



Are All Post-starbursts Mergers? HST Reveals Hidden Disturbances in the Majority of PSBs

Elizaveta Sazonova¹ , Katherine Alatalo^{1,2} , Kate Rowlands^{1,3} , Susana E. Deustua² , K. Decker French⁴ , Timothy Heckman¹ , Lauranne Lanz⁵ , Ute Lisenfeld^{6,7} , Yuanze Luo¹ , Anne Medling^{8,9} , Kristina Nyland¹⁰ , Justin A. Otter¹ , Andreea O. Petric² , Gregory F. Snyder² , and Claudia Megan Urry^{11,12}

¹ Johns Hopkins University, Department of Physics and Astronomy, Baltimore, MD 21218, USA

² Space Telescope Science Institute, 3700 San Martin Dr., Baltimore, MD 21218, USA

³ AURA for ESA, Space Telescope Science Institute, 3700 San Martin Dr., Baltimore, MD 21218, USA

⁴ Department of Astronomy, University of Illinois Urbana-Champaign, Urbana, IL 61801, USA

⁵ The College of New Jersey, Ewing, NJ 08618, USA

⁶ Dpto. de Física Teórica y del Cosmos, Campus de Fuentenueva, Edificio Mecenaz, Universidad de Granada, E-18071 Granada, Spain

⁷ Instituto Carlos I de Física Teórica y Computacional, Facultad de Ciencias, E-18071 Granada, Spain

⁸ Ritter Astrophysical Research Center, University of Toledo, Toledo, OH 43606, USA

⁹ ARC Centre of Excellence for All Sky Astrophysics in 3 Dimensions (ASTRO 3D), Australia

¹⁰ National Research Council, resident at the U.S. Naval Research Laboratory, 4555 Overlook Ave. SW, Washington, DC 20375, USA

¹¹ Yale Center for Astronomy & Astrophysics, 46 Hillhouse Avenue, New Haven, CT 06511, USA

¹² Department of Physics, Yale University, P.O. Box 208120, New Haven, CT 06520-8120, USA

Received 2021 April 8; revised 2021 May 18; accepted 2021 May 20; published 2021 October 4

Abstract

How do galaxies transform from blue, star-forming spirals to red, quiescent early-type galaxies? To answer this question, we analyzed a set of 26 gas-rich, shocked post-starburst galaxies with Hubble Space Telescope (HST) imaging in *B*, *I*, and *H* bands and Sloan Digital Sky Survey (SDSS) *i*-band imaging of similar depth but lower resolution. We found that post-starbursts in our sample have intermediate morphologies between disk- and bulge-dominated (Sérsic $n = 1.7^{+0.3}_{-0.0}$) and have red bulges, likely due to dust obscuration in the cores. A majority of galaxies in our sample are more morphologically disturbed than regular galaxies (88%, corresponding to $>3\sigma$ significance) when observed with HST, with asymmetry and Sérsic residual flux fraction being the most successful measures of disturbance. Most disturbances are undetected at the lower resolution of SDSS imaging. Although $\sim 27\%$ galaxies are clear merger remnants, we found that disturbances in another $\sim 30\%$ of the sample are internal, caused by small-scale perturbations or dust substructures rather than tidal features, and require high-resolution imaging to detect. We found 2.8σ evidence that asymmetry features fade on timescales ~ 200 Myr, and may vanish entirely after ~ 750 Myr, so we do not rule out a possible merger origin of all post-starbursts given that asymmetric features may have already faded. This work highlights the importance of small-scale disturbances, detected only in high-resolution imaging, in understanding structural evolution of transitioning galaxies.

Unified Astronomy Thesaurus concepts: Post-starburst galaxies (2176); Galaxies (573); Galaxy classification systems (582); Galaxy mergers (608); Galaxy evolution (594); Galaxy quenching (2040); Galaxy structure (622); Galactic and extragalactic astronomy (563); Galaxy physics (612)

Supporting material: figure sets, machine-readable table

1. Introduction

There is a strong bimodality among galaxies in the local universe: the majority of galaxies belong to either the blue star-forming cloud or the red quiescent sequence (Baldry et al. 2004). Over cosmic time, the number density of galaxies increased on the red sequence and decreased in the blue cloud, showing that star-forming galaxies (SFGs) quench their star formation and transition to the red sequence (Bell et al. 2004; Arnouts et al. 2007; Faber et al. 2007). Transitioning galaxies, found in the “green valley,” are relatively rare (Bell et al. 2003), and the majority of “green valley” galaxies are quenching slowly by building up the central bulge and gradually exhausting their star-forming fuel (e.g., Noeske et al. 2007; Schawinski et al. 2014). However, some galaxies quench much more rapidly, on timescales of ≤ 1 Gyr, and therefore are much rarer (e.g., Goto 2005). It is difficult to find a large-enough population of rapidly transitioning galaxies to study, and the mechanism behind this rapid quenching is still one of the biggest unresolved questions in galaxy evolution.

Another important bimodality in the local galaxy population is that of the galaxy structure. Blue galaxies are predominantly disks with spiral arms, while red galaxies are dominated either partially or entirely by a central bulge, which is a spheroidal component (Strateva et al. 2001; Schawinski et al. 2014). Blue spheroids and red disks are extremely uncommon in the local universe (Masters et al. 2010; Barro et al. 2013). This bimodality provides insight into the galaxies’ evolutionary pathway: during the short transition period, the galaxies must both stop forming stars and change their morphology. However, the relative timescales are still uncertain: does morphology of these rapidly transitioning galaxies change prior to, concurrently with, or after the quenching of star formation?

1.1. Post-starburst Galaxies

To answer these questions, it is essential to study galaxies that are currently rapidly transitioning. In recent years, large surveys such as the Sloan Digital Sky Survey (SDSS; e.g., Abazajian et al. 2004; York et al. 2000; Strauss et al. 2002;

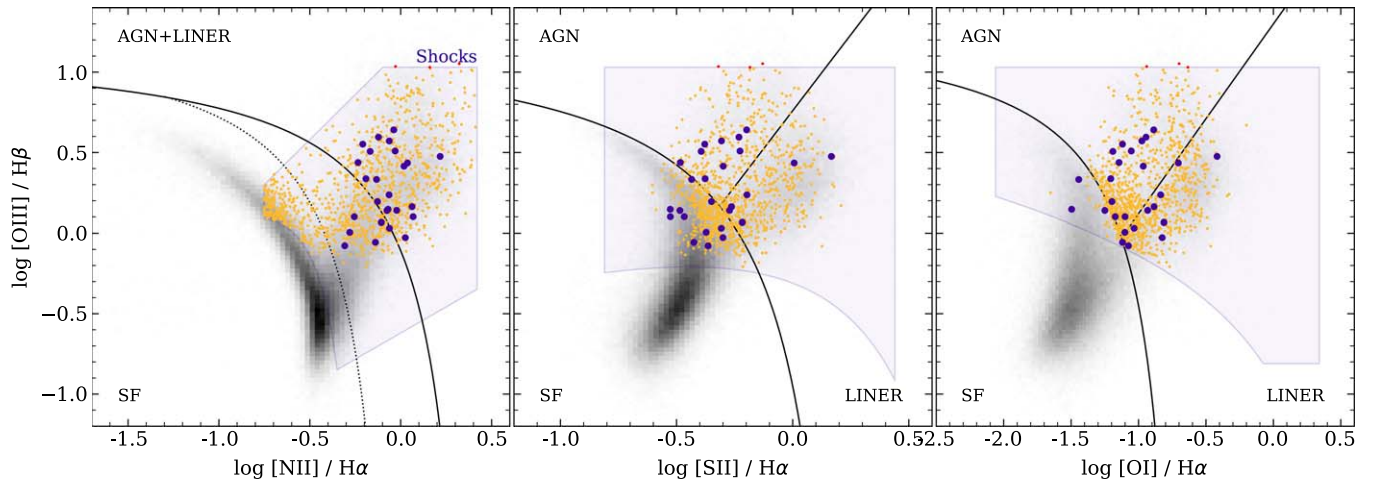


Figure 1. The line diagnostic diagrams (Baldwin et al. 1981; Veilleux & Osterbrock 1987) used to determine the ionization mechanism, with spectroscopic data for $[\text{O III}]/\text{H}\beta$, $[\text{N II}]/\text{H}\alpha$, $[\text{S II}]/\text{H}\alpha$ (using the $[\text{S II}]$ doublet), and $[\text{O I}]/\text{H}\alpha$ emission lines. Three data sets are plotted: ELG sample (gray), SPOGs (orange), and HST-SPOGs (purple). Regions of star formation (SF), AGN, and LINER emission are separated by black solid lines (Kauffmann et al. 2003b; Kewley et al. 2006). The purple outline shows the shock ionization boundaries from Alatalo et al. (2016a). Three galaxies shown in red are SPOGs that have ionization above the shock boundary and are therefore excluded from our sample.

Blanton et al. 2017) have provided imaging and spectral data for millions of galaxies. Among these, a rare class of galaxies called “post-starbursts” (PSBs) have been identified, whose star formation quenched in the past ~ 1 Gyr (e.g., Dressler & Gunn 1983; Zabludoff et al. 1996; Goto 2005). Although some PSBs rejuvenate and continue to form stars, most do not; therefore, they are the ideal sample to study rapid galaxy quenching (Young et al. 2014).

Historically, PSBs have been identified by a lack of ionized emission lines caused by short-lived massive stars and strong $\text{H}\delta$ absorption from intermediate-age A stars (“K+A” or “E+A” galaxies; Quintero et al. 2004; Goto 2005, 2007). The morphology of E+As varies from intermediate to early-type, indicating that they are likely transitioning galaxies (Quintero et al. 2004; Tran et al. 2004; Blake et al. 2004; Yang et al. 2008; Pawlik et al. 2018). However, this selection is biased against other energetic processes associated with quenching that could result in strong emission lines, such as shocks induced by stellar winds, active galactic nuclei (AGNs), or low-ionization nuclear emission-line regions (LINERs). To account for this, several new methods have been proposed that do not exclude ionized emission (Wild et al. 2007; Yesuf et al. 2014). One such method selects a set of shocked post-starburst galaxies (SPOGs; Alatalo et al. 2016a), by allowing ionized emission consistent with shocks, AGNs, and LINERs rather than purely star formation (Kauffmann et al. 2003b; Kewley et al. 2006), as shown in Figure 1. SPOGs trace, on average, a younger population of PSBs than E+As, so they are a powerful set of galaxies to study the early phase of the transition (Alatalo et al. 2016a).

1.2. Quenching Mechanisms

An array of quenching mechanisms capable of quickly shutting down star formation have been proposed, but it is unclear which are dominant for which galaxies, and it is likely they act in tandem rather than on their own. Quenching models act by either removing or heating the star-forming molecular gas to prevent it from collapsing into stars. PSBs still host large reservoirs of molecular gas (French et al. 2015; Rowlands et al. 2015) but do not form stars, while red sequence galaxies are

devoid of gas (Crocker et al. 2011; Young et al. 2011). Therefore, gas suppression is important in triggering the PSB phase, while gas removal is necessary to complete the transition to a quiescent galaxy (QG).

Among others, supernova winds (e.g., Kaviraj et al. 2007a), AGN feedback (e.g., Ciccone et al. 2014; Baron & Netzer 2019), shocks (e.g., Alatalo et al. 2015), turbulence (e.g., Lanz et al. 2016; Smercina et al. 2018), and ram pressure stripping (Gunn & Gott 1972) in galaxy clusters have all been invoked to either remove gas or prevent it from forming stars. However, these processes simply affect the gas supply and do not transform the galaxy morphology on their own. Since SFGs and QGs have starkly different structures, one or more other mechanisms must act alongside gas suppression to change the structure of a transitioning galaxy. Therefore, to fully understand the quenching pathway(s) of PSBs, it is essential to study their morphology.

Galaxy mergers are an effective way to disturb the galactic disk and build up a central bulge, changing the galaxy morphology (e.g., Toomre & Toomre 1972; Hopkins et al. 2006; Snyder et al. 2011), and have been shown to be an important formation mechanism for simulated PSBs (Zheng et al. 2020; Lotz et al. 2021). They can drive shocks across the interstellar medium (ISM) and trigger a central starburst or an AGN, leading to strong supernova- and/or AGN-driven winds (Bekki et al. 2005). Therefore, mergers are an attractive candidate for the primary quenching trigger. Recent studies find that about 50% of PSBs show merger signatures, although the merger fraction varies from 15% to 70% (Zabludoff et al. 1996; Goto 2005; Yang et al. 2008; Pracy et al. 2009; Pawlik et al. 2016). Although the merger fraction of PSBs is larger relative to the average fraction in the field (1.5%–5%; Darg et al. 2010), roughly half of PSBs do not appear to be merger remnants. We then face a question: what triggered a starburst in the remaining, non-merger PSBs?

The remaining galaxies may have had their morphology transformed via less violent events: minor mergers (e.g., Bournaud et al. 2007; Jackson et al. 2019), tidal torques (e.g., Moore et al. 1996), disk instabilities (e.g., Dekel & Burkert 2013), or a gradual buildup of a central bulge leading

to morphological quenching (e.g., Martig et al. 2013; Gensior et al. 2020).

On the other hand, it is possible that the majority of PSBs experienced a merger event that remains undetected. Simulations show that merger signatures fade on the timescale of 100–500 Myr (Lotz et al. 2008; Snyder et al. 2015b; Pawlik et al. 2018), depending on the parameters of the merger. Traditionally, mergers are identified in observational data via asymmetry in the galaxy light profile (e.g., Conselice 2003; Pawlik et al. 2016). Longer-lasting merger signatures such as shells are symmetric and therefore would be undetected. The seeing limit of ground-based surveys also limits our ability to detect small-scale disturbances below the resolution limit.

To determine whether galaxy mergers are common in PSBs, we obtained high-resolution optical imaging of a set of PSBs with the Hubble Space Telescope (HST), with comparable depth to existing lower-resolution SDSS imaging. We observed a sample of shocked PSBs that contain molecular gas, tracing a relatively young PSB phase. With careful modeling of galaxy light using GALFIT (Peng et al. 2002), as well as nonparametric analysis using STATMORPH (Rodríguez-Gómez et al. 2019), we determined whether these quickly transitioning galaxies are consistent with spheroids or disks, and whether they show more disturbance than regular SFGs and QGs.

The paper is arranged as follows. In Section 2, we present the data sample used in this study, including the subselection of our subsample of SPOGs and the comparison sample. In Section 3, we describe the imaging data reduction and preparation. In Section 4, we explain the image processing tools used to compute the morphology of our sample. In Section 5, we investigate the physical properties of our sample and their effects on morphology. In Section 6, we compare the morphology of our sample of PSBs to the comparison sample of SFGs and QGs. Finally, in Section 7, we discuss the implications of our results on the likelihood of the merger origin of PSBs.

Throughout this work, we used Wilkinson Microwave Anisotropy Probe 9 (WMAP 9) cosmology with $(\Omega_\Lambda, \Omega_M, h) = (0.713, 0.287, 0.693)$ (Hinshaw et al. 2013).

2. Data Selection

2.1. Shocked Post-starburst Galaxies

We analyzed a subset of SPOGs (Alatalo et al. 2016a) in this study. SPOGs were identified using the Oh-Sarzi-Schawinski-Yi catalog (OSSY; Oh et al. 2011) of emission and absorption features in galaxies from the SDSS Data Release 7 (DR7; Abazajian et al. 2009) spectroscopy.

First, a parent emission-line galaxy (ELG) subsample was selected from the OSSY catalog to ensure high signal-to-noise ratio (S/N) data in the spectral continuum and for the $H\beta$, $[O III]$, $H\alpha$, $[N II]$, $[S II]$, and $[O I]$ narrow lines. ELG galaxies must have stellar continuum $S/N > 10$ in the 4500–7000 Å wavelength range and line amplitude-to-noise ratios $A/N > 1$ for each line. Additionally, the ELG sample required that the ratio of the fit residuals to statistical noise (N_σ) is less than 3σ and 5σ away from the OSSY sample average for continuum and line fits, respectively. The ELG sample consists of 159,387 galaxies ($24\% \pm 0.05\%$ of the OSSY catalog). SPOGs were selected from the ELG sample using the following criteria:

1. Strong Balmer absorption characteristic of PSBs (Lick $H\delta_A$ index > 5 Å; Goto 2007).

2. Emission-line ratios inside the shocked region on each diagnostic diagram in Figure 1 (Baldwin et al. 1981; Veilleux & Osterbrock 1987; Kauffmann et al. 2003b; Kewley et al. 2006; Alatalo et al. 2016a).
3. Emission-line ratios outside of the star formation or composite region on at least one diagram in Figure 1.

This method selects galaxies that host a population of intermediate-age A stars, which give strong Balmer absorption, but not short-lived massive stars, which would ionize the gas. The requirement to have strong emission lines, unassociated with star formation, selects galaxies with ongoing energy injection from shocks, AGN winds, or LINER emission. The SPOG sample contains 1067 galaxies. Three galaxies from the parent SPOG sample (shown in red in Figure 1) have $\log([O III]/H\beta)$ slightly above the shock region cutoff, so we excluded them from our sample.

Alatalo et al. (2016b) described the CO (1–0) emission in 53 SPOGs using Institut de Radioastronomie Millimétrique (IRAM) 30 m single dish and the Combined Array for Research for Millimeter Astronomy (CARMA) interferometer. This set of galaxies was selected from a subsample of SPOGs that had a detectable $22 \mu m$ emission in the Wide-Field Infrared Survey (WISE) all-sky survey data. Of those 53, 47 galaxies were detected to have CO (1–0) emission and hence molecular gas; approximately 40% of the observed galaxies were visually disturbed in SDSS imaging.

To further study the morphology and dust content of the 47 CO-detected SPOGs, we have obtained HST imaging for 26 galaxies as part of the snapshot program (Proposal 14649, PI: Alatalo). These galaxies (hereafter HST-SPOGs) were observed using HST Wide-Field Camera 3 (WFC3) with F438W (B), F814W (I), and F160W (H) filters in order to capture the dust extinction and study morphology at high resolution.

This work focuses on a morphological analysis of the 26 HST-SPOGs and a comparison to the morphological parameters obtained from existing SDSS imaging of the same galaxies with comparable depth. We use SDSS g and i filters as the closest matched filters to B and I HST observations, respectively.

We obtained spectroscopic redshifts for all HST-SPOGs from the NYU Value-Added Catalog (NYU-VAGC; Blanton et al. 2005). We used a stellar mass catalog derived from the spectral energy distribution (SED) fitting of NYU-VAGC galaxies using SDSS and WISE photometric data from Chang et al. (2015). This catalog contained only 148,921 out of 155,364 ELG galaxies, including 975 out of 1067 SPOGs and 25 out of 26 HST-SPOGs. For one HST-SPOG that was missing a stellar mass measurement from Chang et al. (2015), we used the stellar mass from the MPA-JHU catalog (Kauffmann et al. 2003a). Although MPA-JHU stellar mass estimates exist for all SPOGs, we opted for the Chang et al. (2015) catalog because they include IR WISE data, making the mass estimates more robust. There is no systematic offset between the two catalogs, and the scatter is small. We used PSB age estimates that were measured in French et al. (2018) by fitting galaxy SEDs with stellar population synthesis models to obtain star formation histories.

The diagnostic emission-line ratios for the HST-SPOGs are overplotted in purple in Figure 1, showing that the ionization mechanisms in HST-SPOGs are consistent with the parent SPOG sample. Figure 2 (left) shows the distribution of WISE

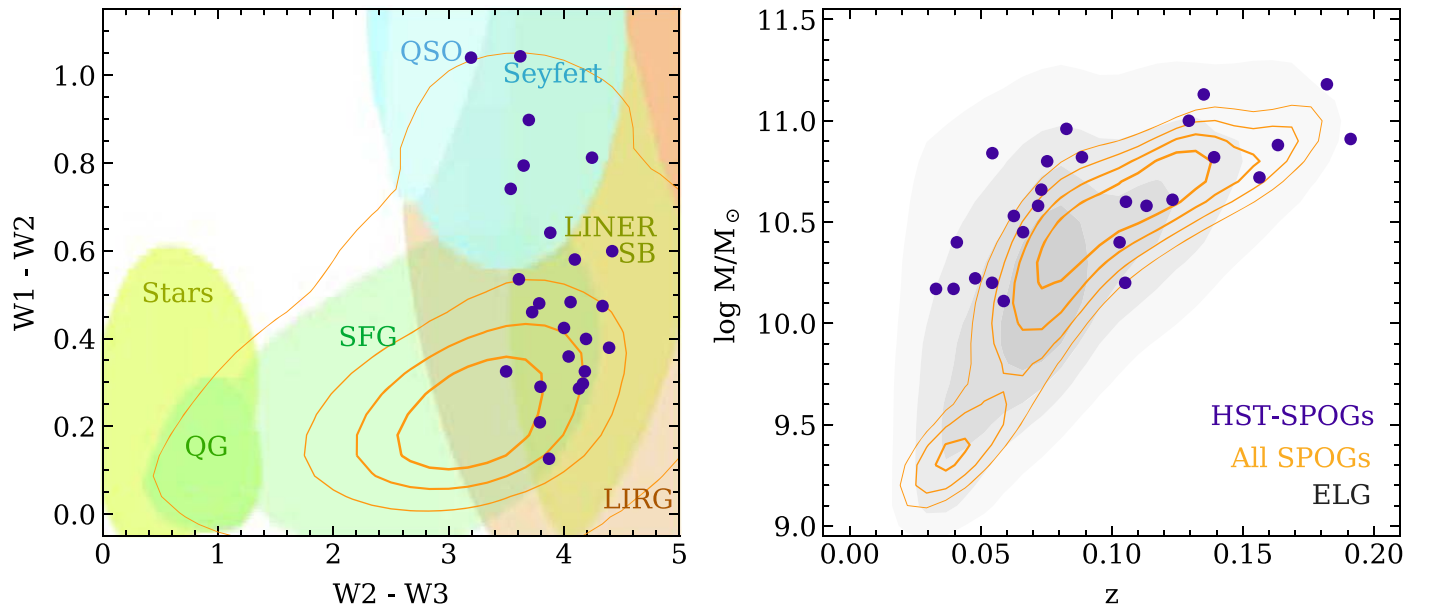


Figure 2. Left: redshift and stellar mass distributions of the ELG (gray), SPOG (orange), and HST-SPOG (purple) samples. HST-SPOGs are, on average, slightly more massive than the parent SPOG sample. Right: WISE color distributions of the SPOG (orange) and HST-SPOG (purple) samples. Typical regions for stars, quiescent galaxies (QGs), star-forming galaxies (SFGs), luminous IR galaxies (LIRGs), LINERs, starbursts (SBs), Seyfert galaxies, and quasars (QSOs) from Wright et al. (2010) are overplotted. HST-SPOGs generally lie in the LINER/starburst regions.

colors for SPOGs (orange) and HST-SPOGs (purple). Overplotted is the adaptation of different color-color regions corresponding to different types of galaxies from Wright et al. (2010). HST-SPOGs occupy primarily the starburst/LINER region, which is consistent with the fact that they all lie in the AGN/LINER or composite regions on the BPT diagram. Finally, Figure 2 (right) shows the distributions of stellar masses and redshifts for the ELG (gray), SPOG (orange), and HST-SPOG (purple) samples. SPOGs are found at slightly higher redshifts than the ELG sample, and HST-SPOGs match the SPOG redshift distribution well. However, HST-SPOGs appear more massive on average than the SPOG sample.

