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# Galaxy And Mass Assembly (GAMA): the wavelength-dependent sizes and profiles of galaxies revealed by MegaMorph

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## ABSTRACT

We investigate the relationship between colour and structure within galaxies using a large, volume-limited sample of bright, low-redshift galaxies with optical–near-infrared imaging from the Galaxy And Mass Assembly survey. We fit single-component, wavelength-dependent, elliptical Sérsic models to all passbands simultaneously, using software developed by the MegaMorph project. Dividing our sample by  $n$  and colour, the recovered wavelength variations in effective radius ( $R_e$ ) and Sérsic index ( $n$ ) reveal the internal structure, and hence formation history, of different types of galaxies. All these trends depend on  $n$ ; some have an additional dependence on galaxy colour. Late-type galaxies ( $n_r < 2.5$ ) show a dramatic increase in Sérsic index with wavelength. This might be a result of their two-component (bulge–disc) nature, though stellar population gradients within each component and dust attenuation are likely to play a role. All galaxies show a substantial decrease in  $R_e$  with wavelength. This is strongest for early types ( $n_r > 2.5$ ), even though they maintain constant  $n$  with wavelength, revealing that ellipticals are a superimposition of different stellar populations associated with multiple collapse and merging events. Processes leading to structures with larger  $R_e$  must be associated with lower metallicity or younger stellar populations. This appears to rule out the formation of young cores through dissipative gas accretion as an important mechanism in the recent lives of luminous elliptical galaxies.

**Key words:** galaxies: formation – galaxies: fundamental parameters – galaxies: general – galaxies: structure.

## 1 INTRODUCTION

It is common to describe galaxies by a few key properties, such as luminosity, colour, size and ellipticity, which are [at least in the

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local Universe and at optical and near-infrared (NIR) wavelengths] indicative of the total mass, average age and spatial extent of their stellar contents. At a slightly more detailed level, one may characterize a galaxy in terms of its internal structure, or morphology: the presence and relative strength of features such as discs, bulges, bars, rings and spiral arms. Each of these features represents a distinctive distribution of stars, in terms of both their positions and velocities. Unfortunately, resolved stellar velocities are difficult to obtain, particularly for large samples of distant galaxies. The largest studies of the internal structure of galaxies must therefore inevitably rely on imaging data.

Galaxies principally come in two morphological types: ellipticals and disc galaxies. Ellipticals have a simple, smooth appearance, show old stellar populations and live preferably in denser environments (see, e.g., Dressler et al. 1997; Kauffmann et al. 2003; Brinchmann et al. 2004). Spirals primarily comprise a thin disc, containing a spiral arm pattern, possess younger stellar populations and avoid dense regions (e.g. Freeman 1970; Blanton & Moustakas 2009 and references therein). However, spirals often also contain a spheroidal ‘bulge’, a structure similar in colour and shape to a small elliptical galaxy, at their centre (Andreidakis, Peletier & Balcells 1995); though bulges appear to be denser than present-day elliptical galaxies (e.g. Graham & Worley 2008; Graham 2013). The relative size and importance of the bulge and the appearance of the spiral features vary substantially, resulting in a range of spiral morphologies (de Jong 1996a). Lenticular galaxies sit at the intersection of ellipticals and spirals. They display similarities to both, often being dominated by a bulge, but also by definition, containing a spiral-free, disc-like component. Ellipticals and lenticulars can be hard to distinguish from their appearance. Indeed, over the past decade, many galaxies that were thought to be ellipticals have been discovered to contain rotating discs, and thus are actually lenticular galaxies.

From the latest models of galaxy formation and evolution, it is becoming clear that there is a more fundamental distinction in the galaxy population than that between elliptical, lenticular and spiral galaxies (e.g. Ellis, Abraham & Dickinson 2001). To truly understand galaxy evolution, one must separate the components of galaxies: spheroids and discs. Elliptical galaxies are dominated by a single spheroidal component, while most spiral and lenticular galaxies contain both a spheroid (the bulge) and a disc. The striking difference between galaxy types may primarily be a result of variation in the relative prominence of the spheroid and disc components.

A common way of describing the structure of galaxies is through the Sérsic index  $n$ , which describes the radial concentration of the projected light distribution. The Sérsic (1968) function is given by

$$I(r) = I_e \exp \left\{ -b_n \left[ \left( \frac{r}{R_e} \right)^{1/n} - 1 \right] \right\},$$

where  $R_e$  is the effective radius (that is, the radius containing half of the model light),  $I_e$  is the intensity at the effective radius,  $n$  is the Sérsic index and  $b_n$  is a function of Sérsic index and is such that  $\Gamma(2n) = 2\gamma(2n, b_n)$ , where  $\Gamma$  and  $\gamma$  represent the complete and incomplete gamma functions, respectively (Ciotti 1991). Andrae, Melchior & Jahnke (2011) showed that this is the simplest function one could consider to model a galaxy profile, being the first-order Taylor expansion of any real light profile. When  $n$  is equal to the values 0.5, 1 and 4 (and  $b_n$  assumes the values of 0.676, 1.676 and 7.676, respectively), the Sérsic profile is equivalent to a Gaussian, exponential and de Vaucouleurs profile, respectively. A Sérsic

projected profile implies a 3D luminosity density profile involving the Fox  $H$  function (Baes & van Hese 2011).

Elliptical galaxies are typically regarded as single-component structures; hence,  $n$  is a reasonably fundamental description of the profile (but see Cappellari et al. 2011 and Huang et al. 2013a). However, when fitting a single-Sérsic profile to a disc galaxy, the resulting  $n$  reflects the contribution of both the disc and the bulge to the light distribution.

We note that some degeneracy exists, in that appropriate small variations in  $R_e$  and  $n$  can produce similar surface brightness profiles, which are indistinguishable at the resolution and depth of the data we consider. The two quantities are also found to be correlated in the galaxy population. However, e.g. Trujillo, Graham & Caon (2001) showed that the correlation between  $n$  and  $R_e$  is definitely not explained by parameter coupling in the fitting process; this trend between galaxy structure and size exists also when one uses model-independent values. Indeed, it is a natural consequence from the relations existing between the model-independent parameters: total luminosity, effective radius and effective surface brightness.

All galaxies show variations in colour to some degree. These often appear as radial colour gradients, with the centres of galaxies generally redder than their outer regions (at least in the more luminous galaxy population; Jansen et al. 2000). Even the colour of elliptical galaxies varies significantly with radius (e.g. La Barbera et al. 2010a).

Colour gradients provide important information for understanding how galaxies form and evolve. For example, steep gradients are expected when stars form during strongly dissipative (monolithic) collapse in galaxy cores. In such a scenario, gas is retained by the deep potential well, with consequently extended star formation activity and greater chemical enrichment of the inner regions (e.g. Kobayashi 2004).

In early-type galaxies, the main driver of colour gradients is probably metallicity (see, e.g., Saglia et al. 2000; Tamura & Ohta 2000; La Barbera et al. 2003; Spolaor et al. 2009; Rawle, Smith & Lucey 2010; den Brok et al. 2011 and references therein), even though the contribution of the age (see, e.g., La Barbera et al. 2002, 2012; La Barbera & de Carvalho 2009) and even dust (see, e.g., Guo et al. 2011; Pastrav et al. 2013a) cannot be ignored. Structurally, ellipticals may appear to be single-component systems, but that component certainly does not possess a homogeneous stellar population.

Colour gradients are typically stronger in bulge–disc systems. Bulges tend to contain older, redder stars of higher metallicity than those found in the discs of galaxies (e.g. Johnston et al. 2012 and references therein). Shorter optical wavelengths are more sensitive to the young, blue populations typically found in discs, whereas longer (optical and NIR) wavelengths increasingly trace the old stellar population of both components. Most late-type galaxies therefore display a substantial colour gradient from red centres to blue outskirts (de Jong 1996b; Gadotti & Dos Anjos 2001; MacArthur et al. 2004), though peculiar galaxies can show opposing trends (Taylor et al. 2005).

In addition to stellar population gradients, the dust content of a galaxy can produce colour gradients and influence the measured structural parameters in a wavelength-dependent manner (Peletier & Balcells 1996; Möllenhoff, Popescu & Tuffs 2006; Graham & Worley 2008; Kelvin et al. 2012; Pastrav et al. 2013a; Rodríguez & Padilla 2013). However, it remains unclear whether dust attenuation or stellar population gradients are the dominant factor in determining how observed galaxy structure varies with wavelength.

