
	SOAR	Goodman	2022 Aug 20 UT	<i>i</i>	20.10 ± 0.02	SOAR2022B-007	16
	SOAR	Goodman	2022 Sept 3 UT	<i>z</i>	20.23 ± 0.04		16
	VISTA	VIRCAM		Y	19.76 ± 0.16		10, 16
	VISTA	VIRCAM		<i>J</i>	20.02 ± 0.21		10, 16
20210807D	Pan-STARRS			<i>g</i>	17.76 ± 0.01		13, This Work
	Pan-STARRS			<i>r</i>	17.17 ± 0.01		13, This Work
	Pan-STARRS			<i>i</i>	16.77 ± 0.01		13, This Work
	Pan-STARRS			<i>z</i>	16.58 ± 0.01		13, This Work
	Pan-STARRS			<i>y</i>	16.46 ± 0.02		13, This Work
	VISTA	VIRCAM		<i>J</i>	16.21 ± 0.01		10, This Work
	VISTA	VIRCAM		<i>Ks</i>	16.00 ± 0.02		10, This Work
	WISE			W1	16.88 ± 0.04		7
	WISE			W2	17.24 ± 0.04		7
	WISE			W3	16.11 ± 0.10		7
20211127I	SOAR	Goodman	2022 Jan 7, 27 UT	<i>g</i>	15.03 ± 0.01	SOAR2021B-002	This Work
	SOAR	Goodman	2022 Jan 7, 27 UT	<i>r</i>	14.96 ± 0.01		This Work
	SOAR	Goodman	2022 Jan 7 UT	<i>i</i>	14.72 ± 0.01		This Work
	SOAR	Goodman	2022 Feb 2 UT	<i>z</i>	14.57 ± 0.01		This Work
	VISTA	VIRCAM		Y	14.78 ± 0.01		10, This Work
	VISTA	VIRCAM		<i>J</i>	14.66 ± 0.01		10, This Work
	VISTA	VIRCAM		<i>Ks</i>	14.70 ± 0.01		10, This Work
	WISE			W1	16.05 ± 0.01		7
	WISE			W2	16.62 ± 0.02		7
	WISE			W3	14.99 ± 0.03		7
	WISE			W4	14.17 ± 0.11		7
20211203C	SOAR	Goodman	2022 Feb 1 UT	<i>g</i>	20.32 ± 0.02	SOAR2021B-002	This Work
	SOAR	Goodman	2022 Jan 28 UT	<i>r</i>	19.64 ± 0.03		This Work
	SOAR	Goodman	2022 Jan 27 UT	<i>i</i>	19.79 ± 0.01		This Work
	SOAR	Goodman	2022 Jan 27 UT	<i>z</i>	19.44 ± 0.03		This Work
	VISTA	VIRCAM		Y	19.70 ± 0.02		10, This Work
	VISTA	VIRCAM		<i>J</i>	19.64 ± 0.02		10, This Work
	VISTA	VIRCAM		<i>Ks</i>	19.33 ± 0.01		10, This Work
	WISE			W1	19.45 ± 0.20		7
	WISE			W2	20.05 ± 0.40		7
20211212A	SDSS			<i>u</i>	18.30 ± 0.03		5
	SOAR	Goodman	2022 Jan 25 UT	<i>g</i>	16.88 ± 0.01	SOAR2021B-002	This Work
	SOAR	Goodman	2022 Jan 25 UT	<i>r</i>	16.44 ± 0.01		This Work
	SOAR	Goodman	2022 Jan 25, 27 UT	<i>i</i>	16.14 ± 0.01		This Work
	Gemini South	GMOS	2022 Jan 18 UT	<i>z</i>	15.98 ± 0.03	GS-2021B-Q-138	This Work
	2MASS			<i>J</i>	15.87 ± 0.03		14
	2MASS			H	15.89 ± 0.03		14
	2MASS			<i>Ks</i>	15.38 ± 0.01		14
	WISE			W1	16.72 ± 0.02		7
	WISE			W2	17.22 ± 0.03		7
	WISE			W3	15.89 ± 0.05		7
	Pan-STARRS			<i>g</i>	22.36 ± 0.21		13, This Work
...	Pan-STARRS			<i>r</i>	21.19 ± 0.08		13, This Work

**Table 5**  
(Continued)

FRB	Facility	Instrument	Observation Date(s)	Filter	Magnitude [AB]	Program ID	Reference
...	Pan-STARRS			<i>i</i>	$21.05 \pm 0.11$		13, This Work
...	SOAR	Goodman	2022 Jan 25 UT	<i>z</i>	$20.48 \pm 0.01$	SOAR2021B-002	This Work
...	VLT	HAWK-I	2022 Mar 24 UT	<i>Ks</i>	$19.76 \pm 0.02$	108.21ZF.005	This Work

**Note.** All imaging observations included in this work. All photometry is corrected for Galactic extinction using the Fitzpatrick & Massa (2007) extinction law.  
**References.** (1) Bassa et al. (2017), (2) Tendulkar et al. (2017), (3) Mannings et al. (2021), (4) Bhandari et al. (2022b), (5) Alam et al. (2015), (6) Tendulkar et al. (2021), (7) Wright et al. (2010), (8) Dey et al. (2019), (9) Abbott et al. (2021), (10) McMahon et al. (2013), (11) Niu et al. (2022), (12) Heintz et al. (2020), (13) Chambers et al. (2016), (14) Skrutskie et al. (2006), (15) Bhandari et al. (2022a), (16) Caleb et al. (2023).