A summary of our sample, including galaxies’ redshift, stellar mass, NUV- r color, PSB age, gas fraction f_{gas} , and 1σ image depth in each of the filters used, is given in Table 1.

2.2. Comparison Sample

Measurements of galaxy morphology depend strongly on imaging properties (such as image wavelength, depth, and spatial resolution; e.g., Lotz et al. 2004). Before performing any analysis on a specific population of galaxies, it is essential to calibrate the morphology measurements for the given type of imaging against normal, secularly evolving galaxies, so that we are able to detect irregular morphology. Therefore, we constructed a *comparison* sample and used it to define a set of *normal* morphology measurements for star-forming and quiescent galaxies. We then compared the morphology of HST-SPOGs against that of the sample of regular galaxies to detect the irregularities in their morphology.

We calibrated the morphology of HST-SPOGs against two samples: SFGs and QGs. Stellar mass strongly affects the evolution of the galaxy (e.g., Kauffmann et al. 2003b; Baldry et al. 2004), so it is crucial to use a comparison sample of a matching stellar mass. Moreover, galaxies with higher redshift or smaller mass are fainter and smaller. Since morphological measurements depend on image resolution and depth (e.g.,

Lotz et al. 2004), measurements of smaller and fainter galaxies will systematically differ from the measurements of better-resolved ones. To account for these biases, we found one quiescent and one star-forming galaxy for each HST-SPOG that most optimally matches that HST-SPOG’s mass and redshift.

The comparison sample selection faced a number of constraints: we required the comparison galaxies to have (1) HST imaging to at least the depth of the snapshot program, (2) SDSS coverage, (3) spectroscopic redshift measurements, (4) stellar mass estimates, and (5) the observations (described below) necessary to select SFGs and QGs.

To determine whether a galaxy is star-forming or quiescent, we chose to use the catalog of Galaxy Evolution Explorer (GALEX) near-ultraviolet (NUV) Data Release 7 (DR7) observations. The NUV- r color is a powerful probe into the star formation history and can distinguish actively star-forming galaxies from quiescent ones more robustly than optical color diagnostics (Kaviraj et al. 2007b; Kaviraj 2009). GALEX has a full-sky catalog; therefore, the requirement of GALEX data did not constrain our sample more than the requirement to have SDSS and HST observations.

We used the same WISE-SDSS photometric mass catalog (Chang et al. 2015) and spectroscopic redshifts from NYU-VAGC (Blanton et al. 2005) as for HST-SPOGs.

Finally, to find F814W HST imaging of the required depth, we used the Hubble Source Catalog (HSC, 3rd version; Whitmore et al. 2016). This is a catalog obtained from performing object detection and photometry on all publicly available HST data in the Hubble Legacy Archive.

The procedure to obtain the comparison sample candidates was as follows:

1. Select galaxies with $9 < \log M_*/M_\odot < 12$ and $z < 0.2$ from the Chang et al. (2015) catalog; this resulted in 666,212 galaxies.

Table 1
Summary of HST-SPOG Sample Properties and Imaging Data Used in This Work

IAU Name	ID	R.A. (hms)	Decl. (dms)	Redshift	$\log M_*/M_\odot$	NUV- <i>r</i> (mag)	τ_{SB} (Myr)	f_{gas}	1σ Image Depth (mag arcsec ⁻²)			
									F438W	F814W	F160W	<i>i</i>
(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)	(11)	(12)	(13)
J000318+004844	1	00:03:18.21	+00:48:44	0.139	10.8 ^{+0.1} _{-0.1}	3.46	153 ⁺⁴²¹ ₋₄₈	0.24	23.4	25.1	23.4	23.7
J001145-005431	4	00:11:45.21	-00:54:30	0.048	10.2 ^{+0.1} _{-0.1}	5.07	692 ⁺²⁶⁸ ₋₁₀₆	0.06	22.4	24.6	23.4	23.6
J011957+133431	24	01:19:56.76	+13:34:31	0.191	10.9 ^{+0.1} _{-0.1}	3.04	75 ⁺³⁷ ₋₂₃	0.25	23.6	24.4	23.3	23.3
J080400+253051	77	08:03:59.62	+25:30:51	0.135	11.1 ^{+0.1} _{-0.2}	...	109 ⁺¹⁰⁴ ₋₁₁₉	0.11	23.4	24.9	23.4	23.4
J080724+200608	81	08:07:24.46	+20:06:08	0.066	10.4 ^{+0.1} _{-0.1}	4.60	340 ⁺⁵³ ₋₄₇	0.12	24.0	23.4	23.1	22.4
J081603+193643	98	08:16:03.15	+19:36:43	0.113	10.6 ^{+0.1} _{-0.1}	2.79	61 ⁺³² ₋₁₆	0.17	23.5	23.5	23.4	24.8
J084545+200610	142	08:45:45.38	+20:06:10	0.123	10.6 ^{+0.1} _{-0.1}	...	78 ⁺⁸³ ₋₅₁	0.27	23.1	23.4	23.4	22.2
J085357+031034	157	08:53:56.81	+03:10:33	0.129	11.0 ^{+0.1} _{-0.1}	4.14	52 ⁺¹⁹⁸ ₋₂₃₈	0.20	23.4	23.4	23.8	22.4
J085943+100644	169	08:59:42.62	+10:06:43	0.054	10.8 ^{+0.1} _{-0.1}	4.40	306 ⁺⁶⁷ ₋₄₃	0.07	23.6	23.6	23.4	24.9
J091407+375310	186	09:14:07.22	+37:53:09	0.072	10.6 ^{+0.1} _{-0.1}	3.58	127 ⁺⁸⁷ ₋₈₂	0.28	23.5	23.4	23.4	22.5
J091850+420044	191	09:18:49.99	+42:00:43	0.041	10.4 ^{+0.0} _{-0.1}	4.99	490 ⁺⁹⁹ ₋₇₄	0.03	23.4	23.4	23.4	22.4
J092518+062334	200	09:25:18.31	+06:23:34	0.075	10.8 ^{+0.1} _{-0.2}	3.75	171 ⁺¹⁴⁶ ₋₇₆	0.10	23.4	23.4	23.4	22.5
J092820+074159	209	09:28:19.53	+07:41:58	0.105	10.2 ^{+0.2} _{-0.1}	2.25	-4 ⁺⁴ ₋₅	0.30	23.4	23.5	23.4	23.4
J093820+181953	224	09:38:19.87	+18:19:52	0.089	10.8 ^{+0.0} _{-0.2}	4.61	197 ⁺⁵⁵ ₋₁₀₉	0.27	23.4	23.9	23.2	22.2
J095750-001239	253	09:57:49.54	-00:12:39	0.033	10.2 ^{+0.1} _{-0.2}	4.48	381 ⁺⁵⁹ ₋₅₉	0.07	23.3	23.3	23.4	24.8
J100829+191620	268	10:08:28.73	+19:16:19	0.182	11.2 ^{+0.1} _{-0.1}	2.87	166 ⁺³³⁹ ₋₁₀₈	0.20	23.2	23.3	23.3	22.3
J100848+512353	270	10:08:47.69	+51:23:52	0.156	10.7 ^{+0.1} _{-0.1}	2.34	-94 ⁺¹⁴⁷ ₋₁₆₂	0.33	23.4	23.4	23.3	22.5
J102653+434008	305	10:26:53.35	+43:40:08	0.105	10.6 ^{+0.0} _{-0.1}	...	60 ⁺¹⁸ ₋₂₅	0.24	23.6	23.4	23.4	22.4
J102826+573609	308	10:28:25.80	+57:36:09	0.073	10.7 ^{+0.1} _{-0.1}	3.23	-13 ⁺²⁶ ₋₁₄₈	0.34	23.4	23.4	23.4	22.5
J103135+054057	322	10:31:34.85	+05:40:57	0.163	10.9 ^{+0.1} _{-0.1}	4.02	142 ⁺⁴² ₋₃₈	0.33	23.4	24.7	23.4	23.3
J105751+055447	365	10:57:51.07	+05:54:46	0.054	10.2 ^{+0.1} _{-0.1}	3.24	23 ⁺⁵⁶ ₋₂₁	0.17	23.4	23.4	23.4	24.7
J112619+191329	437	11:26:19.44	+19:13:29	0.103	10.4 ^{+0.0} _{-0.1}	2.70	-84 ⁺²⁵ ₋₁₂₅	0.45	23.4	23.4	23.5	22.2
J124822+551452	619	12:48:22.17	+55:14:52	0.083	11.0 ^{+0.1} _{-0.1}	...	433 ⁺⁵³¹ ₋₂₇₀	0.13	23.5	23.5	23.5	22.4
J133953+442237	711	13:39:53.19	+44:22:36	0.063	10.5 ^{+0.2} _{-0.1}	5.10	211 ⁺⁴¹⁸ ₋₁₆₆	0.24	23.4	23.4	23.4	22.3
J150619+080642	862	15:06:19.17	+08:06:42	0.040	10.2 ^{+0.1} _{-0.1}	...	4 ⁺⁸ ₋₁₀	0.07	23.5	24.9	23.8	23.5
J164504+304802	1014	16:45:03.79	+30:48:02	0.059	10.1 ^{+0.0} _{-0.0}	4.74	258 ⁺⁴⁹⁸ ₋₂₀₃	0.19	23.4	22.3	23.4	23.4

Note. Column (1): IAU name. Column (2): ID in the SPOG sample catalog from Alatalo et al. (2016a, Table 1). Columns (3) and (4): J2000 coordinates. Column (5): SDSS spectroscopic redshift. Column (6): stellar mass from the Chang et al. (2015) catalog. Column (7): NUV-*r* color, where the galaxy is detected with GALEX. Column (8): PSB age from French et al. (2018, Table 2). Column (9): molecular gas fraction from Alatalo et al. (2016b, Table 3). Columns (10)–(13): 1σ sky background flux of HST F438W, F814W, F160W, and SDSS *i*-band imaging, respectively, in AB mag arcsec⁻².

2. Cross-match this selection with HSC to find HST observations, using a coordinate search with a 1.5'' search radius; this resulted in 7046 galaxies.
3. Cross-match with SDSS Data Release 12 (DR12; Alam et al. 2015) using a 1.5'' coordinate search; this still leaves 7046 galaxies.
4. The SDSS DR12 photometric catalog has already been coordinate-matched to the GALEX DR7 catalog with a 5'' search radius with multiple matches for each object (Budavári et al. 2009). Select the closest GALEX object to each SDSS object.
5. Select objects with NUV S/N > 3; this leaves 1669 galaxies.

We then looked at the NUV-*r* color distribution of the remaining 1669 comparison sample candidates, shown in Figure 3. There is a clear bimodality around NUV-*r* $\approx$ 4.3, consistent with the NUV-*r* $\approx$ 4.5 cut used in Kaviraj et al. (2007b) and Kaviraj (2009) to distinguish SFGs and QGs. However, there is some contamination from the star-forming population into the high NUV-*r* tail and vice versa (Kaviraj et al. 2007b). To avoid potential contamination from dusty and “green-valley” galaxies, we identified galaxies as star-forming

with NUV-*r* < 3.5 and quiescent with NUV-*r* > 5.0. This resulted in 492 QGs and 759 SFGs.

Finally, we selected HST observations that have imaging in the F814W filter, to ensure a consistent comparison to the HST-SPOG sample. The number of galaxies with F438W, F814W, and F160W observations was too small to create a robust three-color comparison sample. For the F814W observations, we required that the exposure time is sufficient to obtain equal or better depth to the HST-SPOG snapshot observations. After trying different exposure time cuts, we limited the exposure time to 500, 1500, and 1500 s for ACS, WFC3, and WFPC2 observations, respectively.

After this cut, we obtained 186 quiescent and 220 star-forming galaxies with stellar masses, spectroscopic redshifts, and deep HST F814W and SDSS *i*-band observations.

We examined each cutout visually. Since the selected galaxies were often simply foreground or background objects and not the primary targets of the HST program, some galaxies were located on the image edges and therefore did not have reliable imaging data. Moreover, some galaxies were contaminated by a foreground object, and some galaxies in the star-forming sample were ongoing mergers.

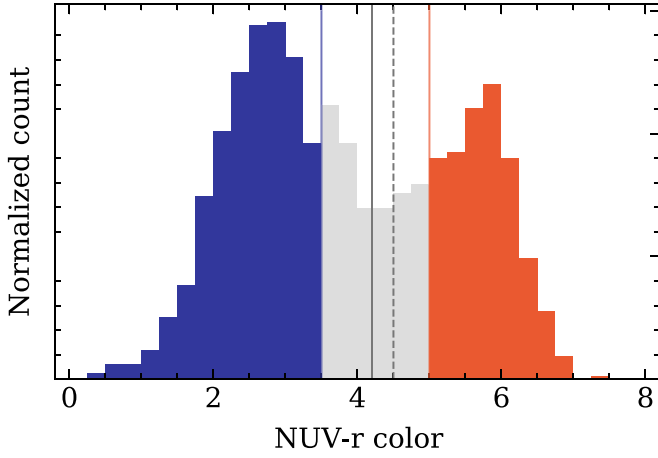


Figure 3. The distribution of GALEX NUV-SDSS r colors of the 1,669 comparison sample candidates shows a clear bimodality. The approximate minimum of the distribution is at $\text{NUV}-r = 4.2$ (solid gray line). The dashed gray line shows $\text{NUV}-r = 4.5$, used in Kaviraj et al. (2007b) and Kaviraj (2009). The blue and red regions indicate the cuts we used to select SFGs and QGs, respectively.

As mentioned above, the purpose of these comparison samples is to calibrate morphology metrics of HST-SPOGs against regular galaxies. Therefore, we removed any significantly disturbed galaxies from the calibration samples (i.e., those with clear companion, foreground, or background contamination, or significant “train-wreck” tidal features). We note that in this way our comparison sample is different from the general galaxy population, as in general $\sim 3\%$ of low-redshift galaxies are expected to be major mergers (visual classification; Darg et al. 2010). This construction of the comparison sample enables us to predict the *absolute* fraction of disturbed galaxies in the HST-SPOG sample, rather than that relative to the general population. While we cannot tell whether mergers are *more common* in HST-SPOGs than in the field, we can estimate the *absolute* fraction of disturbed galaxies in HST-SPOGs and use this to compare to merger fractions from other studies (e.g., Ellison et al. 2008; Darg et al. 2010; Patton et al. 2011; Willett et al. 2013; Casteels et al. 2014; Man et al. 2016). We removed 5 galaxies that had an extremely nearby companion, making distinguishing them challenging; 124 galaxies that either were on the edge of the image or had insufficient depth in the image region in which the galaxy was located; and 16 clear mergers, which agrees well with the $\sim 3\%$ major merger fraction in the field.

The remaining 138 QGs and 157 SFGs formed a pool of our comparison sample candidates. The stellar mass and redshift distributions of the comparison sample candidates and HST-SPOGs are shown in Figure 4. Note the lack of low-mass, higher-redshift quiescent galaxies, which are more difficult to detect and hence rarer. We then selected the comparison sample by finding one quiescent and one star-forming galaxy that optimally matched each HST-SPOG in terms of stellar mass and redshift.

In general, it is possible that one comparison galaxy is the best match for more than one HST-SPOG. A repeated comparison galaxy is particularly likely in regions where no good matches are available, such as in the low-mass quiescent regime. It is preferable to avoid using one comparison galaxy for more than one HST-SPOG to avoid correlations in our analysis. Therefore, instead of simply matching each HST-SPOG to its closest comparison candidate, we used an

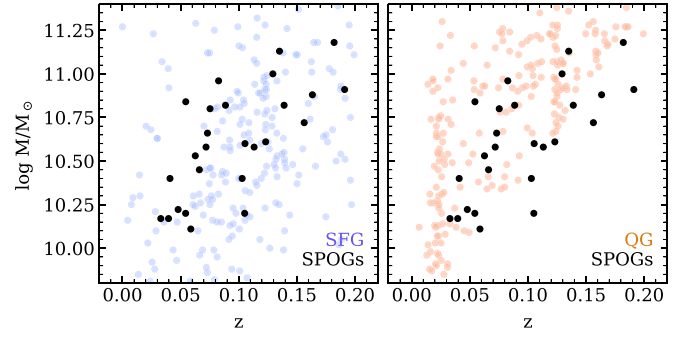


Figure 4. Mass and redshift distribution of the candidate comparison galaxies and HST-SPOGs (black). Left: candidate star-forming galaxies (blue). Right: candidate quiescent galaxies (orange).

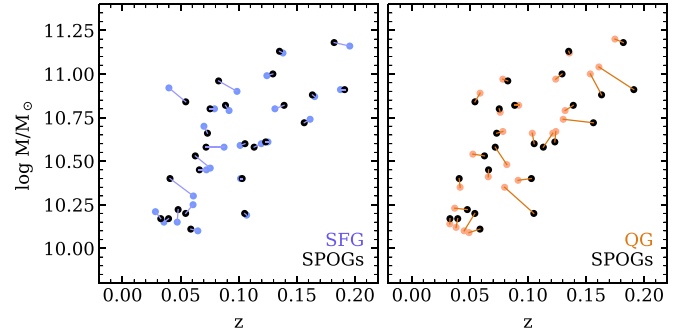


Figure 5. Mass and redshift distribution of the selected comparison galaxies and HST-SPOGs (black). Left: comparison star-forming galaxies (blue). Right: comparison quiescent galaxies (orange). Solid lines connect a comparison galaxy to its corresponding HST-SPOG.

algorithm to minimize the *total* difference in mass and redshift across all matches.

This problem is solved by the “Hungarian algorithm” (Kuhn 1955). Historically, this algorithm was developed to assign N tasks to N choices of people in a way to optimize the total cost to perform the tasks. The Python implementation of the Hungarian algorithm in the SciPy library allows doing this for an unequal number of tasks N and choices M , as long as $N > M$. This is done using an $N \times M$ cost matrix D , where D_{ij} corresponds to performing the i th task by the j th person.

In this case, we needed to assign N available comparison candidates (quiescent or star-forming) to M HST-SPOGs, where $N > M$. We did this so as to minimize the total distance (i.e., cost matrix) in the mass and redshift space. We calculated D_{ij} as the normalized distance in redshift and logarithmic mass space:

$$D_{ij} = \sqrt{\left(\frac{\log M_i^c - \log M_j^s}{\sigma_{\log M, s}} \right)^2 + \left(\frac{z_i^c - z_j^s}{\sigma_{z, s}} \right)^2}, \quad (1)$$

where, for the pair of a comparison galaxy i and an HST-SPOG j , $\log M_i^c$ and $\log M_j^s$ are the stellar mass logarithms and z_i^c and z_j^s are the redshifts. $\sigma_{\log M, s}$ and $\sigma_{z, s}$ are the standard deviation of the stellar masses and redshifts in the HST-SPOG sample used for normalization.

We assigned the comparison sample galaxies to each HST-SPOG so as to minimize the total cost function. The resulting samples of comparison QGs and SFGs, with pair-wise assignment to the HST-SPOG sample, are shown in Figure 5.

As mentioned above, finding perfect matches for high-redshift, low-mass SPOGs was challenging, especially among

the quiescent population. Our comparison QG sample generally has slightly larger masses and lower redshifts than the HST-SPOG sample. However, the difference is not significant: all of HST-SPOG, SFG, and QG samples have average mass $\log M_*/M_\odot = 10.6^{+0.4}_{-0.3}$ and redshift $z = 0.08^{+0.05}_{-0.03}$, where the uncertainties represent the 16th/84th percentiles of the median of each distribution after bootstrapping the distributions 10,000 times.