Park & Choi (2005) have shown how colour gradients may be used as a morphological classifier, while Lee et al. (2008) found that steeper colour gradients appear within star-forming galaxies, in both late and early types. Atypical gradients can be used to identify interesting populations. For example, Suh et al. (2010), studying early-type galaxies drawn from the Sloan Digital Sky Survey (SDSS) DR6, found a tight correlation between the existence of steep colour gradients and centrally concentrated residual star formation. They suggest a relation such that elliptical galaxies with bluer cores present globally bluer colours than average. Ferreras et al. (2009) found the same relation for spheroidal galaxies observed by the *Hubble Space Telescope* at  $0.4 < z < 1.5$ .

Most of the studies mentioned so far have focused on measuring radial colour gradients, rather than considering how their profile shapes depend on wavelength. However, variations in colour with radius directly imply that the light profile must change with wavelength, in terms of varying  $n$  and  $R_e$ .<sup>1</sup> In general, therefore, the values measured for  $n$  and  $R_e$  will depend on the observed wavelength.

Some works have started investigating the wavelength dependence of galaxy structure, fitting Sérsic models independently to images in different wavebands. La Barbera et al. (2010a) presented for the first time a careful analysis of the structural parameters of low-redshift early-type galaxies as a function of wavelength. They showed that  $R_e$  decreases by 35 per cent from the optical to the NIR, reflecting the internal colour gradients in these systems. Their Sérsic indices span a domain from  $\sim 2$  to 10, with a median of six for all wavebands. Kelvin et al. (2012) presented similar two-dimensional, single-Sérsic model fits to a large sample of low-redshift galaxies. They found that the mean Sérsic index of early types shows a smooth variation with wavelength, increasing by 30 per cent from  $g$  through  $K$ , while the effective radius decreases by 38 per cent across the same range. In contrast, late types exhibit a more extreme change in Sérsic index, increasing by 52 per cent, but a more gentle variation in effective radius, decreasing by 25 per cent. These trends are interpreted as due to the effects of dust attenuation and stellar population/metallicity gradients within galaxy populations.

When fitting images at different wavelengths, completely independently, statistical and systematic variations in the recovered centre, ellipticity, position angle, etc. will translate into noise in the recovered trends for  $n$  and  $R_e$ . This is particularly an issue if one wants estimates of the wavelength dependence of structure on a galaxy-by-galaxy basis. To address this, some parameters may be fixed to fiducial values, while the parameters of interest are allowed to vary. However, it is not clear how to fairly determine such fiducial values.

In this paper, we build upon the work of La Barbera et al. (2010a) and Kelvin et al. (2012), by fitting a single, wavelength-dependent model to all the data simultaneously. This is made possible using an extended version of GALFIT (Peng et al. 2002, 2010) developed by the MegaMorph project (Bamford et al. 2012; Häußler et al. 2013, hereafter H13; Vika et al. 2013; Bamford et al., in preparation). This approach maximizes the signal-to-noise (S/N) available to constrain the model and ensures that the parameters are optimal for the whole data set. The greatest advantages of this approach are expected when decomposing galaxies with multiple components (e.g. Cameron et al. 2009). Making colour information available to the fit increases the robustness with which the components can be separated,

and hence improves the accuracy and physical meaningfulness of their recovered parameters. However, to begin, we have explored the performance of our technique in fitting single-component models. H13 have tested the new method on large data sets, automating both the preparation of the data and the fitting process itself by extending the existing GALAPAGOS (Barden et al. 2012) code. Vika et al. (2013), on the other hand, studied nearby galaxies and assessed our method by fitting artificially redshifted versions of these galaxies.

Having at our disposal structural parameters obtained via a consistent multiwavelength approach from MegaMorph, we can now study the wavelength dependence of Sérsic index and effective radius for both individual galaxies and sample populations. In this paper, we quantify these trends using the ratio of  $n$  and  $R_e$  at two wavelengths. These ratios provide a simple but powerful parametric way of considering galaxy colour gradients, which reveal information about the prevalence of galaxies with different internal structures, and how this varies with other galaxy properties. At a more practical level, quantifying how  $n$  and  $R_e$  vary with wavelength is crucial for removing biases when comparing measurements made using different bandpasses or at different redshifts.

The paper is organized as follows: in Section 2, we present the data set used for the analysis and describe the properties of the sample we analysed. In Section 3, we show our results for the wavelength dependence of Sérsic indices and effective radii, first by considering trends for subsamples of the galaxy population and then by quantifying the behaviour of individual galaxies. In Section 4, we discuss the interpretation of our measurements and demonstrate how they relate to the visual appearance of galaxies. In Section 5, we discuss our results in the context of previous work. Finally, in Section 6, we summarize and present our conclusions.

The analysis has been carried out using a cosmology with  $(\Omega_m, \Omega_\Lambda, h) = (0.3, 0.7, 0.7)$  and AB magnitudes.

## 2 DATA

### 2.1 Sérsic models and parent sample selection

The sample of galaxies considered in this paper has been previously presented in H13. A detailed description of the selection criteria, robustness of the fits and properties of our sample can be found in that paper; here, we give a brief overview. Our sample is drawn from the Galaxy And Mass Assembly survey II (GAMA; Driver et al. 2009, 2011), the largest homogeneous multiwavelength data set currently available, in terms of both spatial volume and wavelength coverage. GAMA is primarily a redshift survey, but it is supplemented by a highly consistent and complete set of multiwavelength data, spanning from the far-UV to radio.

The GAMA imaging data include five-band optical (*ugriz*) imaging from SDSS (York et al. 2000) and four-band NIR (*YJHK*) imaging from the Large Area Survey (LAS) component of the UKIRT Infrared Deep Sky Survey (UKIDSS; Lawrence et al. 2007). All of these bands have a depth and resolution amenable to Sérsic-profile fitting (as demonstrated by Kelvin et al. 2012). Conveniently, the images for all nine bands have been ‘microregistered’ on to the same pixel grid (using SWARP, Bertin et al. 2002; Bertin 2010, as described in Hill et al. 2011) and rescaled to a common zero-point of 30 mag, which are essential for our purposes.

Our sample is limited to galaxies in one region of GAMA, the equatorial field at 9 h RA (known as *G09*). The multiwavelength imaging data provided by GAMA are analysed using a modified version of GALAPAGOS (Barden et al. 2012). This version (GALAPAGOS-2)

<sup>1</sup> Of course, it may also depart from a Sérsic profile, but if we assume Sérsic profiles at all wavelengths – as is reasonably well justified (Andrae et al. 2011) – then most variations will be captured by changes in  $n$  and  $R_e$ .

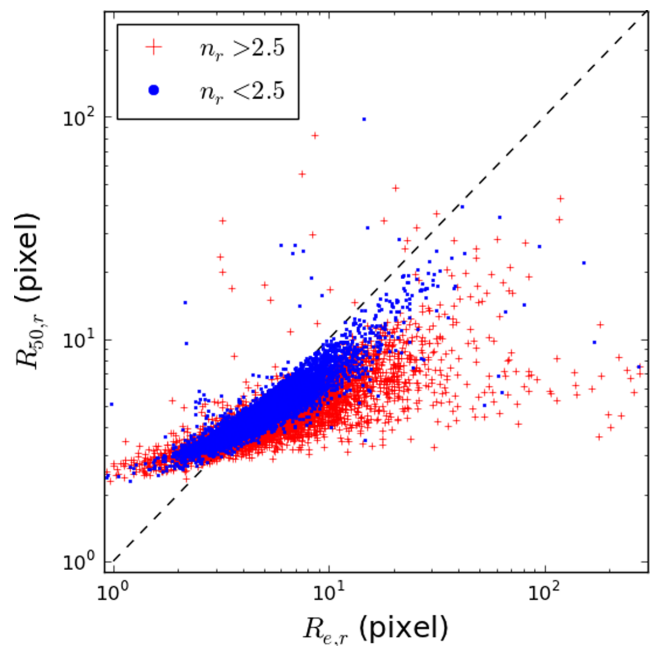
has been adapted for use on multiwavelength, ground-based data, as described in detail in H13. This software enables the automated measurement of wavelength-dependent Sérsic profile parameters for very large samples of galaxies in a homogeneous and consistent manner. To fit each galaxy, GALAPAGOS-2 utilizes a recently developed multiwavelength version of GALFIT (which we refer to as GALFITM). This extended version of GALFIT was introduced in H13 and is described in detail in Bamford et al. (in preparation). We refer the interested reader to this paper and H13 for further details and technical background reading.