## Appendix D Prospector Priors

Here we list the full details of the priors used in the Prospector modeling in Table 6. We define each prior, list

its range or fixed value, and note any additional relevant information.

**Table 6**  
Priors

Parameter	Definition	Prior Range or Value	Notes
<i>z</i>	Spectroscopic host redshift	$\mathcal{U}(z - 0.01, z + 0.01)$	
dust2	Dust attenuation of stellar light	$\mathcal{CN}(\mu = 0.3, \sigma = 1, \text{min} = 0.0, \text{max} = 4.0)$	
dust1_fraction	Optical depth of dust attenuating young stars and nebular emission	$\mathcal{CN}(\mu = 0.3, \sigma = 1, \text{min} = 0.0, \text{max} = 2.0)$	
dust1	Dust attenuation of young stellar light	$\text{dust2} \times \text{dust1\_fraction}$	
dust_index	Power-law modification of slope from the Calzetti et al. (2000) attenuation curve	$\mathcal{U}(-1.0, 4.0)$	
logsf_ratio	Ratio of star formation rate between adjacent age bins	$\mathcal{T}(\mu = 0, \sigma = 0.3, \nu = 2)$	
log( $M/M\odot$ )	Total mass formed	(8.0, 12.0)	Follows Gallazzi et al. (2005) mass–metallicity relation
log( $Z/Z\odot$ )	Metallicity	(−2.0, 0.19)	Follows Gallazzi et al. (2005) mass–metallicity relation
dust_e_qpah	Grain size distribution of polycyclic aromatic hydrocarbons	$\mathcal{U}(0.5, 7.0)$	Only included if data $\geq 2 \mu\text{m}$ are available
fagn	Fraction of total AGN luminosity relative to the bolometric stellar luminosity	$L\mathcal{U}(1e-5, 3.0)$	Only included if data $\geq 2 \mu\text{m}$ are available
agn_tau	Optical depth of the AGN dust torus	$L\mathcal{U}(5.0, 150.0)$	Only included if data $\geq 2 \mu\text{m}$ are available
gas_logz	Gas-phase metallicity	$\mathcal{U}(-2.0, 0.5)$	Only included if spectrum is used
gas_logu	Gas ionization parameter	$\mathcal{U}(-4, -1)$	Only included if spectrum is used
eline_sigma	Emission line width	$\mathcal{U}(30, 300)$	Only included if spectrum and nebular marginalization used
sigma_smooth	Velocity dispersion in kilometers per second	$\mathcal{U}(40.0, 400.0)$	Only included if spectrum is used
f_outlier_spec	Fraction of spectral pixels that are considered outliers	$\mathcal{U}(1e-5, 0.5)$	Only if spectrum used
spec_jitter	Multiplicative noise inflation term in spectroscopic pixels	$\mathcal{U}(1.0, 3.0)$	Only if spectrum used
SFH	Continuity SFH	3	
imf_type	Kroupa (2001) IMF	2	
dust_type	Kriek & Conroy (2013) dust attenuation curve	4	
smoothtype	Type of spectral smoothing	vel	Smoothing in velocity dispersion
fftsmooth	Use fast Fourier transform to perform spectral smoothing	True	
add_neb_emission	Turn on nebular emission	True	
add_neb_continuum	Turn off nebular continuum	True	
nebemlineinspec		False	Turned off if nebular marginalization is on

**Table 6**  
(Continued)

Parameter	Definition	Prior Range or Value	Notes
	Add nebular emission lines to the model spectrum		
marginalize_elines	Fit and marginalize over observed emission lines	True	Only included if spectrum and nebular marginalization used
use_eline_prior	Use prior on width of nebular emission lines	True	Only included if spectrum and nebular marginalization used
eline_prior_width	Width of the prior on line luminosity in units of true luminosity divided by FSPS prediction	1.0	Only included if spectrum and nebular marginalization used
lines_to_fit	Specify which lines to marginalize over	All	Only included if spectrum and nebular marginalization used
polyorder	Chebyshev polynomial order for fitting the observed spectrum	12	Only if spectrum used
poly_regularization	Regularization of polynomial coefficients for the spectral calibration vector	0	Only if spectrum used
spec_norm	Normalization of the spectrum in units of true flux divided by observed flux	1.0	Only if spectrum used. This parameter is fixed if the spectral polynomial calibration vector is set to be optimized
nsigma_outlier_spec	Factor of inflation for errors determined by $f_{\text{outlier\_spec}}$	50	Only if spectrum used
$f_{\text{outlier\_phot}}$	Fraction of photometric bands considered outliers	0	
nsigma_outlier_phot	Factor of inflation for errors determined by $f_{\text{outlier\_phot}}$	50	

**Note.** Details of the free and fixed `Prospector` priors used in this work.  $\mathcal{U}$  denotes a uniform distribution.  $C\mathcal{N}$  denotes a clipped Normal distribution.  $\mathcal{T}$  denotes a Student T-distribution.  $L\mathcal{U}$  denotes a log uniform distribution.

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