3. Data Preparation

The SDSS observations were obtained from the SDSS Science Archive Server,¹³ and HST observations were obtained from the Mikulski Archive for Space Telescopes (MAST).¹⁴ Both SDSS and HST images were reduced by the standard pipelines before being uploaded to the archive, as described on the Hubble Legacy Archive¹⁵ for HST and in Stoughton et al. (2002) for SDSS.

For both the HST-SPOGs and the comparison samples, we created cutouts of HST and SDSS imaging centered on each galaxy. We used the galaxy Petrosian radius R_p (Petrosian 1976) obtained from the SDSS photometric catalog and created a cutout with a size of $3R_p$. For some galaxies, the Petrosian radius estimate was incorrect, in which case we manually input a radius that produced a good cutout.

3.1. Snapshot HST Imaging

The HST observations of 26 CO-detected SPOGs were obtained in a snapshot program (Proposal 14649; PI: Alatalo). For each galaxy, a single exposure was taken with F438W, F814W, and F160W filters. The average image depth for each filter is given in Table 1.

Since only single exposures were taken, the standard pipeline reduction did not remove cosmic rays in F438W and F814W exposures, so cosmic rays were subsequently detected and interpolated over using the Python implementation of the LACosmic algorithm¹⁶ (van Dokkum 2001). Since F160W exposures were taken in MULTIACCUM mode, subsequent frames were used in cosmic-ray rejection for the F160W data, and additional processing was not required.

F814W and F438W imaging has a finer pixel scale of $0''.039$ compared to the $0.128''$ pixel scale of F160W observations. To generate false-color images and to compute galaxy $B-H$ and $I-H$ colors, we reprojected the F160W imaging onto the finer grid using the `reproject` package. We chose to reproject H -band data onto the finer grid of I - and B -band data because we did not perform any quantitative analysis on the color images that would require minimizing the interpolation error, and the finer grid allowed us to highlight small features in the false-color imaging.

Figure 6 shows the false-color thumbnails of the HST-SPOG sample constructed with HST F160W, F814W, and F438W imaging as red, green, and blue channels, respectively. All images are scaled with an inverse hyperbolic sine scaling to highlight faint features, and an unsharp mask was applied for contrast. The galaxies are grouped visually as described in Section 5.1. The image of galaxy B2 is contaminated by an

artifact in F814W and F438W imaging, masked in further analysis.

Figure 7 shows HST and SDSS thumbnails of an example HST-SPOG and its matched comparison star-forming and quiescent galaxies. The HST image of the HST-SPOG is created the same way as in Figure 6. All three thumbnails are scaled to the same size, given by $1.5R_p$ of the HST-SPOG, and rotated to align with the celestial north. The complete figure set showing similar plots for each HST-SPOG (26 images) is available in the online journal.

3.2. HST Background Subtraction

Archival HST imaging contains a large number of photon counts owing to the background sky emission. For the morphological analysis and consistency with SDSS imaging, we subtracted the mean sky background from the images.

We estimated the mean background level using a sigma-clipping technique. First, the mean and the standard deviation σ of all pixels are calculated. Then, pixels whose value exceeds 3σ are masked, and the standard deviation is computed again. This process is repeated until convergence, i.e., no additional pixels are masked.

The mean background level μ_{bg} and its standard deviation σ_{bg} are computed using the masked image. We then subtracted μ_{bg} from all image cutouts.

3.3. Comparison Sample and SPOG Depth Matching

As described in Section 2.2, we selected comparison galaxies that are as deep as or deeper than HST-SPOG HST imaging. To ensure a robust comparison, we then matched the depth of the comparison galaxy cutouts to the depth of HST-SPOG cutouts. The image limiting depth M_σ in magnitudes is then given as

$$M_\sigma = -2.5 \log \sigma_{bg} + ZP, \quad (2)$$

where ZP is the photometric zero-point of the image. Since the cutout size was $3R_p$, enough of the image did not contain any galaxy light above the noise limit to allow this calculation. We computed the average depth of HST-SPOG F814W imaging from individual σ_{bg} estimates to be $M_\sigma^s = 22.39 \pm 0.06$ mag arcsec⁻², so we chose to match all comparison HST observations to this depth.

Some comparison galaxies were located on the edges of the HST images, where the drizzled archival exposures were not aligned, so the effective image depth in those regions was shallower than the overall observation. We used the context information provided by the HST reduction pipeline to determine the region that has the same total exposure time as the comparison galaxy. We then only calculated the background noise in that region.

To match the image depth to the average depth of SPOG images, we then added extra white noise using a Gaussian white-noise distribution with a 0 mean and a standard deviation σ' given by

$$\sigma'^2 = \sigma^2 (10^{\frac{2(M_\sigma^c - M_\sigma^s)}{2.5}} - 1), \quad (3)$$

where M_σ^c is the comparison image depth and σ is the background standard deviation of the original comparison image.

¹³ SDSS DR16 Science Archive Server—dr16.sdss.org

¹⁴ MAST data access—archive.stsci.edu/access-mast-data

¹⁵ Hubble Legacy Archive—hla.stsci.edu

¹⁶ Astro-SCRAPPY—github.com/astrophy/astroscrappy



Figure 6. False-color images of 26 HST-SPOGs constructed using HST F160W, F814W, and F438W observations as red, blue, and green channels, respectively. The cutout size is $1.5R_p$ for each galaxy. The white bar shows a 5 kpc scale. The galaxies are grouped visually into four groups as described in Section 5.1: mergers (A), merger candidates/S(B)c spirals (B), edge-on dusty spirals (C), and other (D). F438W and F814W imaging of galaxy B2 is contaminated by an artifact.

3.4. Point-Spread Function

We used the point-spread function (PSF) of each image to ensure a robust morphological analysis and account for seeing effects. For HST imaging, we constructed a simulated PSF using the TinyTim software (Krist et al. 2011). For SDSS imaging, we used the empirical PSF measurements that are publicly available for each SDSS field on the SDSS Science Archive Server.

3.5. Image Segmentation

To analyze the galaxy morphology, we first needed to create segmentation maps showing which pixels belong to the galaxy object and which are background pixels or foreground/background objects. To do this, we adapted the segmentation routine from the `photutils` package (Bradley et al. 2020). The implementation of `photutils` closely matches that of

the `SEXTRACTOR` software (Bertin & Arnouts 1996) commonly used in similar applications.

A correct segmentation map identifying the galaxy is crucial to calculate robust morphological measurements. The aim is to exclude as many foreground and background objects as possible while including tidal or other disturbed features in the same galaxy map. This is challenging in practice, as separating overlapping distinct objects requires a high degree of deblending, which can also deblend the galaxy and its tidal features. We have specifically tuned our segmentation algorithm to maintain as many tidal features and removing foreground/background objects as strictly as possible. As a result, if a galaxy has merging companions or large star clusters, they will very likely be deblended and detected as a separate object. However, since we cannot tell whether an object is a companion or a foreground/background contaminant, we chose to remove all potential contaminants. This decreases the power of some morphological metrics that are

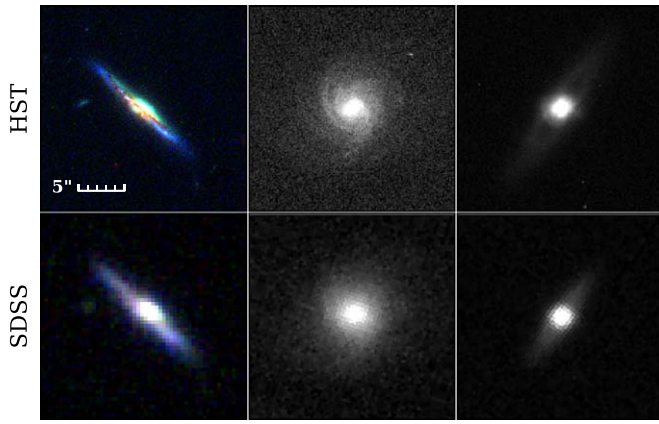


Figure 7. Thumbnails of an example HST-SPOG J102826+573609 (left) and its matched star-forming (center) and quiescent (right) galaxies using HST (top) and SDSS (bottom) imaging. All images are scaled to contain $1.5R_p$ of the HST-SPOG. False-color images for the HST-SPOG are constructed with HST F160W, F438W, and F438W and SDSS *gri* imaging. Similar figures for the remaining HST-SPOGs are provided in the online figure set (26 images).

(The complete figure set (26 images) is available.)

specifically tuned to look for doubly nucleated galaxies or enveloped companions (e.g., Gini and M_{20} ; Lotz et al. 2004) but does not affect the metrics that look for widespread disturbances, such as asymmetry.

The segmentation process can be adjusted using three main *photutils* input parameters: *NPIXELS*, the minimum region size in pixels; *NSIGMA*, the detection threshold in standard deviations; and *CONTRAST*, the flux contrast required to deblend two overlapping sources. Galametz et al. (2013) created galaxy segmentation maps with *SEXTRACTOR* by iterating the segmentation process twice, creating a “hot” segmentation map, identifying brightest regions, a “cold” map, identifying fainter features, and then combining the two. Similarly, we iterated the segmentation process three times in three different modes. Each time, we used a 2D top-hat smoothing kernel with a 5-pixel kernel size to smooth over the pixel-to-pixel noise. The input parameters used for each mode are given in Table 2.

Step 1: “hot” mode. First, we created a “hot” map to identify all bright objects in the image, using a 1-pixel minimum area, a large threshold S/N, and no deblending. The purpose of the “hot” mode is to detect bright contaminating sources in the image. Since the S/N threshold is high, separate objects are deblended by construction since we mask out the diffuse light that they may be enveloped in. This is shown as the white contours in Figure 8(b).

Step 2: “cool” mode. Second, we created a “cool” map with a 1σ threshold, 1 arcsec^2 minimum area, and a 10^{-6} deblending contrast. This selected extended objects in the image, each shown as differently colored regions in Figure 8(b). Note that the white contours are located inside the extended colored regions, indicating brightness peaks of the extended objects. We kept the minimum area large to avoid deblending the galaxy envelope, so not all faint background objects are detected in this pass.

Step 3. Mask contaminants. We then used the “hot” and “cool” maps to mask objects that do not belong to the central galaxy. First, we found the segment coinciding with the galaxy center and labeled it as the “main” segment, which is not

Table 2
Photutils Parameters Used in Producing the Galaxy Segmentation Maps

Parameter	“Hot” Mode	“Cool” Mode	“Cold” Mode
NSIGMA	97th percentile	1σ	1σ
NPIXELS	1 pixel	1 arcsec^2	$0.01R_p^2$
CONTRAST	...	10^{-6}	...
NLEVELS	...	32	...
MASK	Original	Original	Object mask
FILTER_KERNEL	Top-hat kernel with $R = 5$ pixels		

masked. Then, we masked all other “cool” segments that were sufficiently far away from the galaxy center, using threshold $R_{\text{thres}} = 2R_p$ shown as the dashed line in Figure 8(b). Finally, we needed to mask any contaminants that are near or embedded in the galaxy. We found all “hot” regions (other than the galaxy center) embedded in each “cool” region. Then, if the “cool” region covers more than 80% of any “hot” region, we masked it, since it contains a bright contaminant peak. This way, we masked all contaminant objects.

Step 4: “cold” mode. Finally, we ran a third segmentation algorithm, using the $0.01R_p^2$ as an area threshold, 1σ brightness threshold, the mask from step 2, and no deblending. Since we already masked contaminants near the center of the galaxy, deblending was not needed, as we can assume that all of the unmasked light belongs to the galaxy itself. We used a lower area threshold than in step 2 to finally detect all faint and small objects away from the galaxy center and mask them. The resulting segmentation map consisted of a large region corresponding to the galaxy of interest and small faint objects that have been missed by the “cool” mode earlier. We masked all regions except the central galaxy. Finally, we smoothed the galaxy segmentation map using a uniform filter equal to 10% of the image size to regularize it. This resulted in the final segmentation map, shown in Figure 8(c), and the corresponding final mask, shown in Figure 8(d).

Note that the final mask may overlap the final segmentation map (e.g., if a foreground star is embedded in the galaxy halo). Both the mask and the segmentation map are passed to any further analysis tool, so all masked regions are not considered in morphological analysis, even if embedded in the segmentation map.

4. Morphology Measurements

The morphological analysis of HST-SPOGs was carried out in three different ways: (1) visual analysis and description of the HST-SPOG snapshots in Section 5.1, (2) nonparametric analysis with a computational morphology code *STATMORPH*, and (3) parametric analysis using a Sérsic profile fitting tool *GALFIT*. Steps 2 and 3 were performed with HST F438W, F814W, and F160W imaging and SDSS *i*-band imaging of the HST-SPOG sample, as well as HST F814W and SDSS *i*-band imaging of the comparison samples.

Both *STATMORPH* and *GALFIT* allow the user to compute a large variety of morphological measurements. Detailed descriptions of all of the various parameters of *GALFIT* and *STATMORPH* can be found in Peng et al. (2002) and Rodriguez-Gomez et al. (2019), respectively. In the sections below, we define only the parameters used in this work.

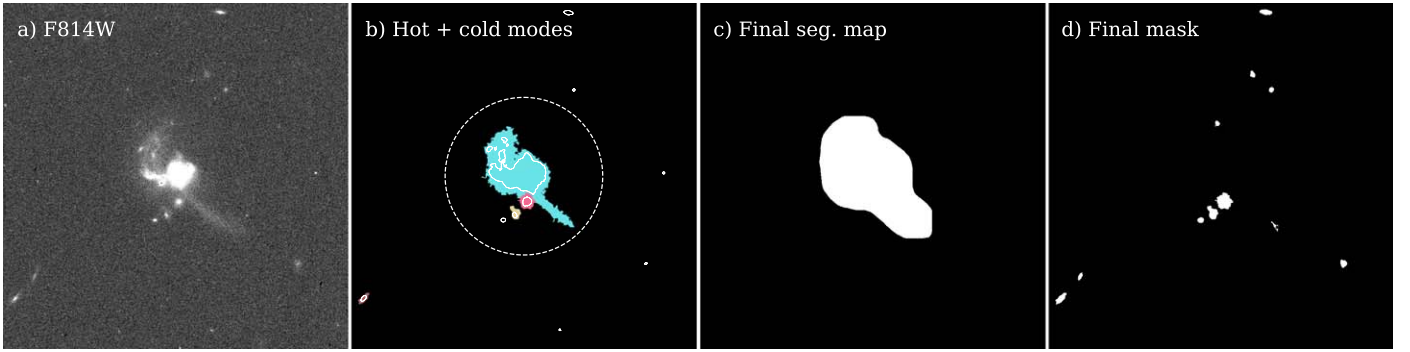


Figure 8. Example segmentation algorithm for F814W imaging of J112619+191329. (a) Original imaging; (b) the “cold” segmentation map with a random color scheme for distinct segments and “hot” contours overplotted in white; (c) the final galaxy segmentation map; (d) the mask containing all other contaminant objects. The dashed line in panel (b) shows a $2R_p$ radius used to exclude faint outer contaminants. The aim of the segmentation process is to deblend all potential contaminants from the galaxy envelope while keeping tidal features undeblended. Since it is challenging to determine whether a bright object is a contaminant or physically associated with the galaxy, we strictly remove all potential contaminants for purity. The detailed description of the algorithm and the implications for the morphological measurements are given in Section 3.5.

4.1. Nonparametric Morphology with STATMORPH

STATMORPH is an open-source nonparametric morphology calculation library. For every galaxy image, it computes a variety of morphology measurements, including Sérsic index and radius (Sérsic 1963), concentration, asymmetry, and smoothness (Conselice 2003); Gini and M_{20} (Lotz et al. 2004); multimode, intensity, and deviation (Freeman et al. 2013); and shape asymmetry (Pawlik et al. 2016). We note that there are subtleties in the computational methods of all morphological measurements, so it is crucial to be careful when comparing morphology values across studies that use different morphological software.

To run STATMORPH, we use the science image of the galaxy, its segmentation map (Section 3.5), and a mask identifying extraneous objects, bad pixels, and cosmic rays. In addition, STATMORPH convolves the model image with a PSF to improve the accuracy of the Sérsic fit. We supply the algorithm with the PSF computed in Section 3.4. Below are the parameters we used in this work that were obtained with STATMORPH.

4.1.1. Concentration

The concentration of a galaxy’s light distribution can be measured nonparametrically, without assuming a model for the distribution like a Sérsic profile. The most common way to measure concentration has been proposed by Bershady et al. (2000), where concentration (C) is defined as the ratio between the galaxy’s 80% and 20% circular isophotes:

$$C = 5 \log_{10} \frac{r_{80}}{r_{20}}, \quad (4)$$

where r_{80} and r_{20} contain 80% and 20% of the galaxy’s total flux, respectively. High values of concentration imply that these radii are nearby, and therefore most of the flux is constrained to the center. Galaxies with $C \approx 5$ have bulge-dominated morphologies and Sérsic indices $n \approx 4$.

However, since this measurement uses circular isophotes, it assumes a circular symmetry. It does not account for light distributions that are strongly edge-on or disturbed.

4.1.2. Asymmetry

The asymmetry of the galaxy’s light distribution can identify galaxies that are in ongoing mergers or that have post-merger signatures such as tidal tails and double nuclei. Asymmetry (A) is measured by rotating the galaxy image by 180° and subtracting the original and the rotated distributions (Schade et al. 1995; Abraham et al. 1996; Conselice 2003):

$$A = \frac{\sum_{ij} |F_{ij} - F_{ij}^{180}|}{\sum_{ij} |F|} - A_{bg}, \quad (5)$$

where F_{ij} is the flux in a given pixel, F_{ij}^{180} is the flux of the rotated image in the same pixel location, and A_{bg} is the asymmetry of the background. The center of rotation is chosen iteratively to minimize the A . Galaxies with $A > 0.1$ are generally highly asymmetric, although this depends strongly on image quality used in calculating asymmetry (Lotz et al. 2004). STATMORPH calculates asymmetry within $1.5R_p$, which may differ from other software implementations (e.g., $R_{\max}$ in Pawlik et al. 2016). The size of the aperture determines the contribution of the A_{bg} term, and therefore asymmetry values computed within larger radii will be smaller, even if other image parameters are the same.

4.1.3. Shape Asymmetry

Shape asymmetry A_S is computed the same way as asymmetry, except using the binary detection map identifying pixels belonging to a galaxy rather than the image itself (Pawlik et al. 2016). The shape asymmetry segmentation map aims to specifically detect faint and irregular features in the outer region on the galaxy and is not smoothed as much as the segmentation map described in Section 3.5. The detection map is calculated by STATMORPH and differs from the user-input segmentation map. The purpose of the shape asymmetry detection map is to pick out all faint and irregular features in the outer regions of the galaxy; therefore, they are created with less smoothing than segmentation maps described in Section 3.5.

Since A_S weights all galaxy pixels the same way, it is more sensitive to fainter tidal features rather than asymmetry in the galaxy center and can be a better metric to identify fading post-merger signatures. However, it is also extremely sensitive to

the way the detection map is computed and can be strongly affected by improper masking of contaminant objects or masking of galaxy’s tidal features during segmentation.

4.1.4. Half-light Radius

We used an elliptical half-light radius, $R_{0.5}$. First, the center of the galaxy is found so as to minimize its asymmetry, and then the semimajor axis of an ellipse containing 50% of the flux is used as $R_{0.5}$.

4.1.5. $G-M_{20}$ Bulge Strength and Disturbance

The Gini index (G) and M_{20} are both nonparametric measures of the concentration of a galaxy’s light. G measures how uneven the light distribution is without considering the location of the brightest pixels. Therefore, it is not sensitive to offset bright regions, unlike similar measurements (concentration or Sérsic index). On the other hand, M_{20} measures the distance of the brightest 20% of the light from the galaxy center and therefore is especially sensitive to noncentral bright regions.

When used in tandem, they can evaluate the degree of bulge strength and disturbance of a galaxy (Lotz et al. 2004; Snyder et al. 2015b; Rodriguez-Gomez et al. 2019; Sazonova et al. 2020). Regular late- or early-type galaxies lie along the “ $G-M_{20}$ main sequence.” Rodriguez-Gomez et al. (2019) define this sequence for galaxies with $\log_{10} M_*/M_\odot \approx 9.8-11.3$ and $z \approx 0.05$, which fits well the HST-SPOG sample. The main sequence is defined as

$$F(G, M_{20}) = -0.693M_{20} + 4.95G - 3.96. \quad (6)$$

Bulge-dominated galaxies have centrally concentrated light with a low G and low M_{20} , leading to a high F , while disks have diffuse light with bright offset knots of star formation, leading to a high G , high M_{20} , and low F . To avoid unnecessary abbreviations, we refer to $F(G, M_{20})$ as “ $G-M_{20}$ bulge strength” for the remainder of this paper.

Deviations from the “main sequence” can be indicative of disturbed features. For example, galaxies with a low G but a high M_{20} have highly concentrated bright regions that are off-center. This is typical of late-stage mergers with double nuclei (Snyder et al. 2015a). This disturbance is measured as the offset from the main sequence:

$$S(G, M_{20}) = 0.139M_{20} + 0.99G - 0.327; \quad (7)$$

we refer to $S(G, M_{20})$ as “ $G-M_{20}$ disturbance” for the remainder of this paper.