GALFITM fits a single wavelength-dependent model to all the provided images simultaneously. Rather than fitting the parameter values at the wavelength of each band, GALFITM fits the coefficients of a smooth function describing the wavelength dependence of each parameter. Specifically, GALFITM employs Chebyshev polynomials, with a user-specifiable order for each parameter, which controls the desired smoothness of their wavelength dependence. For example, the  $x$  and  $y$  coordinates of the galaxy centre may be allowed to vary, but remain a constant function of wavelength. Magnitudes could be allowed to vary completely freely, by setting a sufficiently high polynomial order. Other parameters may be allowed to vary at a lower order, providing flexibility to obtain a good fit, while avoiding unjustified (physically or by the data quality) variability and reducing the dimensionality of the model.

In the fitting process for this paper, we allow full freedom in magnitudes, while Sérsic index and  $R_e$  are allowed to vary with wavelength as second-order polynomials. All other parameters ( $x$  and  $y$  position, position angle and axis ratio) are selected to be constant with wavelength.

Amongst other data, GALAPAGOS-2 returns magnitudes ( $m$ ), Sérsic indices ( $n$ ) and effective radii ( $R_e$ ), calculated at the wavelength of each input image. To investigate the reliability of our size determinations, we have compared our  $R_e$  measurements to an alternative, less model-dependent estimate of galaxy size. For convenience, we use the standard half-light radius,  $R_{50}$ , provided by SExtractor during the initial stages of GALAPAGOS. This is the radius containing half of the total flux within the Kron aperture (Kron 1980; Bertin & Arnouts 1996), obtained independently for each bandpass. Fig. 1 shows the comparison of these sizes in the  $r$  band, for galaxies with  $n_r < 2.5$  and  $n_r > 2.5$ . We see very similar relations in all other bands. There is a clear correlation between the two size estimates, but also obvious deviations from a one-to-one line.  $R_{50}$  tends to  $\sim 2$  pixel for small objects, due to the effect of the point spread function (PSF) and pixelization. Both of these are accounted for by the Sérsic fit, and hence  $R_e$  suffers less bias at small sizes. For larger galaxies,  $R_{50}$  is consistently smaller than  $R_e$ . This is a result of Kron apertures missing flux in the outer regions of galaxies. The half-light radii are thus systematically underestimated. The fraction of missed flux depends on the profile shape (Graham & Driver 2005) such that the size is underestimated more, and with greater variation, for higher  $n$  objects. Sérsic sizes are therefore often regarded as being more reliable than aperture-based measurements (Graham et al. 2005).

GALAPAGOS-2 also returns the coefficients that describe the polynomial wavelength dependence of each parameter. As described below, this function can be used to ‘interpolate’ between the bands, e.g. in order to derive rest-frame values. On high S/N data, one could in principle fit each band independently and then fit a polynomial to the individual-band results in order to derive a continuous function of wavelength. On high S/N data, for single-component fits, this would give more or less equivalent results to our approach. However, on lower S/N images, our approach is substantially more



**Figure 1.** Comparison between the effective radius in  $r$  band obtained by GALFITM and the radius containing half the flux within the Kron aperture in  $r$  band, for the galaxy sample described in Section 2.2. Red crosses: galaxies with  $n_r > 2.5$ . Blue dots: galaxies with  $n_r < 2.5$ . Dashed line represents the 1:1 line.

robust (Bamford et al., in preparation; H13; Vika et al. 2013). Nevertheless, there are cases where directly using the fit polynomial function to interpolate between bands is inadvisable.

If a high degree of freedom is given to a certain parameter (e.g. magnitude in our case), the polynomial may oscillate between the wavelengths at which it is constrained by data, and especially in regions close to the edge of the wavelength range of the input data. This is a general issue encountered when fitting polynomials, known as ‘Runge’s phenomenon’.<sup>2</sup> As a consequence, we do not use the polynomial derived for the magnitudes to directly calculate rest-frame magnitudes for all objects. Instead, we recommend using the magnitudes derived for each input band to accurately estimate rest-frame magnitudes and colours using a stellar population fitting code.

## 2.2 Our galaxy selection

We match our sample to the GAMA redshift catalogue (SpecObjv21). For the galaxies in the catalogue, we compute absolute magnitudes by applying INTEREST (Taylor et al. 2009) to our measured photometry. This tool determines rest-frame colours by interpolating the observed photometry, using a number of template spectra as guides (for details, see Rudnick et al. 2003).

For Sérsic index and effective radii, the polynomial order is sufficiently low that Runge’s phenomenon is not an issue. We can therefore conveniently calculate rest-frame values directly using the respective Chebyshev functions returned by GALFITM, provided the required wavelength is in the range covered by the input data. For the remainder of this paper, all mentions of wavelength, or ‘band’, refer to rest-frame quantities, unless explicitly stated otherwise.

<sup>2</sup> This effect is discussed further in Bamford et al. (in preparation).

As in H13, the catalogue resulting from GALAPAGOS-2 has been cleaned in order to select only the objects that have been successfully fitted by GALFITM. In particular, we wish to identify and discard fits with one or more parameters lying on (or very close to) a fitting constraint. Such a fit is unlikely to have found a true minimum in  $\chi^2$  space and is indicative of a serious mismatch between the model profile and the object in question. The selection also serves to remove stars from the catalogue. Following H13, we extract those galaxies that satisfy the following criteria:

(i)  $0 < m < 40$  at all wavelengths, where  $m$  is the total apparent output magnitude in each band.

(ii)  $m_{\text{input}} - 5 < m < m_{\text{input}} + 5$ , where  $m_{\text{input}}$  is the starting value of the magnitude in each band. These are derived by scaling an average galaxy SED (obtained from previous fits) by the `mag_best` value measured by SExtractor during the object detection. As it is known (e.g. Häußler et al. 2007) that GALFIT is very stable against changing the starting values, such an approach is valid and was easy to implement into GALAPAGOS-2 (see H13 for details). During the fit, we allow a generous  $\pm 5$  mag variation from these starting values.

(iii)  $0.201 < n < 7.99$ , since fits with values outside these ranges are rarely meaningful (Vika et al. 2013; though note that some elliptical galaxies are indeed measured to have  $n > 8$ , e.g. as shown in Caon, Capaccioli & D’Onofrio 1993.)

(iv)  $0.301 < R_e < 399.0$  pixel, which maintains values in a physically meaningful range and prevents the code from fitting very small sizes, where, due to oversampling issues, the fitting iterations become very slow.

(v)  $0.001 < q \leq 1.0$ , where  $q$  is the axis ratio, to ensure that the fit value is physically meaningful. In practice, this constraint is barely ever encountered.

This catalogue cleaning is done on all bands simultaneously, i.e. if any value of the fit fails to meet the above criteria for any band, the entire fit is considered unsuccessful.<sup>3</sup>

We additionally exclude objects with:

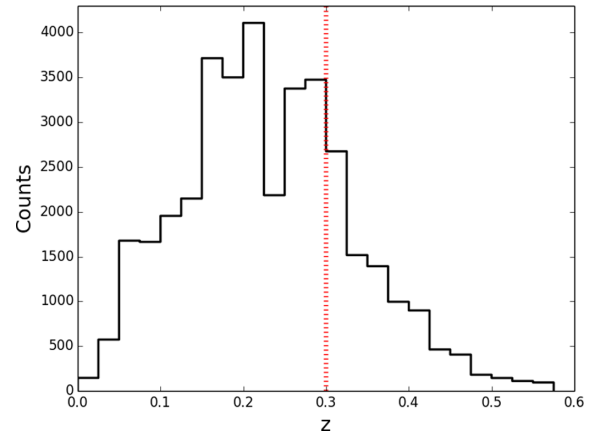
- (i)  $132.6 \leq \alpha \leq 142.0$  and  $-1.55 \leq \delta \leq -0.50$ ;
- (ii)  $135.2 \leq \alpha \leq 135.7$  and  $-0.35 \leq \delta \leq +0.20$ ;
- (iii)  $130.0 \leq \alpha \leq 131.2$  and  $-2.50 \leq \delta \leq -1.20$ ;

which are objects close to areas for which at least one of the infrared bands (*YJHK*) does not provide good data quality. The first one of these areas has no data coverage in the *J*-band image, the other two are close to very bright stars which caused scattered light in the image, essentially making them unusable in some of the band in these areas. Rather than fitting different galaxies using different combinations of bands, we prefer to maintain a homogeneous data set and excluded galaxies in these areas.