4.2. Sérsic Morphology with GALFIT

4.2.1. Sérsic Index

Sérsic radius and index (Sérsic 1963) are commonly used parametric measures of galaxy morphology. The galaxy’s light distribution can be approximately modeled by a Sérsic profile:

$$I(R) = I_{0.5} \exp \left\{ -b \left[\left(\frac{R}{R_{S,0.5}} \right)^{1/n} - 1 \right] \right\}, \quad (8)$$

where $R_{S,0.5}$ is the effective radius containing half of the total light, called the Sérsic radius; $I_{0.5}$ is the intensity at $R_{S,0.5}$; n is the Sérsic index; and b is a function of n computed via Gamma functions. In the local universe, elliptical galaxies are well

described by Sérsic indices $n = 4$ (de Vaucouleurs 1948), while spiral galaxies have $n = 1$ or an exponential profile (Freeman 1970). Previous studies show that, on average, PSBs have intermediate Sérsic indices, indicating an ongoing transition from a disk-like to a spheroidal morphology (Blake et al. 2004; Yang et al. 2004, 2008; Pawlik et al. 2016, 2018; Chen et al. 2019).

In addition to the Sérsic index and radius, Sérsic fitting produces estimates of the galactic center (center of the modeled light distribution), ellipticity, and orientation.

4.2.2. GALFIT

Although STATMORPH can perform one-component Sérsic fits, GALFIT (Peng et al. 2002) is a much more versatile tool to perform Sérsic modeling. Unlike STATMORPH, GALFIT allows the user to perform multicomponent fitting, as well as incorporating models other than the Sérsic one and various Fourier modes to capture perturbations in the galaxy light distribution.

However, the complexity of the optimization problem rises significantly when more components are added to the fit, so precise modeling of galaxy light requires manual inspection and careful choice of the initial parameter guesses. Instead, to ensure a robust comparison across the galaxies in the SPOG and comparison samples, we opted for using simpler models and using the residuals to characterize the disturbance.

We performed two different fits. First, we used a Sérsic fit on all HST and SDSS imaging. For the HST imaging of HST-SPOGs and comparison galaxies, we included a central Gaussian component with a varying size $\lambda_{\text{PSF}} \leq R \leq 2\lambda_{\text{PSF}}$ to model central emission. This is necessary because HST provides a high-enough spatial resolution for nearby galaxies that single- and two-component Sérsic fits are insufficient to model the complex galaxy substructures. In particular, many nearby galaxies require an additional compact central component to model the emission from the galaxy core (e.g., Peng et al. 2002). Excluding the central source leads to GALFIT overestimating the Sérsic index owing to the cuspy nuclear emission, and hence producing high residuals. We did not include this component in SDSS fits, as it is unnecessary for lower-resolution imaging. We used the results from the Sérsic fits (including the central component for HST imaging) to estimate the Sérsic index n for all galaxies in further analysis.

We then performed a multiple-component fit with a Sérsic disk ($n = 1$) and a bulge component ($n = 4$) and used this to calculate the bulge-to-total light ratio, B/T . Again, we included a Gaussian PSF component in HST imaging of HST-SPOGs and comparison galaxies. When calculating bulge-to-total light ratio, we added the Gaussian PSF flux to the bulge flux.

In general, galaxies consist of a disk and a bulge, so multicomponent fits perform better on data with high spatial resolution (Peng et al. 2002). Since our sample has a low redshift, the HST imaging has high enough resolution that two-component fits are better. SDSS imaging, on the other hand, has low resolution owing to atmospheric seeing, so two-component models overfit the data and single-component models perform better.

Finally, GALFIT reliability depends strongly on the initial guess passed by the user. We used the parameters from STATMORPH as the initial guess. During the multicomponent GALFIT routine, we fixed the central location of the

components to be the same to reduce the degrees of freedom of the fit. As mentioned above, Sérsic fitting produces estimates of the galaxy center, half-light radius, ellipticity, and orientation. However, these values are difficult to calculate in multi-component models, as they can differ for each model. Our sample contained very disturbed galaxies as seen in Figure 6, and even multicomponent models did not always provide good fits, so these estimates were not always representative of the galaxies' real properties. In further analysis (e.g., in measuring the residual flux fraction described below), we opted to use the nonparametric measurements of the galaxy center, half-light radius $R_{0.5}$, ellipticity, and orientation.

4.2.3. Bulge and Disk Decomposition

Multicomponent Sérsic fits can be performed to break the galaxy down into the bulge and the disk components. The bulge strength is then evaluated using the ratio of bulge to total light flux. In our analysis, we performed a GALFIT fit using an $n = 1$ exponential disk and $n = 4$ bulge (B) components. We then calculated the bulge-to-total ratio as

$$B/T = \frac{F_b}{F_t} = \frac{1}{1 + (F_b/F_d)^{-1}}, \quad (9)$$

where F_b and F_d are the model bulge and disk fluxes, respectively. F_t is the total flux contained in the model, not to be confused with the total galaxy flux. If a central PSF component is included in the fit, we set F_b to the combined flux of the bulge and the PSF components. Higher values of B/T correspond to more prominent bulge components, although some early-type S0 galaxies have weak bulges with B/T near 0 (Fraser-McKelvie et al. 2018).

4.2.4. Residual Flux Fraction

The residual flux fraction (RFF) measures the fraction of the total galaxy's flux that is not well fit by a Sérsic profile (Hoyos et al. 2011, 2012). It is calculated by performing the Sérsic fit and then subtracting the model from the original image, resulting in a residual image. The RFF is then given by

$$\text{RFF} = \frac{\sum |F^{\text{res}}| - 0.8 \times \sum \sigma_{bg}}{\sum F^{\text{model}}}, \quad (10)$$

where F^{res} is the residual flux, σ_{bg} is the standard deviation of the image, and F^{model} is the Sérsic model flux. The RFF is calculated using the absolute of the residual image, since the residual can be both positive and negative depending on whether the model under- or overfits the data. The background contribution to RFF is subtracted with the $0.8\sum\sigma_{bg}$ term, as described below.

We can break down the image flux at each pixel into the object flux, f^{sci} , and background flux, f^{bg} . Our aim is to subtract out the contribution of the background flux from the RFF measurement. Since the images are background subtracted as described in Section 3.2, the average background flux is 0 and f^{bg} follows a normal distribution: $f^{bg} \sim \mathcal{N}(0, \sigma_{bg})$.

For calculations involving the sum of flux from all pixels (such as photometry), the total flux is simply the total object flux, since the expected total background flux is

$$F_{bg} = \sum f_{bg} = N \langle f_{bg} \rangle = 0, \quad (11)$$

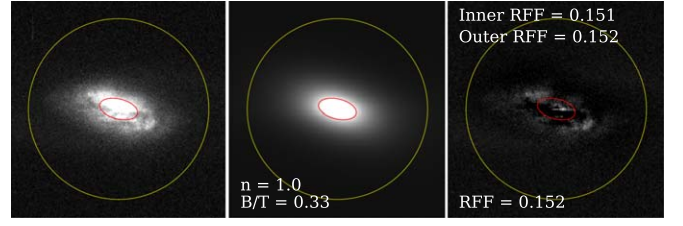


Figure 9. GALFIT analysis of an example HST-SPOG J091407+375310. Left: HST F814W image of the galaxy; center: GALFIT disk + bulge + PSF model described in Section 4.2.2; right: residual after the fit used to calculate the RFF. The yellow circle has radius $2R_p$ and shows the region where RFF is calculated. The red ellipse has the semimajor axis $R_{0.5}$ and shows the division between inner and outer RFF regions. Fit results for the remaining galaxies used in this paper are provided in the online figure set (208 images).

(The complete figure set (208 images) is available.)

where N is the number of pixels and $\langle f_{bg} \rangle$ is the expectation value of the background flux, 0.

However, for a sum of the *absolute* flux at each pixel,

$$|F_{bg}| = \sum |f_{bg}| = N \langle |f_{bg}| \rangle = 0.8N\sigma_{bg}, \quad (12)$$

which can be shown by integrating the Gaussian noise distribution. Therefore, we must subtract $0.8N\sigma_{bg}$, the background contribution to the RFF.

In this analysis, we constrain the RFF measurement to $2R_p$ around the galaxy center. This is different from the Kron radius used by Hoyos et al. (2011, 2012). We opted for the Petrosian radius, because it is robust to changes in redshift and is consistent with the radius used by nonparametric measurements from STATMORPH.

In addition, to differentiate the internal disturbance and tidal features, we calculated inner RFF_{in} and outer RFF_{out} . RFF_{in} is defined as the RFF within $R_{0.5}$, and RFF_{out} is defined as the RFF between $R_{0.5}$ and $2R_p$. We used the GALFIT fit with the lowest χ^2 (i.e., the best fit) to calculate the RFF for each image. An example of the GALFIT two-component fit, the residual, and the RFF calculation is shown in Figure 9. The online figure set shows the residuals for the remaining HST-SPOGs and comparison galaxies (208 images).

4.3. Color Gradients

Galaxy color gradients can be a powerful probe into the mechanism behind galaxy quenching and the direction it acts in (inside-out or outside-in), as well as into the distribution of the galaxy dust content that traces the molecular gas.

We measured $B-I$, $I-H$, and $B-H$ color gradients of HST-SPOGs using HST F438W, F814W, and F160W imaging. Since HST-SPOGs have different physical sizes, we computed color gradients as a function of $R_{0.5}$ instead of the galaxy physical size. We measured the average color in increments of $0.1R_{0.5}$ for $r \leq 2.5R_{0.5}$. At each radius r , we defined an elliptical annulus aperture around the galaxy center with bounding radii r and $r + 0.1R_{0.5}$, as well as the ellipticity and orientation given by the STATMORPH I -band fit. We computed the weighted median and 16th and 84th quantiles of the galaxy color in each aperture. We used flux S/N as a weight at each pixel. We then found the average color gradient of all HST-SPOG galaxies, normalized by $R_{0.5}$ of each galaxy.

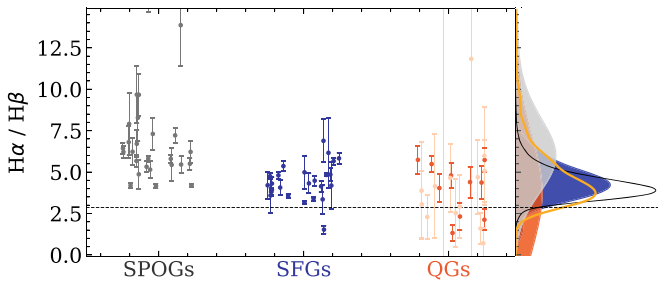


Figure 10. The distributions of the Balmer decrement in HST-SPOG (gray), star-forming (blue), and quiescent (orange) samples measured with the MPA-JHU emission line catalog. Left: distribution of individual galaxies including $H\alpha/H\beta$ uncertainties. Lighter-orange points are galaxies with $H\alpha$ or $H\beta$ $S/N < 3$. Right: overall distribution of each sample, smoothed with a Gaussian kernel. Solid black and yellow lines shows the distribution for the parent ELG and SPOG samples, respectively. The horizontal dashed line shows $H\alpha/H\beta = 2.86$, typical for star-forming regions (Osterbrock & Ferland 2006). The HST-SPOG sample shows significantly more dust extinction than either calibration and parent samples.

5. Results: Properties of HST-SPOGs

5.1. Visual Properties and Groups

We used HST imaging from Figure 6 to visually classify the HST-SPOG sample in four groups. Group A (7 galaxies) represents clear post-merger galaxies with disturbed morphologies. Group B (4 galaxies) are post-merger candidates identified by possible tidal arms, but they could also be Hubble type S(B)c galaxies with loose spiral arms. Group C (5 galaxies) contains disk-like galaxies with prominent dust lanes embedded in the disk. Finally, group D (10 galaxies) contains all “other” galaxies: they are mostly bulge-dominated, with dust-obscured nuclei but without clear dust lanes.

In Group A alone, 27% (7/26) of our sample are clear post-mergers. This fraction is significantly higher than the 1.5%–5% typical for nearby field galaxies (Darg et al. 2010) but lower than $\sim 50\%$ found for PSBs in previous studies (e.g., Pawlik et al. 2016; Chen et al. 2019), including the CO-SPOG parent sample (Alatalo et al. 2016b). Moreover, although Group A was selected as clear mergers, some of Group B galaxies are likely mergers (e.g., the features on B1 are likely tidal, and B4 has clear shells). Galaxies in Group D also show disturbed morphologies (D1, D3, D5, D8, D10). Under less conservative selection criteria, our sample contains at least 50% of post-merger candidates, consistent with $46\% \pm 7\%$ of the parent sample (Alatalo et al. 2016b). However, since the techniques used to identify disturbed galaxies in mergers across studies vary, comparing them directly is difficult, as discussed further in Section 7.2.

HST imaging reveals that the galaxies in this sample are very dusty. HST-SPOGs are CO selected and therefore have more molecular gas than the parent SPOG sample. Depletion timescales for molecular gas and dust are correlated (Michałowski et al. 2019; Li et al. 2019), so CO-rich PSBs are expected to also have more dust. Galaxies in Group C have clear dust lanes typical of edge-on spiral galaxies. Galaxies in other groups are primarily face-on, so such dust lanes would be less apparent. However, all galaxies still show significant amounts of dust obscuration. Galaxies outside of Group C appear to have unusual dust morphologies that lead to a disturbed appearance of the galaxies, e.g., D1 and D10. Disrupted dust morphology can be linked to a disturbed

molecular gas and possible outflows (e.g., Obied et al. 2016; Kaufman et al. 2020).

Finally, the galactic nuclei of all HST-SPOGs are visibly redder than the outer regions. This could imply an older stellar population in the center and an inside-out quenching mechanism. However, considering the high amount of dust attenuation, the red colors are likely caused by dust obscuration in the nucleus.

5.2. Dust Properties

To further quantify the dust content of our sample, we looked at the distribution of Balmer decrements in HST-SPOGs compared to the comparison samples. Figure 10 shows the comparison of $H\alpha/H\beta$ flux measured in the MPA-JHU catalog for HST-SPOG (gray), star-forming (blue), and quiescent (orange) samples, as well as for all ELG sample galaxies (solid black line). A typical star-forming region has $H\alpha/H\beta = 2.86$, while higher Balmer decrement values indicate dust extinction (Osterbrock & Ferland 2006). HST-SPOGs indeed show significantly higher Balmer decrements than other galaxies and therefore contain more dust, consistent with our visual inspection of the HST snapshots. Since Balmer decrements are obtained with SDSS spectroscopic observations, they are only computed for the inner $3''$ of the galaxy.

We then looked at $B-I$, $I-H$, and $B-H$ color gradients of HST-SPOGs, calculated as described in Section 4.3 and shown in Figure 11. Gray solid lines show the average radial color gradient of each HST-SPOG, and light-gray shaded areas show the 18th/84th quantiles of each gradient. Colored solid lines and shaded areas show the overall average gradient for the HST-SPOG sample and its 16th/84th quantiles, respectively.

HST-SPOGs generally have negative color gradients in the inner $R_{0.5}$, indicative of redder nuclei, although some galaxies have positive gradients. There is a much larger variance in $I-H$ and $B-I$ gradient in the outer $\sim 2-3R_{0.5}$: while the average gradient for most galaxies is flat, many galaxies show large scatter in the outer regions. However, this is likely caused by the difference in image depth between the three bands.

This result contradicts with previous studies of PSB galaxies, which generally show positive color gradients suggestive of outside-in quenching (e.g., Yang et al. 2008; Chen et al. 2019). However, our sample consists of younger PSBs that still contain dust. The color gradients may also be caused by a gradient in the dust content rather than in the stellar ages. Although we do not know the dust content in the outer regions of the galaxies, we know that the inner $3''$ of HST-SPOGs are more dust-obscured than for average galaxies (Figure 10).

5.3. Quantitative Morphology

As discussed above, HST-SPOGs are significantly dust-obscured, and their visual morphology depends strongly on the imaging wavelength. F160W imaging is infrared and therefore more transparent to dust, leading to fewer dust absorption features. Moreover, the structure of HST-SPOGs may differ in different bands, as they trace different stellar populations. Here, we compare the quantitative morphology in F160W, F438W, and F814W bands.

We measured all morphological parameters described in Section 4 using HST imaging. For each parameter in each band, we computed the median of that parameter’s distribution in the HST-SPOG sample. These results are shown in Table 3.

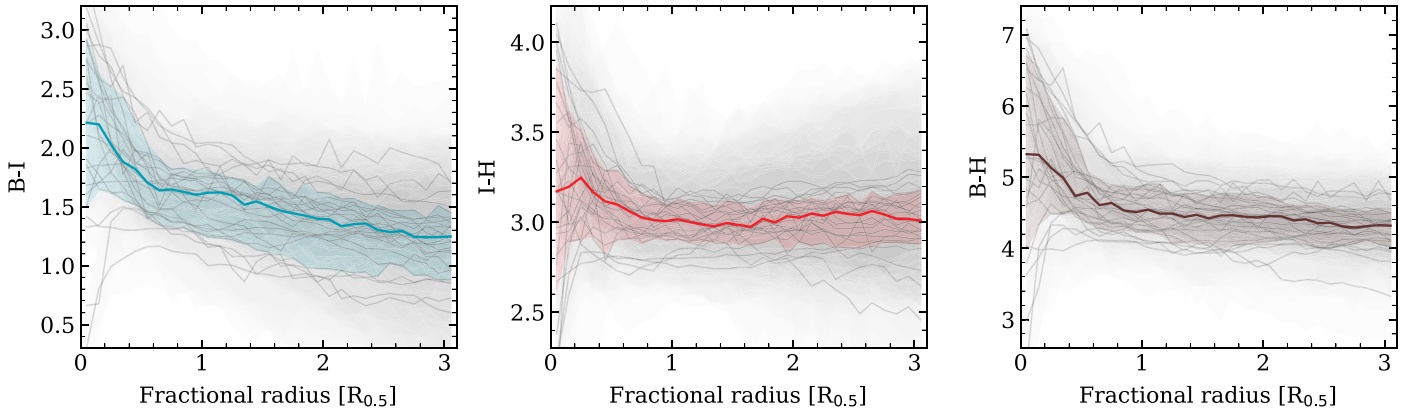


Figure 11. Gradients of $B-I$ (F438W–F814W; left), $I-H$ (F814W–F160W; center) and $B-H$ (F438W–F160W; right) colors of HST-SPOGs computed with HST imaging as described in Section 4.3. Gray solid lines show the color gradient of each HST-SPOG galaxy, normalized by $R_{0.5}$. Gray shaded areas show the 16th/84th quantiles of each galaxy’s color gradient. Colored solid lines and shaded regions show the median and the 16th/84th gradient quantiles for the entire HST-SPOG sample, respectively. HST-SPOGs generally have negative gradients in the inner $R_{0.5}$, i.e., redder nuclear regions.

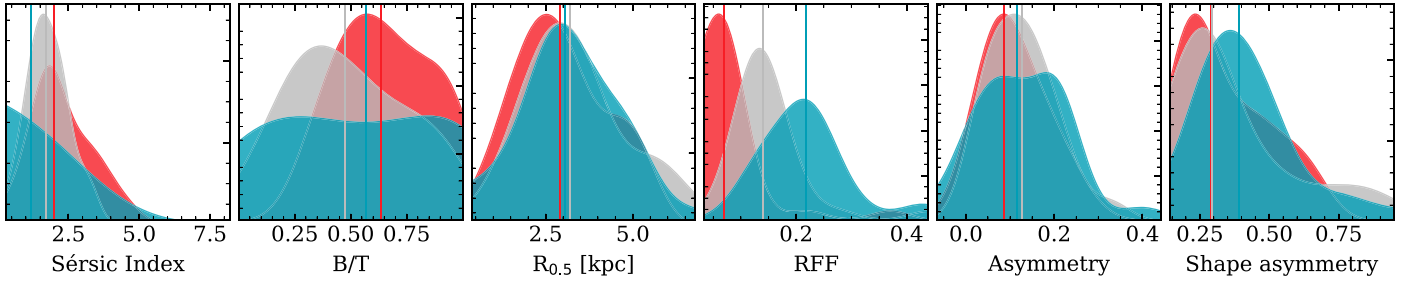


Figure 12. Distributions of morphological parameters for the HST-SPOG sample obtained with HST F160W (red), F814W (gray), and F438W (blue) imaging. Left to right, the parameters are Sérsic index, B/T , Sérsic $R_{0.5}$, RFF, asymmetry, and shape asymmetry. HST-SPOGs have slightly more bulge-dominated morphology in bluer bands and $>5\sigma$ higher RFF in bluer bands.

Table 3

Median Morphological Measurements for HST-SPOGs Measured with HST H -, I -, and B -band Imaging

	F160W	F814W	F438W
Structural			
Sérsic n	$1.98^{+0.35}_{-0.08}$	$1.70^{+0.22}_{-0.12}$	$1.18^{+0.41}_{-0.14}$
B/T	$0.64^{+0.07}_{-0.05}$	$0.47^{+0.03}_{-0.12}$	$0.57^{+0.09}_{-0.22}$
$R_{0.5}$ (kpc)	$2.92^{+0.15}_{-0.48}$	$3.21^{+0.36}_{-0.33}$	$3.06^{+0.46}_{-0.17}$
Disturbance			
Asymmetry	$0.09^{+0.04}_{-0.01}$	$0.13^{+0.01}_{-0.03}$	$0.12^{+0.05}_{-0.02}$
Shape asymmetry	$0.29^{+0.05}_{-0.05}$	$0.29^{+0.02}_{-0.03}$	$0.39^{+0.04}_{-0.04}$
RFF	$0.07^{+0.00}_{-0.01}$	$0.14^{+0.01}_{-0.01}$	$0.22^{+0.00}_{-0.01}$

Note. Uncertainties of the median are obtained via bootstrapping each sample 1000 times.

We calculated the uncertainty of the median by bootstrapping the sample 1000 times and finding the 16th and 84th percentiles of the bootstrapped medians.

Figure 12 shows the distributions of six of these parameters, going left to right: Sérsic index, B/T , $R_{0.5}$, RFF, asymmetry, and shape asymmetry. We chose this subset of parameters because it represents well the bulge strength, disturbance, and radius of a galaxy and is commonly used in literature. The distributions of the remaining parameters from Section 4 and the population medians are shown in Appendix B. The morphology measurements for each individual galaxy in each

filter are provided as an online data set with this paper, and an excerpt of the data is shown in Appendix A.

Each panel in Figure 12 shows the distribution of a morphological parameter measured with H -band (red), I -band (gray) and B -band (blue) imaging. Each distribution is smoothed with a kernel density estimate (KDE) of the underlying data with a bandwidth automatically selected using Scott’s rule of thumb (Scott 1992). Physical bounds on the KDE were enforced using renormalization (e.g., Sérsic $n > 0$). Solid red, gray, and blue lines show the medians of the corresponding distributions.

HST-SPOGs have intermediate bulge strengths, with average $n = 1.70^{+0.2}_{-0.1}$ and $B/T = 0.47^{+0.03}_{-0.12}$ in I band. They are slightly more bulge dominated in H band, with $n = 2.0^{+0.4}_{-0.1}$, and less bulge dominated in B band, with $n = 1.2^{+0.4}_{-0.1}$. This indicates that the central bulge is redder, while the disk is bluer, agreeing with the color gradients in Figure 11. We note that B/T is actually higher in B band than in I band, contradicting the other results slightly; however, the difference is well within the bootstrapped uncertainty.

HST-SPOGs have relatively high disturbance measurements. Their I -band asymmetry, shape asymmetry, and RFF are $0.13^{+0.01}_{-0.03}$, 0.29 ± 0.03 , and 0.14 ± 0.01 , respectively. While asymmetry and shape asymmetry do not vary much between the bands, RFF depends strongly on wavelength. H -band RFF is significantly lower ($0.07^{+0.00}_{-0.01}$) and B -band RFF is significantly higher ($0.22^{+0.00}_{-0.01}$). This indicates that disturbances are more apparent in bluer bands.

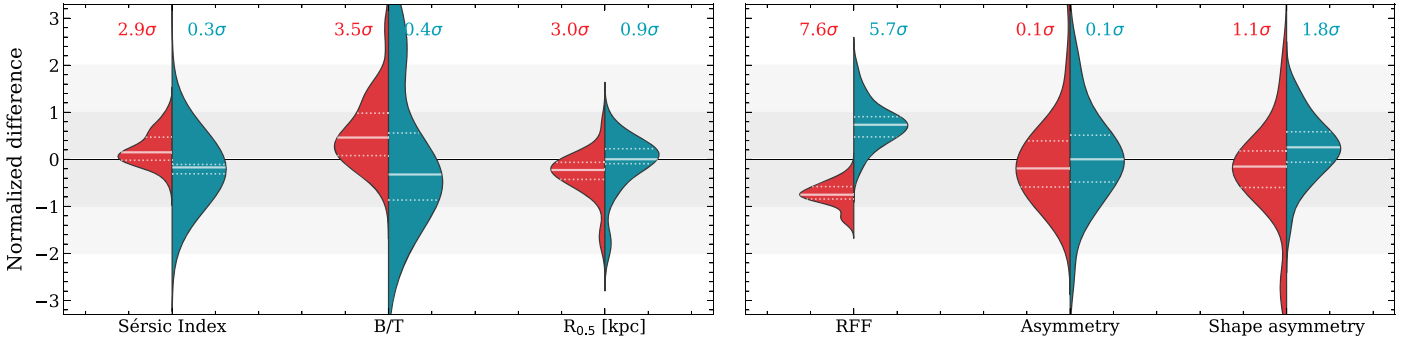


Figure 13. Distribution of difference in morphological parameters of HST-SPOGs between HST *I*- and *H*-band (red) and between *I*- and *B*-band (blue) imaging. The difference in a parameter P is computed as $P_H - P_I$ and $P_B - P_I$, respectively, using Equation (13). White solid and dashed lines show median and 16th/84th percentiles of each distribution, respectively. Significance levels are shown using a t -test comparison to a 0 mean difference. Higher red (blue) values mean that a parameter is higher in *H* (*B*) imaging than in *I* imaging. Left: difference in structural parameters, concentration, B/T , and $R_{0.5}$ showing that HST-SPOGs are more compact and bulge-dominated in redder bands. Right: difference in disturbance parameters RFF, $G - M_{20}$ disturbance, and shape asymmetry. HST-SPOGs are $>5\sigma$ more disturbed in bluer bands using RFF, but there is no difference in asymmetry or shape asymmetry.

5.4. Morphology Dependence on Wavelength

Population-level analysis is interesting in a statistical sense when characterizing a population; however, it is also useful to look at the difference in morphology between filters for each HST-SPOG individually. This can eliminate the scatter due to different morphologies present in our sample and show real wavelength-depending morphology trends, if any.

We take the *I*-band morphology as the baseline and look at the difference between the measurements in *I* and *H* bands and between those in *I* and *B* bands. We subtract each morphological parameter in *I* band, P_I , from a measurement in a different band, P_X , to find the difference ΔP_{X-I} , where X can be either *H* or *B*. We then look at the distribution of differences in the HST-SPOG sample. We normalize the difference by the overall standard deviation of this parameter in the sample across all wavelengths, σ_{all} :

$$\Delta P_{X-I} = \frac{P_X - P_I}{\sigma_{\text{all}}}. \quad (13)$$

The violin plots representing this difference are organized in the following way. Figure 13 shows the distribution of the difference in morphology between wavelengths for structural parameters (Sérsic index, B/T , $R_{0.5}$; left) and disturbance parameters (RFF, asymmetry, shape asymmetry; right). Each violin consists of two distributions: the difference between *H*- and *I*-band morphology (ΔP_{H-I} , red) and that between *B*- and *I*-band morphology (ΔP_{B-I} , blue). White solid and dashed lines show the median and 16th/84th quantiles of each distribution, respectively. Values above 0 in red (blue) distributions of a parameter indicate that *H* (*I*) imaging has a higher value of that parameter than *I*-band imaging.

In addition, we calculated the significance of the difference for each set of measurements. We performed a t -test to see whether the distribution is consistent with a mean difference of 0.

HST-SPOGs have similar morphology in *B* and *I* bands but are more bulge-dominated in the *H* band. Moreover, the *H*-band stellar distribution is 3σ more compact as measured by $R_{0.5}$. As discussed previously, our sample may have a younger stellar disk and an older bulge, resulting in a more disk-like morphology in bluer bands. However, our sample also likely has more central dust, obscuring the young stars in the central region. Even $R_{0.5}$ would not be able to distinguish these two scenarios, as the half-light radius would be lower if the center

was less dust-obscured. However, visually HST-SPOGs have a lot of dust substructure in the center (Figure 6), and HST-SPOGs have strong Balmer decrements indicative of dust (Figure 10), supporting the dust origin of the morphological differences.

HST-SPOGs have significantly higher RFF in bluer bands, but their asymmetry is consistent across all bands. Asymmetry is more sensitive to large asymmetric features, such as tidal structures, while RFF measures all deviation of light from a Sérsic distribution. This result implies that bluer imaging contains more internal, symmetric disturbances measured by RFF. On the other hand, global asymmetric features are well captured by asymmetry in all three bands. High RFF in the blue bands could be caused either by blue knots of star formation or by significant dust obscuration unseen in the *H* band. F160W imaging has a lower spatial resolution, which could lead to a lower RFF. However, F814W and F438W imaging has the same resolution, and RFF is significantly higher in F438W than in F814W, so the wavelength dependence of RFF across all bands is better explained by physical differences in dust or stellar populations than imaging effects.

5.5. Morphology as a Function of Age

We investigated the dependence of morphology on the PSB age. Figure 14 shows the PSB age (black/gray points) plotted against F814W asymmetry (left), F814W shape asymmetry (center), and visual group (right). The median age within each group is overplotted in red in the right panel, with associated 16th and 84th percentiles as error bars. The region with PSB age <200 Myr is shaded in gray.

Although the sample is small, there is a correlation between PSB age and asymmetry. For this analysis, we excluded the galaxy J093820+181953, as it is an apparent outlier in Figure 14 owing to its highly obscuring central dust lane. We then fit a straight line to the remaining data and found the correlation to be

$$A_{F814W} \approx 0.15 - 0.20 \left[\frac{\text{Age}}{\text{Gyr}} \right], \quad (14)$$

indicating that asymmetric features fade on timescales of ~ 750 Myr, similar to the typical range in PSB ages (e.g., Snyder et al. 2011; French et al. 2018). To quantify this correlation, we performed a Pearson's test by bootstrapping the sample 10,000

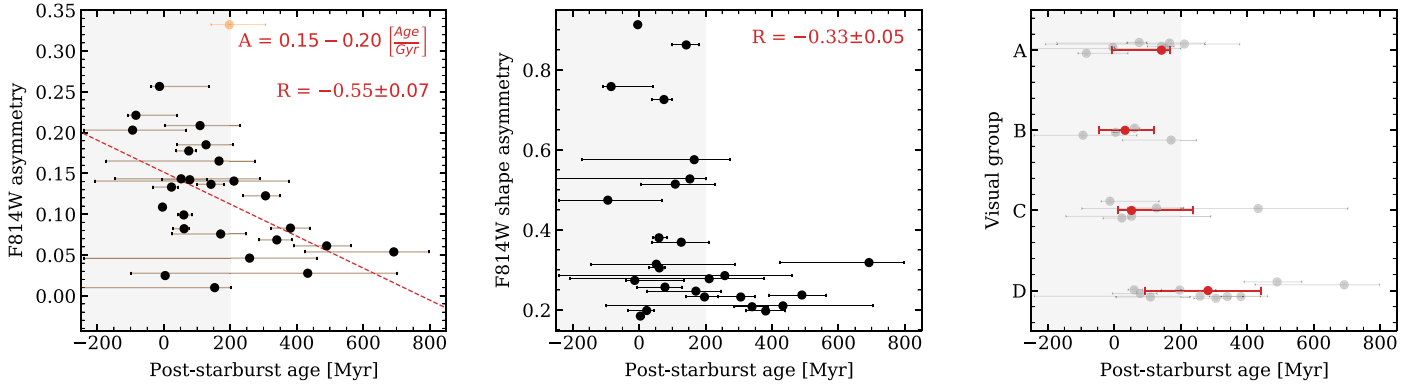


Figure 14. Left: the correlation between I -band asymmetry and PSB age. Negative ages indicate that a burst is ongoing. The red dashed line shows the line of best fit with Pearson $R = -0.55 \pm 0.07$, i.e., linear fit significance of 2.8σ . The error is given by bootstrapping the age uncertainties. The orange point is the J093820+181953 galaxy with a prominent dust lane, which was excluded as an outlier. Asymmetric features fade over ~ 750 Myr. Center: plot of I -band shape asymmetry against PSB age. There is no clear linear relationship, but only galaxies younger than 200 Myr have high values of A_s . Right: distribution of ages in different visual groups from Section 5.1 (gray). The median and 16th/84th percentiles in each group are shown in red. Galaxies in group D (no clear merger signatures or dust lanes) are, on average, older than any other group. The region with post-burst age < 200 Myr is shaded in gray in each panel.

times while varying the age measurements within their uncertainties and obtained $R = -0.55 \pm 0.07$. This corresponds to $p \approx 0.004$ or a 2.8σ significance. This correlation is marginally significant, as we are limited by the sample size and large age uncertainties, but much more significant than that found in Pawlik et al. (2016) using SDSS imaging.

Similarly, we looked at the relationship between shape asymmetry and PSB age. There is no clear linear trend, and Pearson correlation is $R = -0.32 \pm 0.05$, only 1.6σ significant. However, it is apparent that only galaxies with < 200 Myr post-burst age show high shape asymmetry and hence likely display tidal features. Previous simulations by Pawlik et al. (2018) and Snyder et al. (2015a) similarly show tidal merger signatures fading on the timescales of ~ 200 – 500 Myr, agreeing with our results.

In terms of our visual classification, there is no age difference between groups A, B, and C; group D galaxies are significantly older. Galaxies in groups A, B, and C are almost all younger than 200 Myr; group D galaxies are generally older than 200 Myr. This distinction implies that although groups A, B, and C appear visually different, they trace similar evolutionary stages of a PSB galaxy. On the other hand, group D contains only older PSBs. Group D galaxies were visually selected as those without clear disk morphology or disturbances, agreeing with the paradigm that low-redshift PSBs transition toward early-type morphologies.

6. Results: HST-SPOGs versus Comparison Galaxies

We compared the morphology of HST-SPOGs to that of the comparison SFG and QG samples. As stated in Section 2, we looked at the morphology of all galaxies in HST F814W imaging and corresponding SDSS i -band imaging. This section lists the numerical results of our analysis, while Section 7 discusses our important findings and their scientific implications.

6.1. Population-level Morphology

First, we looked at the morphological differences between HST-SPOGs, star-forming galaxies, and quiescent galaxies on the population level, similar to Section 5.3. For this analysis, we had six data samples: HST and SDSS imaging of HST-

SPOGs, SFGs, and QGs. For each morphological parameter from Section 4, we computed the median and the 16th/84th percentiles of that parameter’s distribution in each sample.

Figure 15 shows the distributions of these parameters, going left to right: Sérsic index, B/T , $R_{0.5}$, RFF, asymmetry, and shape asymmetry. The medians of these parameters in each sample are given in Table 4. The results for the remaining parameters described in Section 4 are shown in Appendix B. The morphology measurements for each galaxy from each sample are provided as an online data set with this paper.

The top half of Figure 15 shows the results using the HST F814W imaging; the bottom half, SDSS i -band imaging. In each half, the top panel shows the distribution of HST-SPOGs (gray) and SFGs (blue), and the bottom panel shows HST-SPOGs (gray) and QGs (orange). As in Section 5.3, each distribution is smoothed with a Gaussian KDE. The median of the distribution is shown as a labeled solid line, and the uncertainty of the median is shown as a shaded region around the median.

HST-SPOGs have intermediate bulge strengths, with average $n = 1.70^{+0.2}_{-0.1}$ and $B/T = 0.47^{+0.03}_{-0.12}$ in HST F814W imaging. This is between our star-forming and quiescent samples and consistent with other similar results by Blake et al. (2004), Pawlik et al. (2016), and Chen et al. (2019).

In both SDSS and HST imaging, the Sérsic index of PSBs is more similar to star-forming galaxies, indicating a stronger disk component. Interestingly, in HST imaging, the average B/T of our sample is closer to that of quiescent galaxies, and the effective radius in both data sets is also close to that of QGs. This indicates that although the overall morphology of HST-SPOGs may be disk-like, they host compact central bulges.

Finally, HST-SPOGs have significantly higher asymmetry ($0.13^{+0.01}_{-0.03}$) and RFF (0.14 ± 0.01) than either comparison sample when observed with HST. This indicates that HST-SPOGs are more disturbed than *regular* galaxies, although by construction of our comparison sample we cannot explicitly state that HST-SPOGs are more disturbed than *field* galaxies since we excluded mergers. When observed with SDSS, HST-SPOGs are more disturbed than QGs but not enough to distinguish them from regular SFGs. However, the distribution of shape asymmetry in HST-SPOGs is consistent with that of SFGs in both HST and SDSS imaging. The implications of this discrepancy are discussed in Section 7.3.

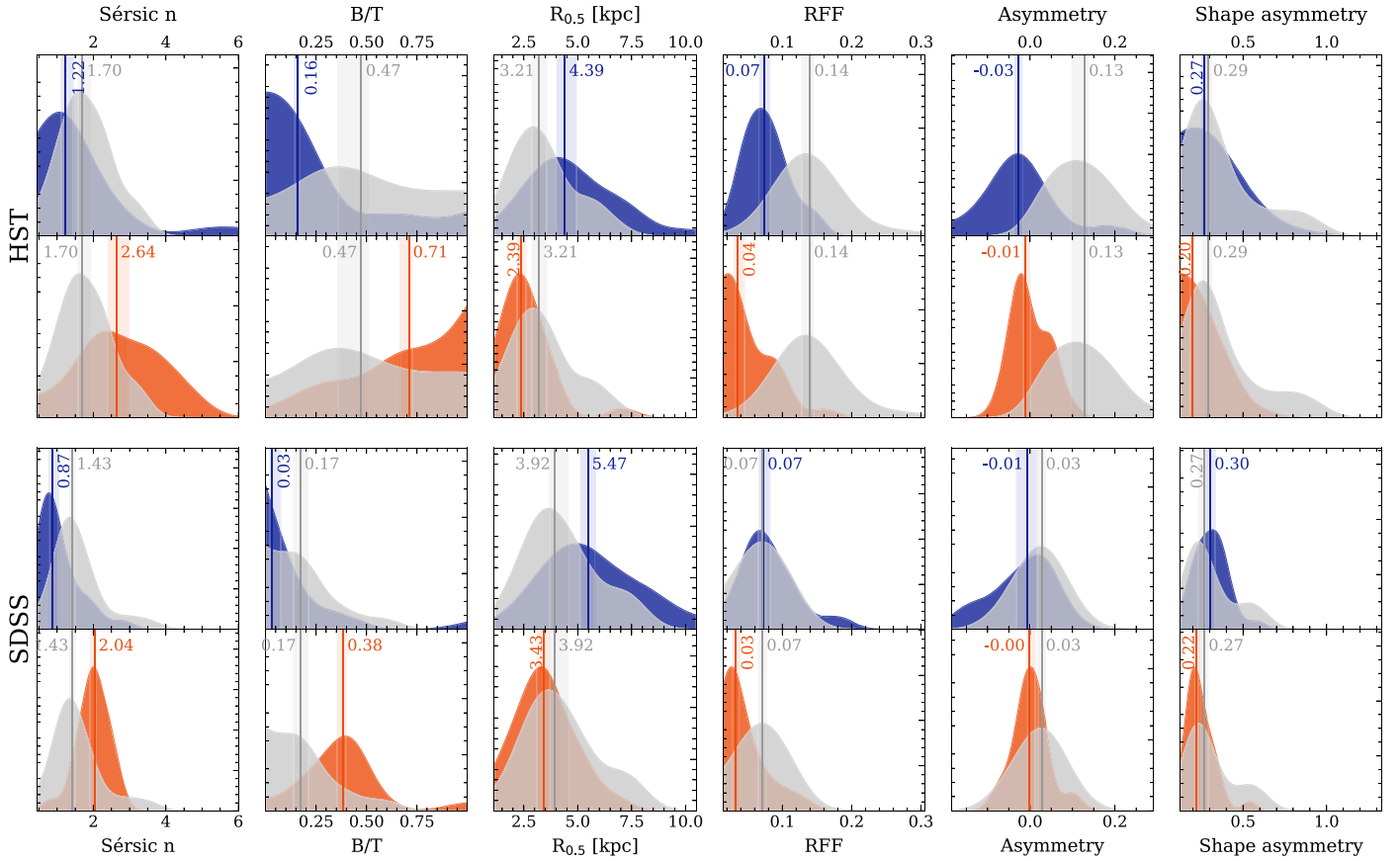


Figure 15. Distributions of morphological parameters for three samples: HST-SPOGs (gray), star-forming galaxies (blue), and quiescent galaxies (orange). Left to right, the parameters are Sérsic index, B/T , asymmetry, RFF, and Sérsic $R_{0.5}$. Parameters were computed using HST F814W imaging (top) and SDSS i -band imaging (bottom). HST-SPOGs are morphologically similar to SFGs when using SDSS imaging but show significantly more asymmetry and RFF in HST.