### 2.3 Galaxy samples

To make quantitative, representative statements, we choose to volume limit our sample. We also wish to demonstrate our ability to obtain meaningful multiwavelength structural measurements with

<sup>3</sup> Please note that the last criterion used in H13 ( $95 - 5 \times \text{mag\_best} < \text{fwhm\_image}$  and  $\text{fwhm\_image} < 1$  pixel) is not used in this paper. The purpose of this cut was to separate (mainly saturated) stars from galaxies in order to derive a cleaner galaxy sample for code testing and comparing single- and multiband fitting techniques. In this paper, this step is not necessary as galaxies are selected by a redshift criterion. Avoiding it prevents us from accidentally removing bright, compact galaxies from our sample.



**Figure 2.** Redshift histogram of our parent sample. Only galaxies with  $0.01 < z < 0.3$  are included in the subsequent analysis.

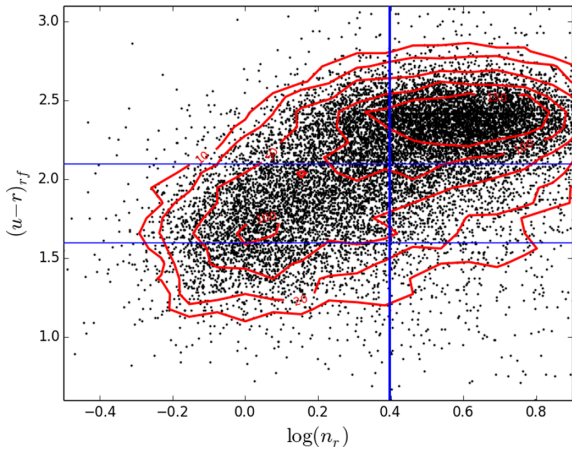
low-resolution data, so we elect to push our sample selection to relatively high redshifts. We therefore focus on the intrinsically bright galaxy population in this paper.

Fig. 2 shows the redshift histogram of all galaxies in the H13 sample with a reliable spectroscopic redshift estimate. We limit our analysis to galaxies at  $0.01 < z < 0.3$ . For the selected redshift range, the rest-frame equivalents of all bands up to and including *H* are within the observed ( $u-K$ ) wavelength range, and thus their values can be interpolated. The rest-frame equivalent for our reddest observed band, *K*, is obviously always extrapolated, hence unreliable, and we therefore exclude it from our analysis.

The nominal apparent magnitude limit of the GAMA II redshift survey is  $r < 19.8$  mag, which corresponds to a total absolute magnitude  $M_r < -21.2$  mag at  $z < 0.3$ . Imposing this absolute magnitude limit gives us a complete, volume-limited sample of 14 274 galaxies. Note that this selection means that our results are limited to the relatively high-luminosity galaxy population.

The aim of this paper is to carefully analyse how galaxy structural parameters change as a function of wavelength. We expect different types of galaxies to behave in contrasting ways. We therefore separate galaxies according to their colour and structure. Throughout the paper, we use the rest-frame  $(u-r)_{\text{rf}}$  colour, and the *r*-band Sérsic index,  $n_r$ , as our reference for separating populations. The choice of colour is not critical. However, bracketing the 4000 Å break,  $(u-r)_{\text{rf}}$  performs well for separating red and blue populations, despite the noisiness in the SDSS *u* band. After some experimentation,  $n_r$  turned out to be the best choice for separating high- and low-concentration populations, which roughly correspond to early- and late-type morphologies in our luminous galaxy sample. Choosing  $(u-r)_{\text{rf}}$  and  $n_r$  also facilitates comparison with previous SDSS studies.

Fig. 3 plots colour versus Sérsic index for our sample. These are clearly correlated, and the well-known bimodality (e.g. Kauffmann et al. 2003; Driver et al. 2006) is evident. Galaxies may be optimally divided into two types using a sloping cut in this plane. However, we find it is informative to study the behaviour with respect to colour and Sérsic index in more detail, and thus apply selections to these two quantities independently. We empirically divide galaxies into red and blue using the cut  $(u-r) = 2.1$ . Traditionally, the division by colour also includes a magnitude dependence; however, this is a small effect, particularly at the bright magnitudes considered in this paper. To avoid complicating our analysis, we prefer this simple cut. In addition to separating red and blue galaxies, we are also



**Figure 3.**  $(u - r)_f$  versus  $n_r$  for the galaxies in our sample. Lines illustrate the cuts we apply to divide the galaxies by colour and Sérsic index.

**Table 1.** Number count and fraction (of the total sample) for galaxies with different combinations of colour and Sérsic index. Errors are binomial. The choice of the band adopted for the Sérsic index separation does not considerably alter the fractions.

Colour	$n_r < 2.5$		$n_r > 2.5$	
<i>Blue</i>	1391	$9.7 \pm 0.2$ per cent	309	$2.2 \pm 0.1$ per cent
<i>Green</i>	3183	$22.3 \pm 0.4$ per cent	1263	$8.8 \pm 0.2$ per cent
<i>Red</i>	2321	$16.3 \pm 0.3$ per cent	5807	$40.7 \pm 0.4$ per cent

interested in the bluest population, which may host starbursts. We therefore further subdivide the  $(u - r) < 2.1$  population into ‘green’ and ‘blue’ galaxies, using a cut at  $(u - r) = 1.6$ . We note that our ‘green’ galaxies do not correspond to what is commonly understood as the ‘green valley’, between the blue and red modes. We simply adopt this name to describe objects with blue, but not extremely blue, colours. Henceforth, we use italics to explicitly indicate when we are referring to the *red*, *green* or *blue* samples.

We further divide galaxies by Sérsic index, with the aim of better separating disc galaxies from ellipticals. Following previous works (e.g. Barden et al. 2005), we adopt a cut of  $n_r = 2.5$ . From now on, we will refer to ‘*low-n*’ galaxies with  $n_r < 2.5$  and ‘*high-n*’ galaxies with  $n_r > 2.5$ .

With these combined cuts, we can compare the two main galaxy populations: *green low-n* systems, which correspond to star-forming, disc-dominated galaxies, and *red high-n* systems, which are typically passive spheroid-dominated galaxies. We can also examine the properties of galaxies which do not respect the majority behaviour.

We caution the reader that these definitions do not extend down to the fainter dwarf galaxies. Our sample selection is limited to luminous galaxies, so trends discussed in this paper do not represent the faint population.

Table 1 summarizes the fraction of galaxies corresponding to our different colour and Sérsic index selections. As expected, most *red* galaxies ( $\sim 70$  per cent) are characterized by large values of Sérsic index, while the vast majority of *blue* ( $\sim 82$  per cent) and *green* galaxies ( $\sim 73$  per cent) display small values of Sérsic index.

In the next section, we study how the structural properties of galaxies, characterized by different colours and surface brightness profiles, vary with wavelength.

### 3 RESULTS

Trends in galaxy properties with wavelength may be studied from two perspectives. One can investigate correlations for an entire galaxy population, or measure variations in individual galaxies. The first approach is useful when the variations in individual galaxies are noisy. Combining large samples allows one to identify trends which would be obscure for individual objects. Such population trends do not guarantee that galaxies individually follow the average trend, but they can place constraints on the range of variation for individual galaxies. Averaged trends also do not allow one to easily select subsamples with specific properties. The second approach is possible when one has sufficiently reliable measurements. In this case, it is preferable to study the distributions of those measurements directly. In this way, one can examine how consistent the trends are across the galaxy population and isolate subsamples with different behaviour.

We first consider trends in Sérsic index and effective radius versus wavelength, averaged across various subsets of the galaxy population. We then consider the distributions of these trends for individual galaxies. These individual measurements allow us to study correlations of the trends with other quantities, and consider their use in classifying galaxies. We show that the population trends, like those presented by La Barbera et al. (2010a) and Kelvin et al. (2012), do successfully capture the typical wavelength variation of Sérsic index and effective radius in individual galaxies. Finally, we investigate the correlations between wavelength variations in Sérsic index and effective radius, finding highly contrasting behaviour for early- and late-type galaxies.