Table 4

Median Morphological Measurements for HST-SPOGs and Comparison Star-forming and Quiescent Galaxies, Calculated with HST F814W and SDSS i Band

Parameter	HST F814W			SDSS i Band		
	HST-SPOGs	SFGs	QGs	HST-SPOGs	SFGs	QGs
Structural Parameters						
Sérsic n	$1.70^{+0.22}_{-0.12}$	$1.22^{+0.23}_{-0.11}$	$2.64^{+0.34}_{-0.24}$	$1.43^{+0.07}_{-0.08}$	$0.87^{+0.18}_{-0.09}$	$2.04^{+0.03}_{-0.12}$
B/T	$0.47^{+0.03}_{-0.12}$	$0.16^{+0.01}_{-0.02}$	$0.71^{+0.02}_{-0.04}$	$0.17^{+0.04}_{-0.03}$	$0.03^{+0.04}_{-0.01}$	$0.38^{+0.01}_{-0.03}$
$R_{0.5}$ (kpc)	$3.21^{+0.36}_{-0.33}$	$4.39^{+0.54}_{-0.35}$	$2.39^{+0.22}_{-0.20}$	$3.92^{+0.63}_{-0.23}$	$5.47^{+0.36}_{-0.34}$	$3.43^{+0.26}_{-0.32}$
Disturbance Parameters						
Asymmetry	$0.13^{+0.01}_{-0.03}$	$-0.03^{+0.01}_{-0.01}$	$-0.01^{+0.01}_{-0.01}$	$0.03^{+0.01}_{-0.01}$	$-0.01^{+0.02}_{-0.03}$	$-0.00^{+0.01}_{-0.00}$
Shape asymmetry	$0.29^{+0.02}_{-0.03}$	$0.27^{+0.02}_{-0.02}$	$0.20^{+0.01}_{-0.01}$	$0.27^{+0.02}_{-0.04}$	$0.30^{+0.03}_{-0.02}$	$0.22^{+0.02}_{-0.00}$
RFF	$0.14^{+0.01}_{-0.01}$	$0.07^{+0.01}_{-0.01}$	$0.04^{+0.01}_{-0.01}$	$0.07^{+0.01}_{-0.01}$	$0.07^{+0.01}_{-0.01}$	$0.03^{+0.01}_{-0.00}$

6.2. Morphology of Matched Galaxies

Similarly to Section 5.4, we then looked at the difference in morphology between each HST-SPOG and a matched comparison galaxy. Morphological measurements depend on spatial resolution (e.g., Lotz et al. 2004). Lower-mass galaxies are smaller, and therefore identical imaging resolves larger physical scales in these galaxies. We eliminate this bias by comparing each HST-SPOG to a mass- and redshift-matched comparison galaxy.

For each morphological parameter P , we subtract the comparison measurement, P_{comp} , from the HST-SPOG measurement, $P_{\text{HST-SPOG}}$, to find the difference ΔP . We then

look at the distribution of differences in all samples. For each parameter and instrument sample, we normalize the difference by the overall standard deviation of this parameter in the entire data set, σ_{all} :

$$\Delta P = \frac{P_{\text{HST-SPOG}} - P_{\text{comp}}}{\sigma_{\text{all}}} \quad (15)$$

The violin plots in the following subsections are organized in the following way. Figures 16 and 17 show the distribution of difference ΔP between HST-SPOGs and matched comparison galaxies for disturbance and structural parameters, respectively.

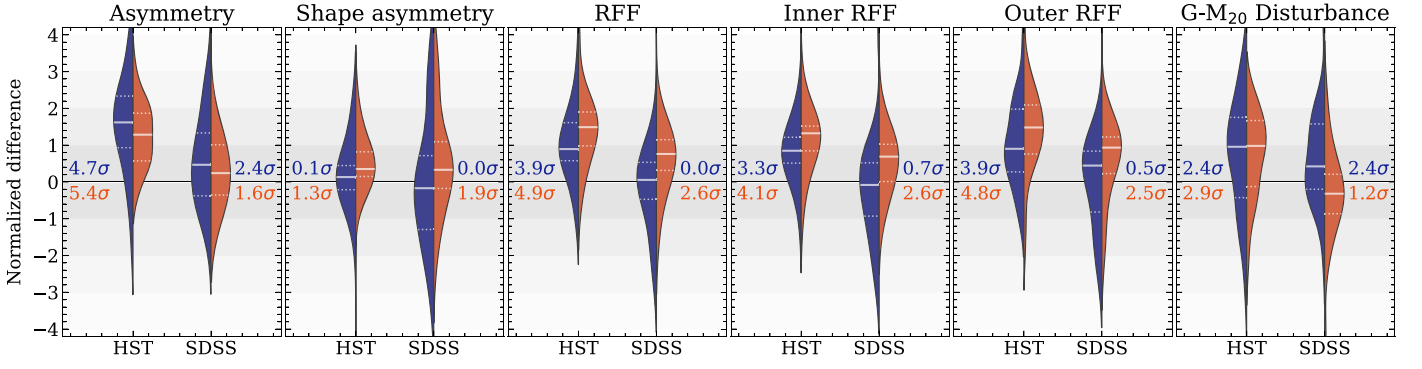


Figure 16. Distributions of difference in disturbance metrics of HST-SPOGs and comparison star-forming (blue) and quiescent (red) galaxies, as defined in Equation (15). Each panel shows the different distribution for a metric obtained with HST F814W imaging (left) and SDSS i -band imaging (right). Higher values in the blue (red) distribution mean that the HST-SPOG has higher disturbance values than the matched comparison SFG (QG). The white ticks in each violin show the median and $\pm 1\sigma$ of each distribution. Significance of the difference is calculated using a t -test comparison to a 0 mean difference. Using HST imaging, HST-SPOGs are more than 3σ more disturbed using most metrics. The difference in $G - M_{20}$ is marginally significant, and there is no difference in shape asymmetry. In SDSS, no parameter shows a significant difference.

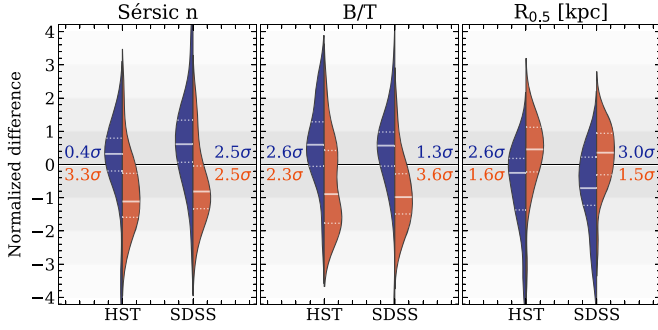


Figure 17. Same as Figure 16, showing the distribution of difference in n , B/T , and $R_{0.5}$ between HST-SPOGs, QGs, and SFGs. The comparison samples show an offset from each other, with quiescent galaxies having higher bulge strength in all parameters. HST-SPOGs lie in the intermediate morphology range and therefore show little offset from either sample, with slight preference toward disk-like morphologies seen in HST imaging.

Each panel contains two violins, showing the distribution of differences between HST-SPOGs and comparison galaxies with HST data (left) and SDSS data (right). Each violin consists of two halves: the difference between HST-SPOGs and SFGs (blue, left half) and between HST-SPOGs and QGs (orange, right half). We also calculated the significance of the difference for each set of measurements by performing a t -test, as in Section 5.3.

6.2.1. Disturbance

Figure 16 shows the distributions of the difference in disturbance between HST-SPOGs and comparison galaxies. Left to right, the panels show six measurements of disturbance: asymmetry, shape asymmetry, RFF, RFF_{in}, RFF_{out}, and $G-M_{20}$ disturbance.

In HST data, HST-SPOGs are more disturbed than SFGs and QGs at a higher than 3σ level using most parameters except $G-M_{20}$, disturbance, and shape asymmetry. On the other hand, no parameters show a significant difference in SDSS imaging. We computed the fraction of galaxies that are more disturbed than their comparison counterpart, using HST and SDSS imaging, shown in Table 5. We find that 85%–88% of HST-SPOGs are significantly more disturbed than comparison galaxies; however, this disturbance is only seen with high-resolution HST imaging and not with SDSS.

Table 5

Fraction of HST-SPOGs That Are More Disturbed Than Their Matched Comparison Galaxies

Parameter	SFGs		QGs		Both	
	HST	SDSS	HST	SDSS	HST	SDSS
Asymmetry	85%	65%	92%	62%	85%	50%
Shape asymmetry	62%	42%	88%	73%	58%	42%
RFF	88%	54%	92%	81%	88%	50%
RFF _{in}	92%	46%	92%	73%	88%	42%
RFF _{out}	85%	65%	92%	81%	81%	58%
G/M_{20} disturbance	73%	65%	69%	35%	58%	23%

On the other hand, only 65% of HST-SPOGs have a higher shape asymmetry than both comparison samples with HST. This is a relatively small fraction, considering that 50% would mean that two compared samples are consistent with each other. Although the fraction of HST-SPOGs with high A_S in HST imaging increased compared to 42% with SDSS imaging, this increase is smaller than for other disturbance parameters. This suggests that the increased resolution highlights *internal* disruptions, rather than obvious disturbances to a galaxy’s shape such as tidal tails. The implications of this for the origin of disturbances in HST-SPOGs are discussed in Section 7.3.

Finally, HST-SPOGs have only a marginally higher $G-M_{20}$ disturbance than comparison star-forming galaxies. $G-M_{20}$ is particularly sensitive to late-stage merger features such as double nuclei and enveloped companions, leading to high Gini and low M_{20} values. The efficacy of the $G-M_{20}$ metric on other disturbances, such as dust structures, was never tested, but the metric was not designed to detect them. Therefore, relatively normal $G-M_{20}$ values could be another indicator that the disturbance features are unlikely directly merger induced.

6.2.2. Bulge Strength and Radius

Figure 17 shows the difference in overall morphology between matched HST-SPOGs and comparison galaxies, similar to Section 6.2.1. We computed the difference for (left to right) Sérsic index n , bulge-to-total light ratio B/T , and half-light radius R_{50} . The other bulge strength parameters show the same trends and are omitted. As expected, there is a clear offset between star-forming galaxies (blue) and quiescent galaxies

(orange) in terms of bulge strength and radius. Quiescent galaxies have stronger bulges and are more compact than their star-forming counterparts. HST-SPOGs, as before, have intermediate morphology between the two comparison samples. As we discussed in Section 6.1, HST-SPOGs have disk-like Sérsic indices (with a 3.3σ deviation from QGs in HST) and disk-like B/T in SDSS imaging but not in HST data. However, HST-SPOGs are more compact than SFGs at 2.6σ in HST imaging and 3.0σ in SDSS imaging. The implications of their disk-like morphology with compact cores are discussed in Section 7.1.

7. Discussion

7.1. Transitioning from Late- to Early-type

In both Figures 15 and 17, we see that HST-SPOGs have an intermediate bulge strength between SFGs and QGs but are not significantly different from either sample, agreeing with previous studies (Blake et al. 2004; Pawlik et al. 2016; Chen et al. 2019). This suggests that HST-SPOGs are in the middle of their morphological transformation toward early-type galaxies, and therefore that this transformation occurs on the same timescales as the PSB phase. Moreover, in Figure 14 we found that galaxies visually identified as mergers or disks have post-burst ages <200 Myr (Figure 14), while galaxies with spheroidal morphologies are older than 200 Myr, providing another evidence for a morphological transition over the PSB lifetime.

Subtle differences in bulge strength metrics provide an interesting insight into the evolution of HST-SPOGs. Their Sérsic indices are more consistent with that of star-forming galaxies, but their compactness and B/T and $R_{0.5}$ are slightly more similar to that of quiescent galaxies. This difference indicates that HST-SPOGs may have a generally disk morphology with a bright, compact core, perhaps indicative of an ongoing starburst or an AGN.

In contrast, some other studies found that PSBs are more compact than QGs. Almaini et al. (2017) recently showed that high-redshift PSBs are extremely compact, indicative of a quenching mechanism that drives the gas inward and compactifies the galaxy. However, this discrepancy is unsurprising: high-redshift quenching events are expected to be more violent: galaxies are more gas-rich at $z > 1$ (e.g., Daddi et al. 2010), leading to highly dissipative wet mergers and disk instabilities that are extremely rare in the local universe (Hopkins et al. 2009; Dekel & Burkert 2013). Yang et al. (2008) found that HST-observed E+A galaxies have extremely high Sérsic indices, disagreeing with our results. However, they do not include a PSF component in their GALFIT model. HST imaging provides a sufficiently high resolution that the galaxy nucleus acts as a point source in most galaxies and needs to be fit with a separate component to obtain an accurate model. Without a PSF component, we obtain similarly high Sérsic indices for HST-SPOGs, as well as for comparison star-forming and quiescent galaxies, showing that these high Sérsic indices are unrealistic.

7.2. 88% of HST-SPOGs Have Fading Disturbances

In this work, we found that 88% of our HST-observed PSB galaxies are more disturbed than their comparison *regular* star-forming or quiescent galaxies. It is difficult to make a direct comparison of our sample to the general field galaxies, since

the techniques of identifying disturbed or merging galaxies differ across studies. Searches of close companions find much lower merger fractions in the field (2%–5%; e.g., Ellison et al. 2008; Patton et al. 2011; Man et al. 2016). Major merger fractions identified visually or using asymmetry in SDSS imaging are similar (1%–5%; Darg et al. 2010; Casteels et al. 2014). Galaxy Zoo 2 classifications, not aimed specifically to detect mergers, show that $\sim 20\%$ of local ($z < 0.03$) galaxies have “odd features” (rings, lenses, dust lanes, tidal features, and other irregularities; Willett et al. 2013), similar to those we detected in our work with asymmetry and RFF. These local objects are better resolved with SDSS, so they offer a reasonably good comparison to our analysis using higher-resolution HST imaging of more distant galaxies. The fraction of HST-SPOGs with detectable disturbances is still higher than the field average found by Willett et al. (2013). Overall, although a direct comparison to other studies is challenging, HST-SPOGs are clearly more disturbed than the general field population.

The disturbed fraction of HST-SPOGs is also significantly higher than the 30%–50% reported by previous studies of PSB galaxies (Blake et al. 2004; Goto 2005; Pawlik et al. 2016; Yang et al. 2008). However, all of these studies except Yang et al. (2008) were based on ground-based imaging from SDSS or older surveys. When using only SDSS *i*-band data, we similarly found that approximately 50% of HST-SPOGs are more disturbed than their comparison matches, while the other 50% are not. Therefore, it is very likely that the majority of PSB galaxies have disturbed morphologies, but many of these disturbances remain undetected by low-resolution ground-based surveys like SDSS. The disturbance features have smaller scales that are washed away by the atmospheric seeing and require higher-resolution imaging to detect.

The only study that used space-based imaging, Yang et al. (2008), analyzed 21 E+A galaxies and found that 11 have dramatic tidal features, leading to a 50% merger fraction, lower than the disturbance fraction we found. However, other galaxies in this sample exhibited disturbances such as bars and dust lanes and showed significant Sérsic residuals. Although these galaxies were not classified as mergers in Yang et al. (2008), they would likely be classified as disturbed in our analysis as long as they are more disturbed than similar comparison galaxies.

We also found a correlation between asymmetry and a PSB age: only PSBs with post-burst age $\lesssim 200$ Myr have a high shape asymmetry ($A_S > 0.3$), although most (85%) have a higher asymmetry than their matched comparison galaxies. An approximate linear regression showed that asymmetry will fade completely on timescales of ~ 750 Myr, comparable to the PSB phase lifetime (e.g., Snyder et al. 2011; French et al. 2018). Although the significance for this correlation is marginal (2.8σ), likely due to large uncertainties in PSB age estimates and a small sample size, it is much higher than that found in Pawlik et al. (2016) using SDSS imaging.

The correlation between asymmetry and the post-burst age can also explain the discrepancy between the disturbed fraction between our sample and that of other studies. Our sample is biased toward young PSBs: the SPOG sample is already younger on average than other PSB selections, such as E+As (Alatalo et al. 2016a; French et al. 2018). HST-SPOGs are expected to be even younger, as they are more gas- and dust-rich than the parent SPOG sample. Therefore, since we see that

asymmetry fades over time, we expect other selections of older PSBs to have lower disturbed fractions than HST-SPOGs. This is especially important if dust is indeed the cause of the high RFF we observed, since dust content decreases with PSB age (e.g., Smercina et al. 2018).

7.3. Are Post-starbursts Also Post-mergers?

The possible merger origin of PSB galaxies has been long debated in the field. Gas-rich mergers are an effective way to cause a starburst and subsequently quench star formation (e.g., Bekki et al. 2005) and are an important formation mechanism for PSB galaxies in simulations (Zheng et al. 2020; Lotz et al. 2021). Tidal features specifically are extremely common among PSB galaxies (e.g., 52% in Yang et al. 2008). Outside of clusters, tidal features can only be induced by galaxy interactions, so therefore mergers are a likely formation pathway in at least half of PSBs. However, the origin of the remaining half has historically been an unanswered question.

In our study, we evaluate the *disturbance* of HST-SPOGs, which is not equivalent to identifying merger signatures. Measures such as asymmetry and RFF simply detect deviations from a smooth stellar distribution. Such deviations can be caused by merger-induced tidal features but could also be due to spiral features, dust lanes, bars, etc. Recent works show that machine-learning-based approaches are better at specifically identifying galaxy mergers (e.g., Snyder et al. 2019; Ferreira et al. 2020). One morphology metric that less ambiguously detects post-mergers is shape asymmetry (Pawlik et al. 2016), which looks for deviations in a galaxy shape rather than light distribution and detects asymmetric tidal features, but detecting symmetric merger signatures without machine-learning methods remains a challenge.

While 88% of HST-SPOGs are more disturbed than comparison galaxies, only 65% have a higher shape asymmetry. Therefore, our sample is clearly highly disturbed, but the disturbances are not necessarily caused by tidal perturbations. Instead, we see that the disturbances are best captured by metrics of internal structure, such as RFF or asymmetry. Our results indicate that about 30% of HST-SPOGs are internally disturbed without significant tidal features. Similar results have been found in morphological studies of low-redshift AGN hosts. The majority of AGN hosts do not appear to have a merger origin (e.g., Grogin et al. 2005; Cisternas et al. 2011; Kocevski et al. 2012) but tend to have chaotic or spiral nuclear dust structures (Malkan et al. 1998; Deo et al. 2006; Simões Lopes et al. 2007) and a higher prevalence of inner rings (Hunt & Malkan 1999).

We also see that the RFF disturbance is significantly higher in bluer imaging at a $>5\sigma$ level, while shape asymmetry is similar in all bands. To the first order, tidal perturbations are gravitational and affect all stellar populations equally, so consistent shape asymmetry across bands is expected. A higher RFF in blue imaging can be explained either by a strongly perturbed young stellar population or by a high degree of dust obscuration. However, an extreme difference in stellar populations is required to explain the 5σ RFF difference between B and I bands. On the other hand, HST-SPOGs contain a significant amount of dust (Figure 10), which appears disturbed upon visual inspection of galaxy snapshots. Therefore, it is likely that the high internal disturbance is caused by dust structures, similar to AGN hosts. This indicates that the

disturbances we see are caused primarily by dust substructure, rather than merger-induced tidal features.

There are many processes that could lead to a disturbed dust morphology and quenching of star formation that are not necessarily associated with mergers. For example, outflows from a starburst- or AGN-driven feedback could lead to the disruption of dust, dusty outflows, and dust cones (e.g., Obied et al. 2016; Kaufman et al. 2020), while accreting AGNs are linked to nuclear dust spirals (e.g., Martini et al. 2003). HST-SPOGs still contain large reservoirs of molecular gas and dust. Alatalo et al. (2016b) showed that the parent sample of HST-SPOGs has a significant NaD excess, indicating possible ongoing outflows. As SPOGs transition into early-type, they have to lose their molecular gas, so outflows are necessary at some point in the PSB evolution. Outflows can also inject turbulence into the ISM, leading to the suppression of star formation before the gas is expelled (Nesvadba et al. 2010; Alatalo et al. 2015; Lanz et al. 2016). It is therefore plausible that we are seeing structural disturbances in a galaxy’s dust content caused by these outflows.

However, these disturbances could also be of a merger origin, even though there are no strong tidal features in $\sim 30\%$ of our sample. HST-SPOGs are PSBs, so if they are quenching after a merger, then it must have already happened, triggered a starburst, and started fading. Simulations find that asymmetric features fade on timescales between ~ 200 and 500 Myr (e.g., Pawlik et al. 2018; Snyder et al. 2015a), although the lifetime of *detectable* disturbances depends strongly on merger mass, gas and dust fraction, orbital arrangement of merging galaxies, and even the way mock observations were created (e.g., Lotz et al. 2008; Pawlik et al. 2018; Snyder et al. 2015a), making the comparison to simulations challenging.

We found that asymmetry and shape asymmetry decrease with PSB age on similar timescales to simulations. Only HST-SPOGs younger than 200 Myr have $A_S > 0.3$. The decline in asymmetry is smoother, and it takes ~ 750 Myr for asymmetry to fade entirely. The similarity in asymmetry fading timescales between our sample and simulations suggests that a prior merger is a plausible origin of the disturbances we observed. HST-SPOGs that have higher RFF but lower shape asymmetry than comparison galaxies are circled in Figure 14. They appear to preferentially be slightly older, supporting the idea that perhaps obvious post-merger tidal features have faded, while internal disturbances have not. However, we cannot conclude this with high significance owing to our small sample size. We plan to follow up this study with a new HST program, obtaining imaging of a large subset of the SPOG sample, spanning a range of stellar masses, redshifts, post-burst ages, and environments. Deeper observations with HST, and eventually the Vera Rubin Observatory, will enable detecting fainter tidal features and thereby constraining the merger origin of PSBs even further.

If the majority of HST-SPOGs are indeed post-mergers, then our results suggest that disturbances in dust and molecular gas structure fade more slowly than disturbances in stellar structure. It is possible that a merger simply triggers a different instability, leading to a disturbed internal structure (e.g., turbulence, bars, AGN, or starburst; Bekki et al. 2005; Wild et al. 2009; Snyder et al. 2011).

Disturbance of the dust substructure is particularly challenging to compare to cosmological simulations, as many simulations lack the necessary spatial resolution to resolve

cold gas that is correlated with dust (e.g., ~ 1 kpc per resolution element in Illustris; Nelson et al. 2015). Finally, while galaxy mergers themselves are easy to simulate, the effect of the merger on the galaxy post-coalescence and the evolution of the PSB phase is notoriously difficult to reproduce owing to the complex interplay of starburst and AGN feedback and shocks, which all require poorly constrained subgrid routines. In particular, Zanisi et al. (2021) show that Illustris simulations fail to recreate small-scale morphological features, important in our sample, in compact and quenched galaxies. Isolated merger simulations, tailored to provide high-enough resolution to reproduce PSB properties, can provide a better morphological comparison (e.g., Zheng et al. 2020; Lotz et al. 2021). However, new-generation cosmological simulations may also reach the necessary spatial resolution alongside a realistic set of subgrid routines to simulate the PSB phase well enough to enable studying this population (e.g., Nelson et al. 2019; Simons et al. 2019).

7.3.1. Inside-out Quenching or Dust?

We found that HST-SPOGs have more bulge-dominated structure in H band and more disk-like structure in B band at a 3σ level, corresponding to a red central bulge and a blue disk. Our sample is also, on average, more compact in H band than in B band. Finally, the radial color gradients seen in Figure 11 indicate that HST-SPOGs have red nuclei, but flat color gradients outside of the inner $R_{0.5}$.

Red bulges in HST-SPOGs could indicate inside-out quenching, where the central bulge is quenched first, followed by a slower quenching of the disk. However, multiple other studies find that PSB galaxies generally have an opposite color gradient: bluer cores and redder disks, although some scatter exists across different PSB samples (Yang et al. 2008; Chen et al. 2019). Moreover, Fraser-McKelvie et al. (2018) find that intermediate-mass early-type galaxies, likely descendants of PSBs, have younger central bulges suggestive of outside-in quenching, and Zheng et al. (2020) found evidence for outside-in quenching in simulated PSBs. Finally, Vika et al. (2015) found that regular star-forming galaxies also generally have higher bulge strengths in redder bands, so our findings may be indicative of a typical trend for late-type galaxies rather than a hint of inside-out quenching.

On the other hand, the observed red bulges can be caused by dust reddening in the center. HST-SPOGs have large amounts of dust in their central $1''.5$ regions (Figure 10), i.e., in their inner $\sim 0.75R_{0.5}$. Dust preferentially obscures stellar light in B and I bands, so the central regions of HST-SPOGs are definitely reddened by dust. With these data alone, we cannot conclude that the observed color and morphology gradients are definitely caused by dust, since we do not know whether the dust content decreases at larger radii. However, Smercina et al. (2018) show that molecular gas and dust of PSB galaxies are generally constrained to their nuclear regions. Considering this and the fact that (1) many other studies suggest that PSBs have bluer cores and (2) our sample contains younger, more gas- and dust-rich PSBs, then it is very likely that the observed color gradient is caused by a gradient in the galaxies' dust content. This study paves the way for the future observations with the James Webb Space Telescope, which will enable robustly breaking the age–dust degeneracy with high-resolution imaging of the dusty regions in the mid-IR.

8. Conclusion

Previous ground-based studies of PSB galaxies found that about 50% of PSBs are morphologically disturbed, and likely formed as a result of a merger (e.g., Blake et al. 2004; Yang et al. 2008; Pawlik et al. 2016). So how did the remaining 50% quench?

We have performed a detailed morphological study of 26 shocked, CO-detected PSB galaxies (HST-SPOGs) with new HST imaging in F438W, F814W, and F160W bands. We found the following:

1. HST-SPOGs have an intermediate morphology between late- and early-type galaxies.
2. HST-SPOGs have redder bulges and bluer disks.
3. 88% of our sample has a higher RFF than a mass- and redshift-matched comparison sample of star-forming and quiescent galaxies, and hence is more structurally disturbed.
4. Only $\sim 50\%$ of our sample appears more disturbed than the comparison samples in lower-resolution SDSS imaging.
5. The disturbances are of the *internal structure*, as traced by asymmetry and RFF, rather than shape of the galaxy, as traced by shape asymmetry, so high-resolution imaging is essential to identify them.
6. These disturbances are most prominent in B and I bands and not in H band, and hence likely caused by a dust-obscured central structures.
7. These disturbances fade over time: they become less prominent after ~ 200 Myr and fade entirely after ~ 750 Myr. Our sample contained preferentially younger PSBs, so older PSB samples (such as E+As) are likely to show fewer disturbances.

The intermediate morphology of HST-SPOGs suggests that they are currently transitioning from late- to early-type galaxies alongside their transition into quiescence. The color gradient we found disagrees with color gradients found in similar studies (Yang et al. 2008; Chen et al. 2019). This could indicate an inside-out quenching mechanism, but since our sample is relatively young, gas-rich, and dust-rich, it is likely that the apparent gradient is caused by central dust obscuration in bluer bands.

We conclude that the majority of PSBs are disturbed. These disturbances are small scale, are unresolved by SDSS imaging, and are likely caused by a highly disrupted dust structure in our galaxies.

These small-scale disturbances do not necessarily have a merger origin. A total of 65% of HST-SPOGs have a higher shape asymmetry than their comparison galaxies, likely caused by tidal features induced during a merger. However, 30% of HST-SPOGs with high asymmetry do not have a high shape asymmetry and instead show internal disturbances, likely caused by internal disturbances or dusty structures. Internal and dust morphology could be affected by a range of instabilities: outflows, bars, turbulence, mergers, or a combination thereof.

It is possible that most or all of the galaxies in our sample experienced a merger, which triggered the instabilities we see now. The similarity in asymmetry timescales between our sample and merger simulations (e.g., Pawlik et al. 2018; Snyder et al. 2015a) suggests a possible merger origin. However, obvious merger signatures (such as tidal tails) may

have already faded, so confirming a previous merger event is difficult. To fully understand the structure and the origin of the internal disturbances observed in our sample, we plan to follow up this study with a larger HST survey of the parent SPOG sample, spanning a range of masses, redshifts, PSB ages, and environments. In addition, deeper HST imaging or the next-generation deep imaging from the Vera Rubin Observatory will allow detecting the faintest tidal features in PSB galaxies and therefore constraining their merger origin. The new high-resolution simulations of PSBs with a full time evolution information will also help to determine whether their starbursts are triggered by a merger (e.g., Zheng et al. 2020; Lotz et al. 2021).

We thank the anonymous referee for the thoughtful and constructive feedback they provided on this manuscript, helping to strengthen the discussion of our results. E.S. thanks Mark Lacy, Roan Haggard, and Nathan Miles for very useful scientific suggestions and feedback. E.S., K.A., and Y.L. have been partially funded by Space Telescope Science Institute Director’s Discretionary Research Fund grants D0101.90241 and D0101.90262, HST grants GO-14715.021 and GO-14649.015, and Chandra grant GO7-18096A. A.M.M. acknowledges support by the National Science Foundation under grant No. 2009416. U.L. acknowledges support by the research project AYA2017-84897-P from the Spanish Ministerio de Economía y Competitividad, the European Regional Development Funds (FEDER), and the Junta de Andalucía (Spain) grant FQM108.

This research made use of the following Python astronomy libraries: Astropy, a community-developed core Python package for Astronomy (Astropy Collaboration et al. 2013, 2018); STATMORPH, open-source package for morphological measurements (Rodríguez-Gómez et al. 2019); Photutils, an Astropy package for detection and photometry of astronomical sources (Bradley et al. 2020); Astro-SCRAPPY, an Astropy package for detection of cosmic rays (McCully et al. 2018); and ccdproc, an Astropy package for image reduction (Craig et al. 2021). This work also used GALFIT, a software for galaxy profile fitting (Peng et al. 2002, 2010), and TinyTim, a software to model the PSF of HST images (Krist et al. 2011).

This research made use of data products from the Sloan Digital Sky Survey and the NASA/ESA Hubble Space Telescope. HST observations were obtained from the Hubble Legacy Archive, which is a collaboration between the Space Telescope Science Institute (STScI/NASA), the Space Telescope European Coordinating Facility (ST-ECF/ESA), and the

Canadian Astronomy Data Centre (CADC/NRC/CSA). Funding for the Sloan Digital Sky Survey IV has been provided by the Alfred P. Sloan Foundation, the U.S. Department of Energy Office of Science, and the Participating Institutions.

SDSS-IV acknowledges support and resources from the Center for High Performance Computing at the University of Utah. The SDSS website is www.sdss.org. SDSS-IV is managed by the Astrophysical Research Consortium for the Participating Institutions of the SDSS Collaboration, including the Brazilian Participation Group, the Carnegie Institution for Science, Carnegie Mellon University, Center for Astrophysics | Harvard & Smithsonian, the Chilean Participation Group, the French Participation Group, Instituto de Astrofísica de Canarias, Johns Hopkins University, Kavli Institute for the Physics and Mathematics of the Universe (IPMU)/University of Tokyo, the Korean Participation Group, Lawrence Berkeley National Laboratory, Leibniz Institut für Astrophysik Potsdam (AIP), Max-Planck-Institut für Astronomie (MPIA Heidelberg), Max-Planck-Institut für Astrophysik (MPA Garching), Max-Planck-Institut für Extraterrestrische Physik (MPE), National Astronomical Observatories of China, New Mexico State University, New York University, University of Notre Dame, Observatório Nacional/MCTI, The Ohio State University, Pennsylvania State University, Shanghai Astronomical Observatory, United Kingdom Participation Group, Universidad Nacional Autónoma de México, University of Arizona, University of Colorado Boulder, University of Oxford, University of Portsmouth, University of Utah, University of Virginia, University of Washington, University of Wisconsin, Vanderbilt University, and Yale University.

Software: Astropy (Astropy Collaboration et al. 2013, 2018), STATMORPH (Rodríguez-Gómez et al. 2019), GALFIT (Peng et al. 2002, 2010), TinyTim (Krist et al. 2011), photutils (Bradley et al. 2020), Astro-SCRAPPY (McCully et al. 2018), ccdproc (Craig et al. 2021), PyQt-Fit¹⁷, Pandas (Reback et al. 2020), SciPy (Virtanen & Gommers et al. 2020), Matplotlib (Hunter 2007), NumPy (Harris et al. 2020).

Appendix A

Morphological Parameters of Each Galaxy in the Sample

Table 6 shows a sample of a few morphological measurements outlined in Section 4 for a few galaxies. The entire table showing all of the measurements for each galaxy and each imaging filter is available in the machine-readable format in the online journal.

¹⁷ PyQt-Fit webpage—pyqt-fit.readthedocs.io

Table 6
Morphological Measurements for HST-SPOGs, Star-forming Galaxies, and Quiescent Galaxies Calculated in This Work (Sample)

Galaxy Properties IAU Name	Image Properties			Structural Parameters				Disturbance Parameters				
	Instrument	Filter	Depth	R_p	Sérsic n	B/T	C	A	A_S	RFF _{in}	RFF _{out}	
J000318+004844	HST	F160W	23.401	4.509	2.837	0.799	3.886	0.196	0.472	0.066	0.050	0.043
J000318+004844	HST	F438W	23.439	4.957	1.000	0.154	2.759	0.010	0.424	0.241	0.201	0.169
J000318+004844	HST	F814W	22.252	5.624	1.646	0.468	3.161	0.010	0.528	0.172	0.163	0.154
J000318+004844	SDSS	i	23.713	6.752	0.954	0.000	2.780	0.011	0.359	0.075	0.089	0.112
J001145−005431	HST	F160W	23.397	2.719	2.044	0.424	3.784	0.023	0.142	0.071	0.034	0.021
J001145−005431	HST	F438W	23.557	3.067	0.944	1.000	2.816	0.084	0.311	0.197	0.157	0.125
J001145−005431	HST	F814W	22.405	2.883	1.595	0.321	3.347	0.054	0.319	0.119	0.109	0.100
J001145−005431	SDSS	i	23.630	3.045	1.173	0.121	3.124	−0.067	0.154	0.068	0.065	0.058

Note. A subset of morphological measurements obtained with HST F160W, F814W, and F438W and SDSS i -band imaging of two sample HST-SPOGs. The full data set for all galaxies used in this work and all parameters is given as a machine-readable table in the online journal. Column (1): IAU name. Columns (3) and (4): instrument and filter used for the measurement. Column (5): 1σ sky background flux of the image in AB mag arcsec⁻². Structural parameters: Column (6): Petrosian radius. Column (7): Sérsic index. Column (8): bulge-to-total light ratio. Disturbance parameters: Column (9): asymmetry. Column (10): shape asymmetry. Column (12): residual flux fraction. Additional data for all galaxies and all morphological parameters are available in the machine-readable table.

(This table is available in its entirety in machine-readable form.)

Appendix B Statistics and Distributions of All Morphological Parameters

Table 7 shows the medians of all morphological parameters for the HST-SPOG, star-forming, and quiescent samples. As in Tables 3 and 4, the uncertainty on the median is calculated by bootstrapping each sample 1000 times and finding the 16th/84th quantiles of the median distribution. The same general trends can be seen as described in Sections 5.3 and 6.1. HST-SPOGs have intermediate bulge strengths between star-forming and quiescent galaxies in all five structural parameters. They also have a higher bulge strength and more compact morphology in redder imaging than bluer imaging. The only exception is that B/T — B/T measured with F438W and F814W imaging are consistent with each other. HST-

SPOGs are significantly more disturbed than comparison galaxies in HST imaging, and the disturbance increases in bluer imaging, likely an effect of dust substructure as discussed in Section 6.2.1.

Figures 18 and 19 show the distributions of morphological parameters from Section 4 that were not displayed in Figures 12 and 15, respectively. Figure 18 shows a stronger dependence of morphological parameters on wavelength than Figure 12, indicating that concentration and $G-M_{20}$ metrics are more wavelength dependent than Sérsic index, B/T , and asymmetry. The general trends are the same: HST-SPOGs are more disturbed in bluer bands and more disturbed than comparison galaxies using all metrics. They have intermediate bulge strengths between star-forming and quiescent galaxies and redder central bulges.

Table 7
Medians of All Morphological Measurements for HST-SPOGs and Comparison Star-forming and Quiescent Galaxies, Calculated with HST F160W, F438W, and F814W imaging (Where Available) and SDSS i -band Imaging

Parameter	HST F160W HST-SPOGs	HST F438W HST-SPOGs	HST F814W			SDSS i Band		
			HST-SPOGs	SFGs	QGs	HST-SPOGs	SFGs	QGs
Structural Parameters								
Sérsic n	$1.98^{+0.35}_{-0.08}$	$1.18^{+0.41}_{-0.18}$	$1.70^{+0.19}_{-0.10}$	$1.22^{+0.23}_{-0.12}$	$2.64^{+0.34}_{-0.24}$	$1.43^{+0.05}_{-0.06}$	$0.87^{+0.18}_{-0.08}$	$2.04^{+0.03}_{-0.11}$
B/T	$0.64^{+0.07}_{-0.05}$	$0.57^{+0.09}_{-0.22}$	$0.47^{+0.05}_{-0.10}$	$0.16^{+0.01}_{-0.01}$	$0.71^{+0.06}_{-0.05}$	$0.17^{+0.03}_{-0.03}$	$0.03^{+0.04}_{-0.01}$	$0.38^{+0.02}_{-0.03}$
Concentration	$3.89^{+0.18}_{-0.09}$	$2.82^{+0.21}_{-0.08}$	$3.66^{+0.13}_{-0.21}$	$3.10^{+0.13}_{-0.11}$	$4.01^{+0.13}_{-0.07}$	$3.00^{+0.13}_{-0.07}$	$2.87^{+0.10}_{-0.07}$	$3.29^{+0.01}_{-0.10}$
$G-M_{20}$ bulge strength	$0.47^{+0.07}_{-0.07}$	$-0.14^{+0.10}_{-0.12}$	$0.27^{+0.12}_{-0.20}$	$-0.27^{+0.19}_{-0.08}$	$0.55^{+0.06}_{-0.07}$	$-0.02^{+0.08}_{-0.11}$	$-0.25^{+0.12}_{-0.09}$	$0.09^{+0.04}_{-0.05}$
$R_{0.5}$ (kpc)	$2.92^{+0.15}_{-0.48}$	$3.06^{+0.46}_{-0.30}$	$3.21^{+0.39}_{-0.33}$	$4.39^{+0.55}_{-0.35}$	$2.39^{+0.22}_{-0.20}$	$3.92^{+0.63}_{-0.23}$	$5.47^{+0.36}_{-0.39}$	$3.43^{+0.26}_{-0.32}$
Disturbance Parameters								
Asymmetry	$0.09^{+0.04}_{-0.01}$	$0.12^{+0.07}_{-0.02}$	$0.13^{+0.01}_{-0.03}$	$-0.03^{+0.01}_{-0.01}$	$-0.01^{+0.01}_{-0.01}$	$0.03^{+0.01}_{-0.01}$	$-0.00^{+0.02}_{-0.02}$	$-0.00^{+0.01}_{-0.00}$
Shape asymmetry	$0.29^{+0.07}_{-0.04}$	$0.39^{+0.04}_{-0.04}$	$0.30^{+0.03}_{-0.03}$	$0.27^{+0.01}_{-0.02}$	$0.20^{+0.01}_{-0.01}$	$0.27^{+0.02}_{-0.04}$	$0.30^{+0.03}_{-0.02}$	$0.22^{+0.02}_{-0.01}$
RFF	$0.07^{+0.00}_{-0.01}$	$0.22^{+0.00}_{-0.01}$	$0.14^{+0.01}_{-0.01}$	$0.07^{+0.01}_{-0.01}$	$0.04^{+0.01}_{-0.01}$	$0.07^{+0.01}_{-0.01}$	$0.07^{+0.01}_{-0.01}$	$0.03^{+0.01}_{-0.00}$
RFF _{in}	$0.07^{+0.00}_{-0.00}$	$0.23^{+0.02}_{-0.02}$	$0.14^{+0.01}_{-0.00}$	$0.07^{+0.01}_{-0.02}$	$0.03^{+0.01}_{-0.01}$	$0.08^{+0.00}_{-0.01}$	$0.08^{+0.01}_{-0.01}$	$0.03^{+0.00}_{-0.01}$
RFF _{out}	$0.07^{+0.00}_{-0.02}$	$0.19^{+0.02}_{-0.02}$	$0.14^{+0.01}_{-0.02}$	$0.08^{+0.01}_{-0.00}$	$0.04^{+0.00}_{-0.00}$	$0.07^{+0.01}_{-0.00}$	$0.07^{+0.01}_{-0.01}$	$0.04^{+0.00}_{-0.00}$
$G-M_{20}$ disturbance	$-0.05^{+0.02}_{-0.01}$	$0.02^{+0.03}_{-0.01}$	$-0.02^{+0.01}_{-0.01}$	$-0.07^{+0.02}_{-0.01}$	$-0.06^{+0.01}_{-0.01}$	$-0.05^{+0.01}_{-0.01}$	$-0.07^{+0.00}_{-0.01}$	$-0.04^{+0.01}_{-0.00}$

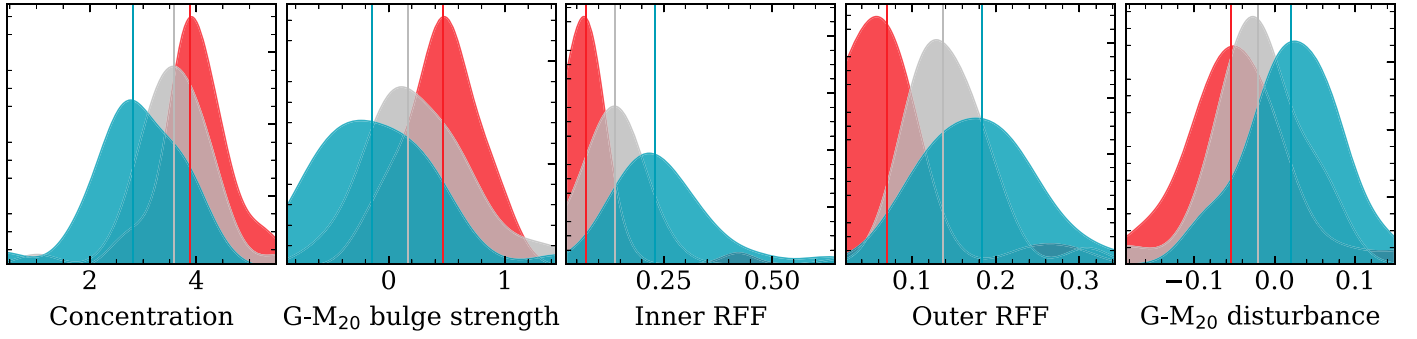


Figure 18. Distributions of morphological parameters from Section 4 not given in Figure 12 for the HST-SPOG sample obtained with HST F160W (red), F814W (gray), and F438W (blue) imaging. Left to right: concentration, $G-M_{20}$ bulge strength, inner RFF, outer RFF, and $G-M_{20}$ disturbance. HST-SPOGs have stronger bulges in redder imaging and are more disturbed in bluer imaging.