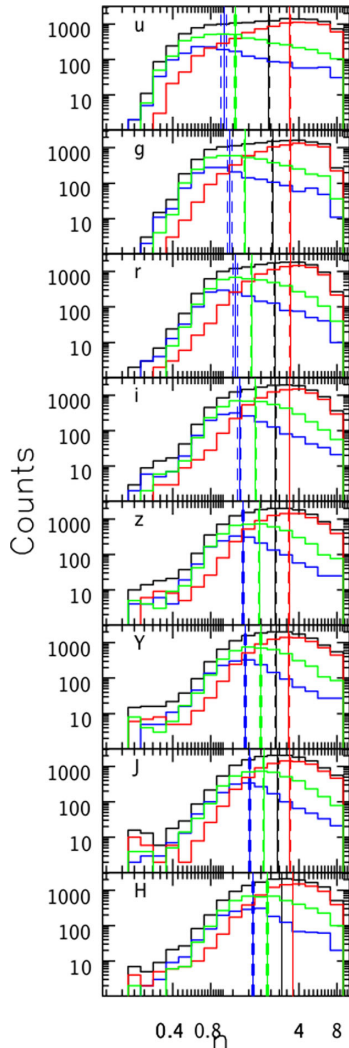
This section will focus on presenting the observed variation of Sérsic index and effective radius and their respective ratios at different wavelengths. First, we consider Sérsic index and effective radius individually in Sections 3.1 and 3.2, respectively. Then, in Section 3.3, we examine correlations between their behaviour. In Section 4, we will confirm the meaning of our results, and discuss their interpretation, with the aid of stacked images.

#### 3.1 Wavelength dependence of the Sérsic index

##### 3.1.1 Population trends

To begin, we examine the distribution of Sérsic index and its variation with wavelength, for a variety of samples. We first consider the overall galaxy population divided using the colour cuts described in Section 2.3. These distributions are plotted for each passband in Fig. 4. The wavelength dependence of the Sérsic index distribution for the full magnitude-limited sample of GAMA galaxies has previously been presented by Kelvin et al. (2012), based on independent fits to each band. Kelvin et al. also divide into spheroid- and disc-dominated systems using a joint cut on  $(u - r)$  and  $n_K$ . Here, we show in Fig. 4, a volume-limited sample with measurements obtained using our multiband method, meaning that we have measurements in every band for the whole sample. Furthermore, unlike Kelvin et al. (2012), we divide populations using colour alone, which results in a less clean division of galaxy type, but avoids the ambiguity of plotting distributions for samples that have been selected using the plotted quantity. Despite these differences, the behaviour we see is very similar to that found by Kelvin et al. (2012).

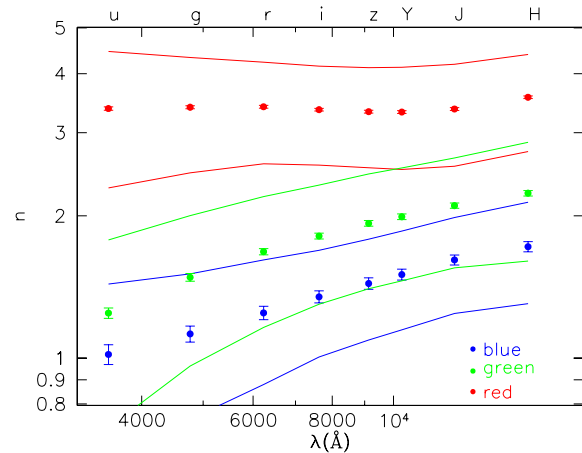
As it is well known, and also as seen in Fig. 3, galaxies of different colour are characterized by very different Sérsic index distributions: the median Sérsic index across all wavelengths is  $3.39 \pm 0.07$ ,



**Figure 4.** Sérsic index distribution for our full sample (black line) and for galaxies in each of our colour subsamples (*red*, *green*, *blue*). Each panel shows the distribution in a different band: *ugrizYJH*. The median of each distribution, and its uncertainty, are indicated by vertical solid and dashed lines, respectively. The median Sérsic index for *red* galaxies does not depend on wavelength, while for our *green* and *blue* subsamples, the Sérsic index increases significantly towards redder wavelengths.

$1.8 \pm 0.3$  and  $1.4 \pm 0.2$  for *red*, *green* and *blue* galaxies, respectively. The quoted uncertainties on the median are estimated as  $1.253\sigma/\sqrt{N}$ , where  $\sigma$  is the standard deviation about the median and  $N$  is the number of galaxies in the sample under consideration (Rider 1960).

In addition to their different medians, Fig. 4 shows that the *blue* and *red* samples are skewed in opposite directions. The *green* sample follows the same distribution as the *blue* sample at *low-n*, but has a higher proportion of *high-n* objects. Galaxies of different colour thus dominate at different Sérsic indices. Colour is therefore a reasonably good predictor of galaxy structure, and vice versa. However, remember that often we wish to study colour (e.g. as an indicator of star formation history) versus galaxy structure, and so frequently need to identify galaxies with contrasting structure without reference to their colour. Also, note that there is a significant region of overlap at intermediate Sérsic index, where the majority of galaxies are found.



**Figure 5.** Median Sérsic index as a function of wavelength for our *red*, *green* and *blue* galaxy subsamples. Error bars represent the uncertainty on the median. Solid lines indicate the 16th- and 84th-percentiles of the distribution. The *red* subsample clearly behaves differently to our *green* and *blue* subsamples: the Sérsic index of red galaxies is very stable across all optical–NIR wavelengths, while Sérsic index shows a steady increase with wavelength for bluer galaxies.

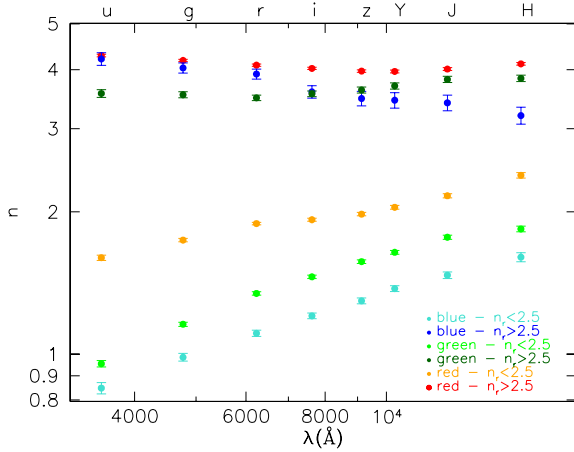
The overall distribution becomes more strongly peaked and moves to higher values of  $n$  with increasing wavelength. A similar trend is observed for each of the *red*, *green* and *blue* subsamples. However, whereas the whole distribution shifts for *blue* and *green* galaxies, the only change for *red* galaxies is a slight decline in the proportion of *low-n* galaxies. The median  $n$  for red galaxies is therefore almost perfectly constant with wavelength, while the medians for the bluer samples vary significantly. Many blue galaxies must significantly change appearance from the *u* to the *H* band.

Having examined the full distributions in Fig. 4, we present the variation in median Sérsic index as a function of wavelength more compactly in Fig. 5. The lack of variation in Sérsic index with wavelength for *red* galaxies indicates that they principally comprise one-component objects, i.e. elliptical galaxies, or two-component galaxies in which the components possess very similar colours, i.e. lenticulars. In contrast, the systematically lower values and more substantial trends exhibited by *green* and *blue* galaxies are consistent with them being two-component systems, comprising both a blue, *low-n* disc and red, *high-n* bulge, with the disc being more dominant for bluer galaxies. Of course, various other types of galaxies may be present in the galaxy population, e.g. spirals with blue, *low-n* bulges; but the simple picture above might be enough to explain much of the behaviour displayed by the samples we consider.

However, at least some of the variation in Sérsic index with wavelength could also be attributed to dust attenuation. The low Sérsic index and blue colours of these systems may indicate that they contain star-forming discs. An increase in Sérsic index with wavelength is in qualitative agreement with predictions of the effect of dust from radiative transfer models of galaxy discs (Pastrav et al. 2013a).

Finally, the observed trends may include variations in the disc stellar population (i.e. age and metallicity) with radius (as found by Beckman et al. 1996; de Jong 1996b; Pompei & Natali 1997; Waller et al. 2003; MacArthur et al. 2004). However, it is not clear whether such gradients would manifest themselves as variations in Sérsic index with wavelength.

We remind the reader that in the above analysis we have not applied any cut in  $n$ : a cut in the colour–magnitude plane results in



**Figure 6.** Median Sérsic index as a function of wavelength for galaxies of different colour and Sérsic index. Red, dark green and blue symbols represent *high-n* galaxies; orange, light green and turquoise symbols *low-n* galaxies. Error bars represent the uncertainty on the median. Differences between *low-n* and *high-n* galaxies are striking: the Sérsic index for *high-n* objects only slightly depends on wavelength and it is systematically higher than the Sérsic index of *low-n* galaxies, which strongly depends on wavelength.

a natural separation of galaxies with small and large Sérsic index. However, the correlation is not perfect, as is clear from Fig. 3. As previously mentioned, Kelvin et al. (2012) address this by defining a joint cut in  $(u - r)$  versus  $n_K$  to divide all galaxies into one of two classes. We build on their analysis by taking a complementary approach. Objects with combinations of colour and Sérsic index contrary to the majority, e.g. red spirals and blue ellipticals, potentially correspond to interesting stages of galaxy evolution. Studying these may illuminate the physical processes responsible for the structural and star formation histories of galaxies. We therefore proceed by considering subsamples defined by independent cuts in both colour and Sérsic index, as described in Section 2.3.