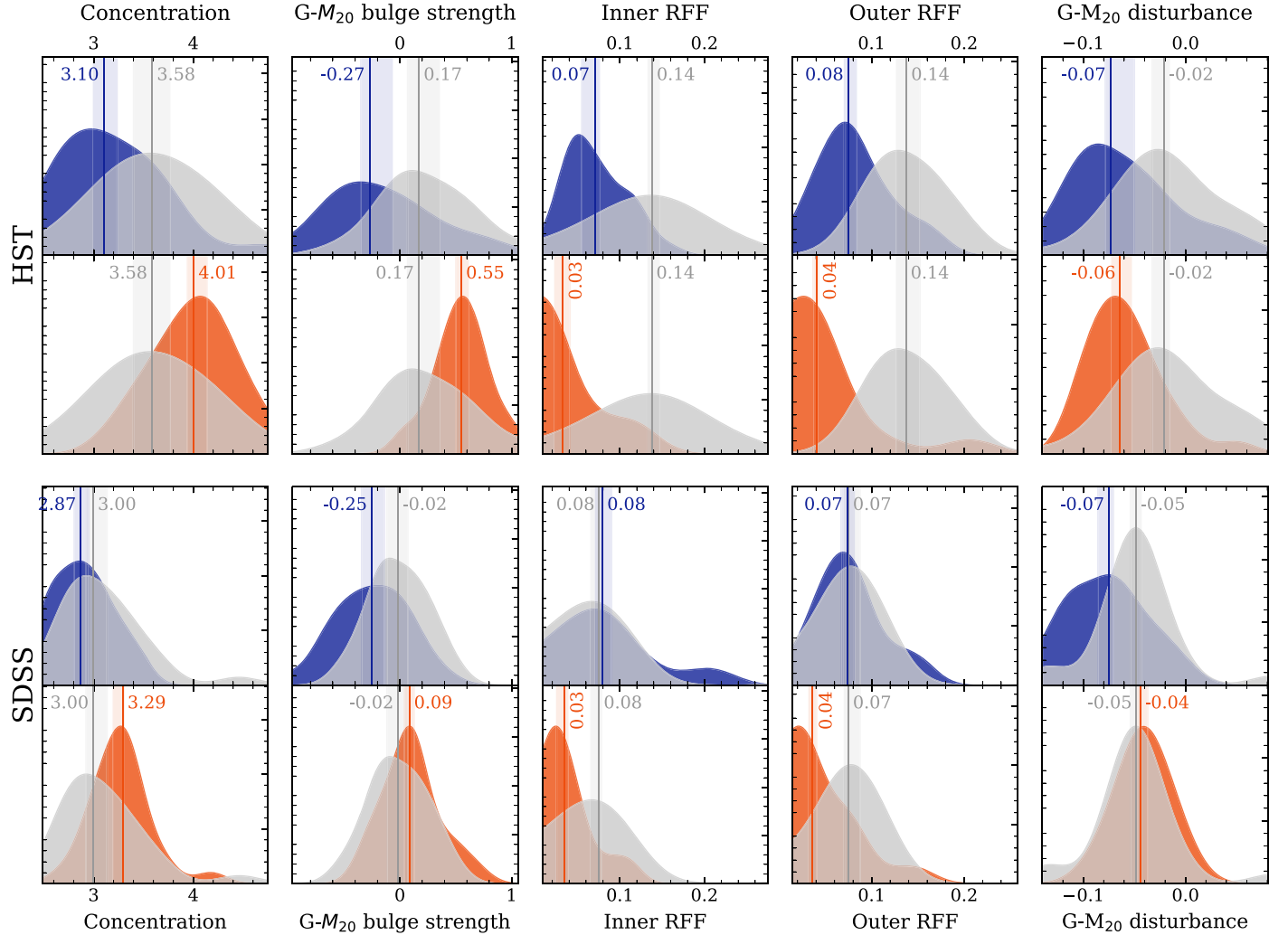


Figure 19. Distributions of the same morphological parameters as in Figure 18 for HST-SPOGs (gray), star-forming galaxies (blue), and quiescent galaxies (orange). Parameters were computed using HST F814W imaging (top) and SDSS i -band imaging (bottom). HST-SPOGs have intermediate bulge strengths between star-forming and quiescent galaxies and are significantly more disturbed when observed with HST.

ORCID iDs

Elizaveta Sazonova <https://orcid.org/0000-0001-6245-5121>
 Katherine Alatalo <https://orcid.org/0000-0002-4261-2326>
 Kate Rowlands <https://orcid.org/0000-0001-7883-8434>
 Susana E. Deustua <https://orcid.org/0000-0003-2823-360X>
 K. Decker French <https://orcid.org/0000-0002-4235-7337>
 Timothy Heckman <https://orcid.org/0000-0001-6670-6370>

Lauranne Lanz <https://orcid.org/0000-0002-3249-8224>
 Ute Lisenfeld <https://orcid.org/0000-0002-9471-5423>
 Yuanze Luo <https://orcid.org/0000-0002-0696-6952>
 Anne Medling <https://orcid.org/0000-0001-7421-2944>
 Kristina Nyland <https://orcid.org/0000-0003-1991-370X>
 Justin A. Otter <https://orcid.org/0000-0003-3191-9039>
 Andreea O. Petric <https://orcid.org/0000-0003-4030-3455>

Gregory F. Snyder  <https://orcid.org/0000-0002-4226-304X>
 Claudia Megan Urry  <https://orcid.org/0000-0002-0745-9792>

References

- Abazajian, K., Adelman-McCarthy, J. K., Agüeros, M. A., et al. 2004, *AJ*, **128**, 502
- Abazajian, K. N., Adelman-McCarthy, J. K., Agüeros, M. A., et al. 2009, *ApJS*, **182**, 543
- Abraham, R. G., van den Bergh, S., Glazebrook, K., et al. 1996, *ApJS*, **107**, 1
- Alam, S., Albareti, F. D., Allende Prieto, C., et al. 2015, *ApJS*, **219**, 12
- Alatalo, K., Cales, S. L., Rich, J. A., et al. 2016a, *ApJS*, **224**, 38
- Alatalo, K., Lacy, M., Lanz, L., et al. 2015, *ApJ*, **798**, 31
- Alatalo, K., Lisenfeld, U., Lanz, L., et al. 2016b, *ApJ*, **827**, 106
- Almaini, O., Wild, V., Maltby, D. T., et al. 2017, *MNRAS*, **472**, 1401
- Arnouts, S., Walcher, C. J., Le Fèvre, O., et al. 2007, *A&A*, **476**, 137
- Astropy Collaboration, Price-Whelan, A. M., Sipőcz, B. M., et al. 2018, *AJ*, **156**, 123
- Astropy Collaboration, Robitaille, T. P., Tollerud, E. J., et al. 2013, *A&A*, **558**, A33
- Baldry, I. K., Glazebrook, K., Brinkmann, J., et al. 2004, *ApJ*, **600**, 681
- Baldwin, J. A., Phillips, M. M., & Terlevich, R. 1981, *PASP*, **93**, 5
- Baron, D., & Netzer, H. 2019, *MNRAS*, **486**, 4290
- Barro, G., Faber, S. M., Pérez-González, P. G., et al. 2013, *ApJ*, **765**, 104
- Bekki, K., Couch, W. J., Shioya, Y., & Vazdekis, A. 2005, *MNRAS*, **359**, 949
- Bell, E. F., McIntosh, D. H., Katz, N., & Weinberg, M. D. 2003, *ApJS*, **149**, 289
- Bell, E. F., Wolf, C., Meisenheimer, K., et al. 2004, *ApJ*, **608**, 752
- Bershady, M. A., Jangren, A., & Conselice, C. J. 2000, *AJ*, **119**, 2645
- Bertin, E., & Arnouts, S. 1996, *A&AS*, **117**, 393
- Blake, C., Pracy, M. B., Couch, W. J., et al. 2004, *MNRAS*, **355**, 713
- Blanton, M. R., Bershady, M. A., Abolfathi, B., et al. 2017, *AJ*, **154**, 28
- Blanton, M. R., Schlegel, D. J., Strauss, M. A., et al. 2005, *AJ*, **129**, 2562
- Bournaud, F., Jog, C. J., & Combes, F. 2007, *A&A*, **476**, 1179
- Bradley, L., Sipőcz, B., Robitaille, T., et al. 2020, *astropy/photutils*: 1.0.1, 1.0.1, Zenodo, doi:[10.5281/zenodo.596036](https://doi.org/10.5281/zenodo.596036)
- Budavári, T., Heinis, S., Szalay, A. e. S., et al. 2009, *ApJ*, **694**, 1281
- Casteels, K. R. V., Conselice, C. J., Bamford, S. P., et al. 2014, *MNRAS*, **445**, 1157
- Chang, Y.-Y., van der Wel, A., da Cunha, E., & Rix, H.-W. 2015, *ApJS*, **219**, 8
- Chen, Y.-M., Shi, Y., Wild, V., et al. 2019, *MNRAS*, **489**, 5709
- Cicone, C., Maiolino, R., Sturm, E., et al. 2014, *A&A*, **562**, A21
- Cisternas, M., Jahnke, K., Inskip, K. J., et al. 2011, *ApJ*, **726**, 57
- Conselice, C. J. 2003, *ApJS*, **147**, 1
- Craig, M., Crawford, S., Seifert, M., et al. 2021, *astropy/ccdproc*: 2.1.0 (re-release for Zenodo), Zenodo, doi:[10.5281/ZENODO.4588034](https://doi.org/10.5281/ZENODO.4588034)
- Crocker, A. F., Bureau, M., Young, L. M., & Combes, F. 2011, *MNRAS*, **410**, 1197
- Daddi, E., Bournaud, F., Walter, F., et al. 2010, *ApJ*, **713**, 686
- Darg, D. W., Kaviraj, S., Lintott, C. J., et al. 2010, *MNRAS*, **401**, 1043
- de Vaucouleurs, G. 1948, *AnAp*, **11**, 247
- Dekel, A., & Burkert, A. 2013, *MNRAS*, **438**, 1870
- Deo, R. P., Crenshaw, D. M., & Kraemer, S. B. 2006, *AJ*, **132**, 321
- Dressler, A., & Gunn, J. E. 1983, *ApJ*, **270**, 7
- Ellison, S. L., Patton, D. R., Simard, L., & McConnell, A. W. 2008, *AJ*, **135**, 1877
- Faber, S. M., Willmer, C. N. A., Wolf, C., et al. 2007, *ApJ*, **665**, 265
- Ferreira, L., Conselice, C. J., Duncan, K., et al. 2020, *ApJ*, **895**, 115
- Fraser-McKelvie, A., Aragón-Salamanca, A., Merrifield, M., et al. 2018, *MNRAS*, **481**, 5580
- Freeman, K. C. 1970, *ApJ*, **160**, 811
- Freeman, P. E., Izbicki, R., Lee, A. B., et al. 2013, *MNRAS*, **434**, 282
- French, K. D., Yang, Y., Zabludoff, A., et al. 2015, *ApJ*, **801**, 1
- French, K. D., Yang, Y., Zabludoff, A. I., & Tremonti, C. A. 2018, *ApJ*, **862**, 2
- Galametz, A., Grazian, A., Fontana, A., et al. 2013, *ApJS*, **206**, 10
- Gensior, J., Kruijssen, J. M. D., & Keller, B. W. 2020, *MNRAS*, **495**, 199
- Goto, T. 2005, *MNRAS*, **357**, 937
- Goto, T. 2007, *MNRAS*, **381**, 187
- Grogan, N. A., Conselice, C. J., Chatzichristou, E., et al. 2005, *ApJL*, **627**, L97
- Gunn, J. E., & Gott, J. R., III 1972, *ApJ*, **176**, 1
- Harris, C. R., Millman, K. J., van der Walt, S. J., et al. 2020, *Natur*, **585**, 357
- Hinshaw, G., Larson, D., Komatsu, E., et al. 2013, *ApJS*, **208**, 19
- Hopkins, P. F., Hernquist, L., Cox, T. J., et al. 2006, *ApJS*, **163**, 1
- Hopkins, P. F., Hernquist, L., Cox, T. J., Keres, D., & Wuyts, S. 2009, *ApJ*, **691**, 1424
- Hoyos, C., Aragón-Salamanca, A., Gray, M. E., et al. 2012, *MNRAS*, **419**, 2703
- Hoyos, C., den Brok, M., Verdoes Kleijn, G., et al. 2011, *MNRAS*, **411**, 2439
- Hunt, L. K., & Malkan, M. A. 1999, *ApJ*, **516**, 660
- Hunter, J. D. 2007, *CSE*, **9**, 90
- Jackson, R. A., Martin, G., Kaviraj, S., et al. 2019, *MNRAS*, **489**, 4679
- Kauffmann, G., Heckman, T. M., White, S. D. M., et al. 2003a, *MNRAS*, **341**, 33
- Kauffmann, G., Heckman, T. M., White, S. D. M., et al. 2003b, *MNRAS*, **341**, 54
- Kauffman, M., Elmegreen, B. G., Andersen, M., et al. 2020, *AJ*, **159**, 180
- Kaviraj, S. 2009, *MNRAS*, **394**, 1167
- Kaviraj, S., Kirkby, L. A., Silk, J., & Sarzi, M. 2007a, *MNRAS*, **382**, 960
- Kaviraj, S., Schawinski, K., Devriendt, J. E. G., et al. 2007b, *ApJS*, **173**, 619
- Kewley, L. J., Groves, B., Kauffmann, G., & Heckman, T. 2006, *MNRAS*, **372**, 961
- Kocevski, D. D., Faber, S. M., Mozena, M., et al. 2012, *ApJ*, **744**, 148
- Krist, J. E., Hook, R. N., & Stoehr, F. 2011, *Proc. SPIE*, **8127**, 81270J
- Kuhn, H. W. 1955, *Naval Research Logistics Quarterly*, **2**, 83
- Lanz, L., Ogle, P. M., Alatalo, K., & Appleton, P. N. 2016, *ApJ*, **826**, 29
- Li, Q., Narayanan, D., & Davé, R. 2019, *MNRAS*, **490**, 1425
- Lotz, J. M., Jonsson, P., Cox, T. J., & Primack, J. R. 2008, *MNRAS*, **391**, 1137
- Lotz, J. M., Primack, J., & Madau, P. 2004, *AJ*, **128**, 163
- Lotz, M., Dolag, K., Remus, R.-S., & Burkert, A. 2021, *MNRAS*, **506**, 4516
- Malkan, M. A., Gorjian, V., & Tam, R. 1998, *ApJS*, **117**, 25
- Man, A. W. S., Zirm, A. W., & Toft, S. 2016, *ApJ*, **830**, 89
- Martig, M., Crocker, A. F., Bournaud, F., et al. 2013, *MNRAS*, **432**, 1914
- Martini, P., Regan, M. W., Mulchaey, J. S., & Pogge, R. W. 2003, *ApJ*, **589**, 774
- Masters, K. L., Mosleh, M., Romer, A. K., et al. 2010, *MNRAS*, **405**, 783
- McCully, C., Crawford, S., Kovacs, Gabor, et al. 2018, *Astropy/Astrocrappy*: V1.0.5 Zenodo Release, Zenodo, doi:[10.5281/ZENODO.1482019](https://doi.org/10.5281/ZENODO.1482019)
- Michałowski, M. J., Hjorth, J., Gall, C., et al. 2019, *A&A*, **632**, A43
- Moore, B., Katz, N., Lake, G., Dressler, A., & Oemler, A. 1996, *Natur*, **379**, 613
- Nelson, D., Pillepich, A., Genel, S., et al. 2015, *A&C*, **13**, 12
- Nelson, D., Springel, V., Pillepich, A., et al. 2019, *ComAC*, **6**, 2
- Nesvadba, N. P. H., Boulanger, F., Salomé, P., et al. 2010, *A&A*, **521**, A65
- Noeske, K. G., Weiner, B. J., Faber, S. M., et al. 2007, *ApJL*, **660**, L43
- Obied, G., Zakamska, N. L., Wylezalek, D., & Liu, G. 2016, *MNRAS*, **456**, 2861
- Oh, K., Sarzi, M., Schawinski, K., & Yi, S. K. 2011, *ApJS*, **195**, 13
- Osterbrock, D. E., & Ferland, G. J. 2006, *Astrophysics of Gaseous Nebulae and Active Galactic Nuclei* (Mill Valley, CA: Univ. Science Books)
- Patton, D. R., Ellison, S. L., Simard, L., McConnell, A. W., & Mendel, J. T. 2011, *MNRAS*, **412**, 591
- Pawlik, M. M., Taj Aldeen, L., Wild, V., et al. 2018, *MNRAS*, **477**, 1708
- Pawlik, M. M., Wild, V., Walcher, C. J., et al. 2016, *MNRAS*, **456**, 3032
- Peng, C. Y., Ho, L. C., Impey, C. D., & Rix, H.-W. 2002, *AJ*, **124**, 266
- Peng, C. Y., Ho, L. C., Impey, C. D., & Rix, H.-W. 2010, *AJ*, **139**, 2097
- Petrosian, V. 1976, *ApJL*, **210**, L53
- Pracy, M. B., Kuntschner, H., Couch, W. J., et al. 2009, *MNRAS*, **396**, 1349
- Quintero, A. D., Hogg, D. W., Blanton, M. R., et al. 2004, *ApJ*, **602**, 190
- Reback, J., McKinney, W., Brockmendel, J., et al. 2020, *pandas-dev/pandas*: Pandas 1.1.3, zenodo, doi:[10.5281/ZENODO.4067057](https://doi.org/10.5281/ZENODO.4067057)
- Rodríguez-Gómez, V., Snyder, G. F., Lotz, J. M., et al. 2019, *MNRAS*, **483**, 4140
- Rowlands, K., Wild, V., Nesvadba, N., et al. 2015, *MNRAS*, **448**, 258
- Sazonova, E., Alatalo, K., Lotz, J., et al. 2020, *ApJ*, **899**, 85
- Schade, D., Lilly, S. J., Crampton, D., et al. 1995, *ApJL*, **451**, L1
- Schawinski, K., Urry, C. M., Simmons, B. D., et al. 2014, *MNRAS*, **440**, 889
- Scott, D. W. 1992, *Multivariate Density Estimation* (New York: Wiley)
- Sérsic, J. L. 1963, *BAAA*, **6**, 41
- Simões Lopes, R. D., Storchi-Bergmann, T., de Fátima Saraiva, M., & Martini, P. 2007, *ApJ*, **655**, 718
- Simons, R. C., Kassim, S. A., Snyder, G. F., et al. 2019, *ApJ*, **874**, 59
- Smercina, A., Smith, J. D. T., Dale, D. A., et al. 2018, *ApJ*, **855**, 51
- Snyder, G. F., Cox, T. J., Hayward, C. C., Hernquist, L., & Jonsson, P. 2011, *ApJ*, **741**, 77
- Snyder, G. F., Lotz, J., Moody, C., et al. 2015a, *MNRAS*, **451**, 4290
- Snyder, G. F., Rodríguez-Gómez, V., Lotz, J. M., et al. 2019, *MNRAS*, **486**, 3702
- Snyder, G. F., Torrey, P., Lotz, J. M., et al. 2015b, *MNRAS*, **454**, 1886
- Stoughton, C., Lupton, R. H., Bernardi, M., et al. 2002, *AJ*, **123**, 485

- Strateva, I., Ivezić, Ž., Knapp, G. R., et al. 2001, [AJ](#), **122**, 1861
- Strauss, M. A., Weinberg, D. H., Lupton, R. H., et al. 2002, [AJ](#), **124**, 1810
- Toomre, A., & Toomre, J. 1972, [ApJ](#), **178**, 623
- Tran, K.-V. H., Franx, M., Illingworth, G. D., et al. 2004, [ApJ](#), **609**, 683
- van Dokkum, P. G. 2001, [PASP](#), **113**, 1420
- Veilleux, S., & Osterbrock, D. E. 1987, [ApJS](#), **63**, 295
- Vika, M., Vulcani, B., Bamford, S. P., Häußler, B., & Rojas, A. L. 2015, [A&A](#), **577**, A97
- Virtanen, P., Gommers, R., Oliphant, T. E., et al. 2020, [NatMe](#), **17**, 261
- Whitmore, B. C., Allam, S. S., Budavári, T., et al. 2016, [AJ](#), **151**, 134
- Wild, V., Kauffmann, G., Heckman, T., et al. 2007, [MNRAS](#), **381**, 543
- Wild, V., Walcher, C. J., Johansson, P. H., et al. 2009, [MNRAS](#), **395**, 144
- Willett, K. W., Lintott, C. J., Bamford, S. P., et al. 2013, [MNRAS](#), **435**, 2835
- Wright, E. L., Eisenhardt, P. R. M., Mainzer, A. K., et al. 2010, [AJ](#), **140**, 1868
- Yang, Y., Zabludoff, A. I., Zaritsky, D., Lauer, T. R., & Mihos, J. C. 2004, [ApJ](#), **607**, 258
- Yang, Y., Zabludoff, A. I., Zaritsky, D., & Mihos, J. C. 2008, [ApJ](#), **688**, 945
- Yesuf, H. M., Faber, S. M., Trump, J. R., et al. 2014, [ApJ](#), **792**, 84
- York, D. G., Adelman, J., Anderson, John E., J., et al. 2000, [AJ](#), **120**, 1579
- Young, L. M., Bureau, M., Davis, T. A., et al. 2011, [MNRAS](#), **414**, 940
- Young, L. M., Scott, N., Serra, P., et al. 2014, [MNRAS](#), **444**, 3408
- Zabludoff, A. I., Zaritsky, D., Lin, H., et al. 1996, [ApJ](#), **466**, 104
- Zanisi, L., Huertas-Company, M., Lanusse, F., et al. 2021, [MNRAS](#), **501**, 4359
- Zheng, Y., Wild, V., Lahén, N., et al. 2020, [MNRAS](#), **498**, 1259