Fig. 6 shows the dependence of median Sérsic index on wavelength for these six different populations. The different behaviour of galaxies with low and high Sérsic index is striking. *High-n* galaxies consistently display much less Sérsic index variation with wavelength than *low-n* galaxies. *Red, high-n* galaxies show no significant dependence on wavelength (in agreement with the results of La Barbera et al. 2010a for early-type galaxies). The median value across all wavelengths is  $4.10 \pm 0.09$ . Therefore, on average, they possess a classic de Vaucouleur profile at all wavelengths. *Green* and *blue* galaxies with *high-n* show a mild dependence on wavelength. Both have a median Sérsic index of  $\sim 3.5$ , and are equal in the *i* band. However, the median  $n$  for *blue* (*high-n*) galaxies decreases towards redder wavelengths (the Pearson product–moment correlation coefficient is  $r = -0.98$ , indicating a high significance), while *green* (*high-n*) galaxies show the opposite trend, increasing towards redder wavelengths ( $r = 0.8$ , significant at the 99 per cent level). This interesting contrast, which is also seen for individual galaxies in the next section, is our main motivation for considering *green* and *blue* galaxies as separate samples.

For *low-n* galaxies, the median Sérsic index shows a substantial trend with wavelength, increasing from the *u* to *H* band. The median Sérsic index and the strength of its variation with wavelength depend on the colour of the population considered. The median value systematically increases from *blue* to *green* to *red* galaxies, while the strength of the trend with wavelength is similar for *blue* and *green* samples, but shallower for *red* galaxies. Comparing to Fig. 5,

it is apparent that adopting a cut only in colour mixes populations and thus loses useful information. *Blue* and *green* galaxies with *high-n* actually show similar trends to the overall *red* population, although they number too few to influence the trends when no cut in Sérsic index is applied. Similarly, the trend for *red* galaxies with *low-n* resembles those of *blue* and *green* galaxies. *Low-n* galaxies make up a significant proportion of the red population, and thus they substantially reduce the median value of red galaxies when Sérsic index is not taken into account. The degree of variation of Sérsic index with wavelength is more closely related to the overall value of Sérsic index than to colour.

The adopted Sérsic index cut at  $n_r = 2.5$  does not appear to significantly alter the trends we recover for the *low-n* and *high-n* populations. The  $n$  distributions for each colour sample are sufficiently distinct and narrow that only a small fraction of each distribution is affected by the Sérsic index cut. This is apparent from the observations that the standard deviations of the *red* and *green* distributions only just cross in Fig. 5, and the average of the *red, low-n* sample in Fig. 6 extends to almost  $n = 2.5$  in the *H* band, without any sign that the trend is being suppressed. Given that our subsample definitions are based on Sérsic indices in only one band (*r*), it is also reassuring to note that the spheroidal population retains high Sérsic index values across all wavelengths. This indicates that performing the Sérsic index separation in different bands would not substantially affect the samples, nor the above results. However, Fig. 6 does suggest that separating in bluer bands, where the populations are better separated, is advisable.

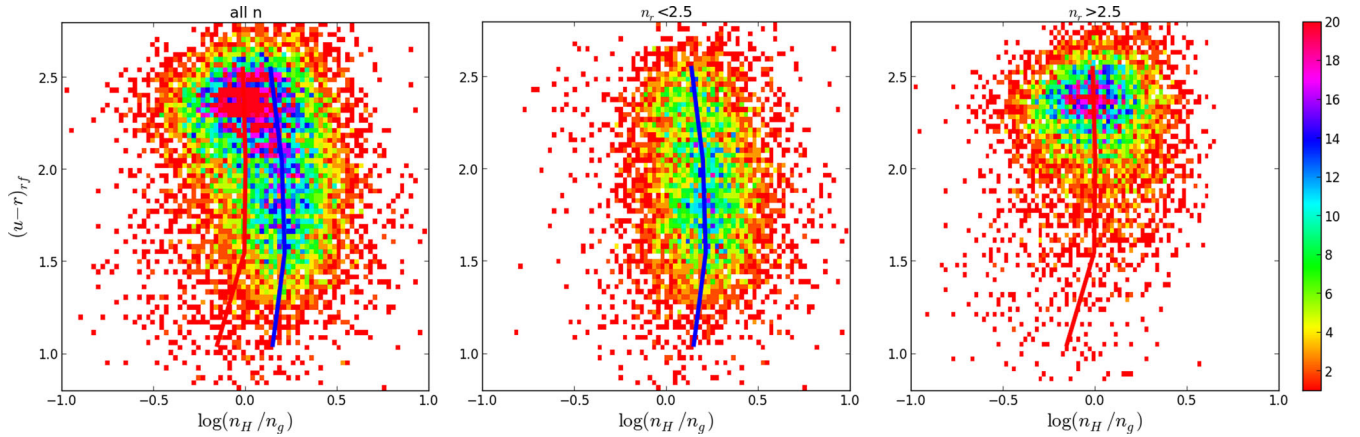
### 3.1.2 Sérsic index versus wavelength for individual galaxies

The analysis we have presented so far considered average trends across a sample of galaxies. If all galaxies in a given sample behave in the same way, then the trends in the average do reflect the trends in the individual galaxies. However, there is the possibility that individual galaxies have behaviours which cannot be easily identified from the distributions of Sérsic index in different bands. For example, if the average  $n$  for a sample does not change between two bands, it could be that all the constituent galaxies have constant  $n$ , but it is also plausible that half the galaxies increase their  $n$  while the other half decrease, or that most remain constant while a minority display a significant trend, etc. We have already seen such behaviour when dividing by colour: different trends have been revealed for particular subsamples. In this case, we were able to discover this by dividing by Sérsic index, but ideally we would like to look for such trends directly in the full sample.

In this section, we aim to explore the wavelength dependence of Sérsic index for individual galaxies. This is difficult when fitting galaxies independently in each band. However, as shown by H13, our multiband method dramatically reduces the noise on such measurements and avoids cases where galaxies are successfully fitted in some bands, but not in others.<sup>4</sup>

We thus have measurements of Sérsic index in every band for all objects in our sample. With this information, it is possible to devise various ways of quantifying the wavelength dependence of Sérsic index. In this paper, we take the conceptually and computationally simple approach of comparing values at particular pairs of wavelengths, by taking their ratio. We will investigate what these ratios

<sup>4</sup> We have confirmed this by making versions of the figures in this paper based on single-band fits. These all contain dramatically fewer objects which pass our quality control cuts, and the distributions show much larger scatter.



**Figure 7.** Density map of  $(u - r)$  colour versus the ratio of the  $H$ -band Sérsic index and  $g$ -band Sérsic index, defined here as  $\mathcal{N}_g^H = n_H/n_g$ . The left-hand panel displays all galaxies together, while centre and right panels show only galaxies with low and high Sérsic indices, respectively. The median  $\mathcal{N}_g^H$  as a function of colour is also plotted, for both the *low-n* (blue line) and *high-n* (red line) samples. These two populations show different distributions, indicating that their constituent galaxies possess different internal structures. *High-n* galaxies have  $\mathcal{N} \sim 1$ , indicating that the central concentration of their profile tends not to change with wavelength. On the other hand, *low-n* galaxies generally display peakier profiles in the red, particularly those with intermediate colour.

can tell us about the correlations between galaxy stellar populations and spatial structure.

For compactness, we adopt the notation  $\mathcal{N}_b^r = n(r)/n(b)$ , where  $n(r)$  and  $n(b)$  are the Sérsic indices in some (rest-frame) red and blue band, respectively (we thus generally maintain the same convention as colour). Using a ratio, rather than a difference, is appropriate, as the physical distinction between profiles separated by constant  $\Delta n$  decreases for larger  $n$ ; i.e. there is more ‘difference’ between  $n = 1$  and  $1.5$  profiles, than between  $n = 4$  and  $4.5$  profiles. This is the same reason why  $n$  is usually plotted with a logarithmic scale. However, the use of a ratio results in asymmetric behaviour when plotted linearly: low ratios are confined to between 0 and 1, while high ratios may extend to infinity. To avoid this, we usually plot  $\mathcal{N}$  on a logarithmic scale. These choices result in distributions that look much more symmetrical and Gaussian than otherwise, justifying our approach.

We begin by inspecting how galaxy colour varies with  $\mathcal{N}$ , and specifically focus on the dependence of  $(u - r)$  on  $\mathcal{N}_g^H = n_H/n_g$ . This combination of bands ( $H$  and  $g$ ) is favoured here, and throughout the paper, as it is the pair with the longest robust wavelength baseline ( $u$  is noisy and  $K$  is extrapolated).

The left-hand panel of Fig. 7 shows that the colour bimodality is accompanied by a shift of the blue population to higher values of  $\mathcal{N}_g^H$  than the red population. The remaining two panels divide the sample by Sérsic index, and demonstrate that *low-n* and *high-n* galaxies display different distributions in this diagram. For *low-n* galaxies, which span a wide range of  $(u - r)$ , the median  $\mathcal{N}_g^H$  at any colour is greater than one. This agrees with the *low-n* sample being disc galaxies, comprising a blue  $n = 1$  disc and red  $n > 1$  bulge such that the disc is more prominent in  $g$  than in  $H$ . Although subtle, a curve is apparent in the median  $\mathcal{N}_g^H$  versus  $(u - r)$ . *Low-n* galaxies with intermediate colours have the greatest variations of Sérsic index with wavelength, consistent with the bulge and disc being of similar prominence, but differing colour, in these systems.

In contrast, the *high-n* galaxies, which are mostly red, display a distribution that is centred on  $\mathcal{N}_g^H \sim 1$ , indicating that the profile of these galaxies is similar at all wavelengths. There is a tail of *high-n* galaxies to blue colours, which tend to have  $\mathcal{N}_g^H < 1$ . This suggests that *blue*, *high-n* galaxies have peakier profiles at blue wavelengths, possibly indicating the presence of a central starburst.

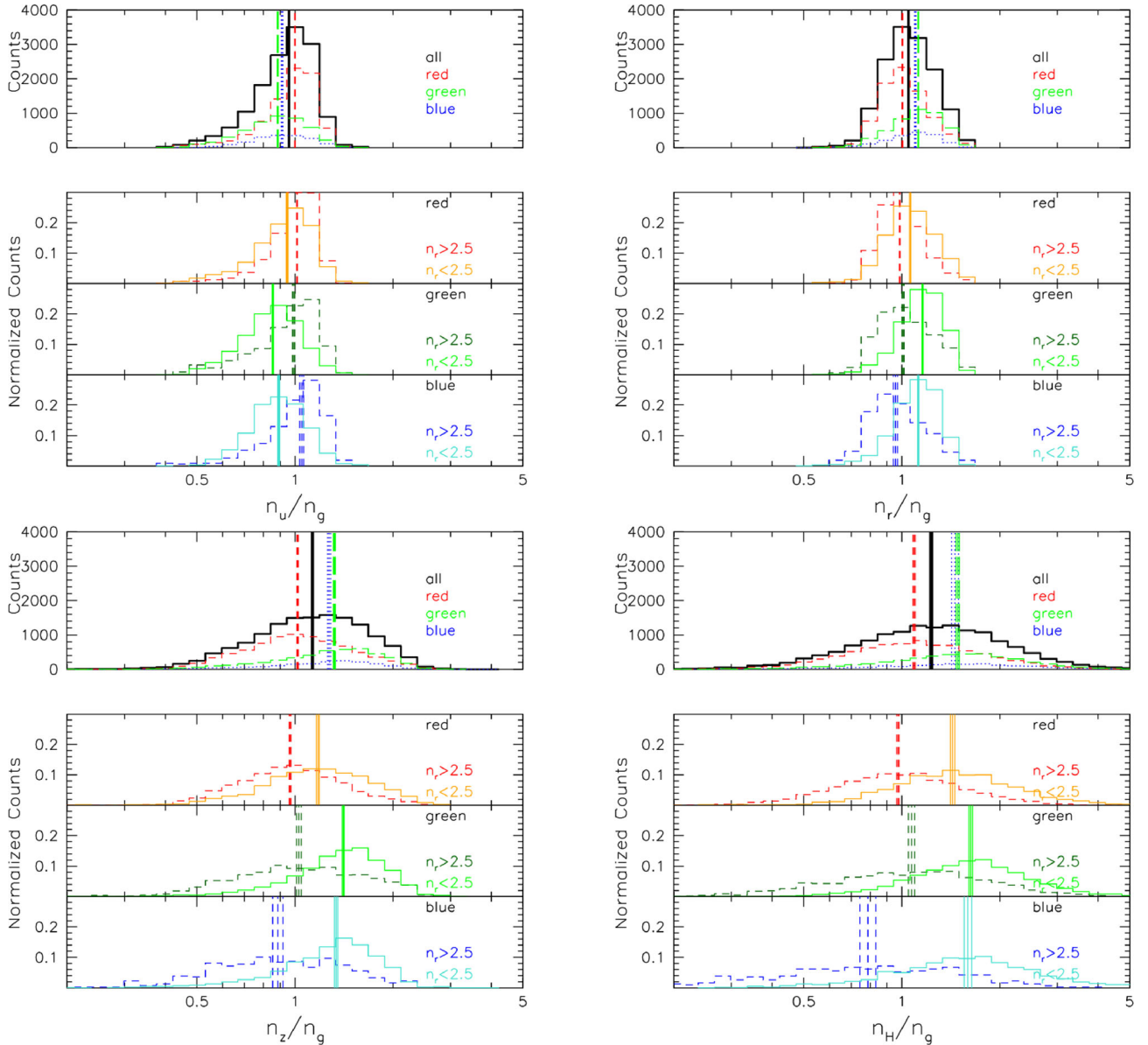
The segregation of galaxy populations seen in Fig. 7 suggests that  $\mathcal{N}$  could be used as a proxy to separate galaxy types or identify specific populations. For example, ‘red spirals’, disc galaxies with suppressed star formation, should possess a disc with similar colour to their bulge. They may therefore be isolated from early-type spirals, with comparable colour and Sérsic index, by their lower  $\mathcal{N}$ .

However, we reiterate that our definitions of *blue* versus *red* and *low-n* versus *high-n* depend on our sample selection and adopted magnitude cut. Our present results are therefore limited to the intrinsically bright galaxy population.

So far we have focused on  $\mathcal{N}_g^H$ , but now we consider other combinations of bands, keeping  $g$  as our reference, to be sure that our conclusions are not driven by a particular choice of the bands. Fig. 8 shows the distributions of  $\mathcal{N}_g^u$ ,  $\mathcal{N}_g^r$ ,  $\mathcal{N}_g^z$ ,  $\mathcal{N}_g^H$ . We chose to show  $u$ ,  $z$  and  $H$  as examples because they are the bluest, the intermediate and the reddest bands, respectively, and  $r$  because it is the band we use to define our *low-n* and *high-n* samples. As well as showing the overall distributions we also divide by colour and Sérsic index, as described in Section 2.3.

The distributions are unimodal, with widths that strongly depend on the passbands involved: the redder the wavelength (relative to  $g$ ), the broader the distributions. This is somewhat inevitable given that observations at neighbouring wavelengths will be dominated by the same stellar population, while longer wavelength baselines permit greater variability. In addition, the Sérsic index has been constrained to vary as a smooth polynomial, which will act to suppress large variations between neighbouring bands. Focusing only on colours (upper subpanels),  $\mathcal{N}$  for *red* galaxies always remains close to 1, as does  $\mathcal{N}$  for *blue* and *green* galaxies for short wavelength baselines. Increasing the wavelength range spanned ( $g$  versus  $z$  and  $H$  bands), *blue* and *green* galaxies have systematically higher  $\mathcal{N}$  than *red* galaxies, and are thus easier to differentiate, despite the increasing width of the  $\mathcal{N}$  distributions.

Further separating galaxies for  $n$  (lower subpanels), we see that the *low-n* and *high-n* normalized distributions differentiate, at any fixed colour. As for colour, the difference between *low-n* and *high-n* is more evident with longer wavelength baselines. For *red* galaxies, the width of the  $\mathcal{N}$  distributions are very similar for *low-n* and *high-n* galaxies, at any wavelength. However, for *green* and *blue* objects, the *high-n* distribution is significantly broader than for



**Figure 8.** Distributions of  $\mathcal{N}$  for a representative selection of bands. The four groups of panels show (1)  $\mathcal{N}_g^u$ , (2)  $\mathcal{N}_g^r$ , (3)  $\mathcal{N}_g^z$  and (4)  $\mathcal{N}_g^H$ . Within each group, the upper panel (a) shows the distribution of  $\mathcal{N}$  for the sample overall and divided by colour, without taking into account the Sérsic index. The lower windows show the normalized histograms of  $\mathcal{N}$  for *low-n* and *high-n* galaxies, for *red* (b), *green* (c) and *blue* (d) samples separately.

*low-n*, particularly for long wavelength baselines. Objects with high Sérsic index and blue colours appear to be a varied population, although the bluest examples are rare, and hence their distribution is uncertain.

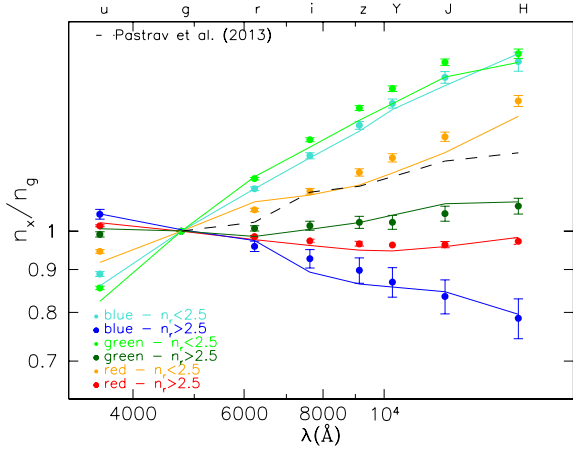
We note that at any wavelength, *green high-n* galaxy trends resemble those of *red high-n* galaxies, while *green low-n* galaxy trends resemble those of *blue low-n* galaxies, further indicating that our *green* sample mixes objects with different structural properties.

To assess the differences between the different distributions, we perform a Kolmogorov–Smirnov (K–S) test on each pair. The K–S tests indicate that all the subsamples are drawn from different parent  $\mathcal{N}$  distributions, except for *blue* and *green* galaxies with *low-n*, suggesting that these galaxies share common properties.

As was done for Sérsic index in Fig. 6, we show the variation in median  $\mathcal{N}$  as a function of wavelength,  $\lambda$ , more compactly in Fig. 9. All the ratios are normalized to the *g* band. Points represent the

Median of the  $\mathcal{N}_g^x$  values for the galaxies in each subsample, where  $x$  is the band corresponding to wavelength  $\lambda$ . For comparison, the lines in this figure show the ratio of the median  $n(g)$  to the median  $n(x)$  (as individually plotted in Fig. 6). One can see that, as expected statistically, the median  $\mathcal{N}$  reveals the same behaviour as considering the ratio of the median trends in  $n$ . Fig. 9 is therefore an alternative way of presenting Fig. 6. The unimodality of the distributions in Fig. 8 and the consistency shown in Fig. 6 support the use of population trends to study the variation of galaxy structure with wavelength. However, remember that the  $\mathcal{N}$  quantifies the dependence of Sérsic index on wavelength for *individual* galaxies in a robust manner.

Galaxies with different Sérsic indices and colours follow different trends. For *green* and *blue* galaxies with *low-n*,  $\mathcal{N}$  correlates strongly with wavelength such that Sérsic index is higher at redder wavelengths. *Red, low-n* galaxies display a weaker correlation with

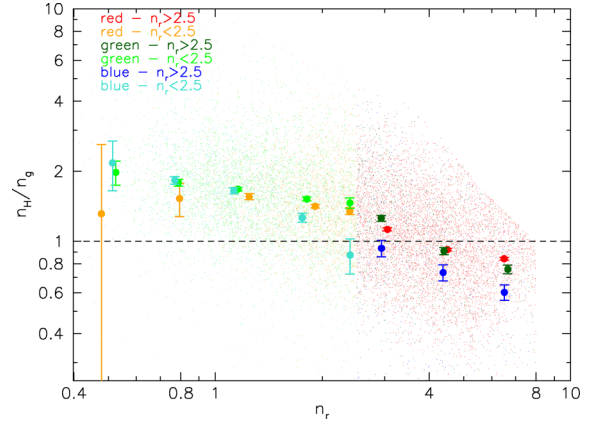


**Figure 9.** Median values of  $\mathcal{N}_g^x$  as a function of wavelength, where  $x$  denotes the band corresponding to wavelength  $\lambda$ . As indicated by the legend, red, dark green and blue symbols and lines represent *high- $n$*  galaxies; orange, light green and turquoise symbols and lines represent *low- $n$*  galaxies. Median  $\mathcal{N}_g^x = n_x/n_g$  are plotted by points. Error bars give the uncertainty on the median. Lines plot  $\text{median}[n_x]/\text{median}[n_g]$ , i.e. the points from Fig. 6 normalized to the  $g$  band. The black dashed line represent the wavelength dependence of  $\mathcal{N}$  for a disc population due to the effects of dust, as predicted by Pastrav et al. (2013a). We do not plot the prediction for the  $u$  band since it has not been calculated in the model, but it is a linear interpolation from the  $B$  band to the near-UV. The trends depend on both colour and Sérsic index, indicating that the typical internal structure differs for galaxies in each population.

wavelength, while for *green, high- $n$*  objects, it is weaker still, and entirely absent for *red, high- $n$*  galaxies. Finally, for *high- $n, blue$*  galaxies,  $\mathcal{N}$  anticorrelates with wavelength. This behaviour is consistent with a progression from galaxies containing significant red bulge and blue disc components, to bulge–disc systems that are increasingly dominated by a red bulge, or contain components with less contrasting colours, to galaxies possessing a single component, or homogeneous colour, and finally to systems with a bulge bluer than their disc.

As mentioned earlier, the relative prominence and colour of bulges and discs are unlikely to completely explain the trends we see. Even in pure exponential disc systems, dust attenuation can result in measured Sérsic indices that vary with wavelength. In Fig. 9, we overplot the wavelength dependence of  $\mathcal{N}$  expected for a disc population due to the effects of dust, as computed by Pastrav et al. (2013a) from the radiative transfer model simulations of Popescu et al. (2011). Their model is for the disc in a typical spiral galaxy, with inclination  $i = 60^\circ$  and central  $B$ -band face-on optical depth  $\tau_B^f = 4$  (see their fig. 25). Note that since Pastrav et al. (2013a) did not calculate the model for the  $u$  band, but simply linearly interpolated from the  $B$  band to the near-UV, we do not consider the value for the  $u$  band. Their prediction lies below the majority of our disc-dominated (*low- $n$* ) galaxies, but is consistent with the trend for our *red, low- $n$*  sample. This suggests that dust may be responsible for part, but not all, of the trends for *low- $n$*  galaxies.

In the above analysis, we have seen that galaxies with high Sérsic indices typically have smaller variations in Sérsic index with wavelength. We demonstrate this explicitly in Fig. 10 by plotting  $\mathcal{N}_g^H$  versus  $n_r$ . This plot shows that galaxies with  $n_r \sim 4$  have  $\mathcal{N}_g^H \sim 1$  on average, though with a significant scatter. While departures to lower  $n_r$  are consistently associated with a trend to higher  $\mathcal{N}_g^H$ , the correlation also continues to  $n_r > 4$  and lower  $\mathcal{N}_g^H$ . This would appear to



**Figure 10.** Median  $\mathcal{N}_g^H$  as a function of  $n_r$  for galaxies with each colour and Sérsic index subsample, coloured as indicated in the legend. Small points show individual galaxies, while larger points indicate the median in bins of  $n_r$ . Error bars represent the uncertainty on the median. The dashed line shows the  $\mathcal{N}_g^H = 1$ .

indicate that *all* truly homogeneous, one-component systems have  $n \sim 4$  at all optical and NIR wavelengths. However, our sample is limited to intrinsically luminous galaxies, and such a conclusion would be at odds with the established magnitude–Sérsic index relation for elliptical galaxies (e.g. Graham & Guzmán 2003, and references therein). It will be interesting to explore this result over a wider luminosity range. Finally, we note again that blue *high- $n$*  objects tend to have  $\mathcal{N}_g^H < 1$ , and hence become more concentrated at bluer wavelengths, indicative of central star formation.

Many of the results in this subsection echo those we found earlier by considering the population trends, which are less reliant on multiband fits. However, by reliably measuring the wavelength dependence of Sérsic index,  $\mathcal{N}$ , for individual galaxies, we are able to study the distribution of  $\mathcal{N}$ , rather than simple averages, and even select objects with contrasting  $\mathcal{N}$  values.

Next, we consider the wavelength dependence of the effective radius in a similar manner to above, before considering the joint behaviour of  $n$  and  $R_e$ .

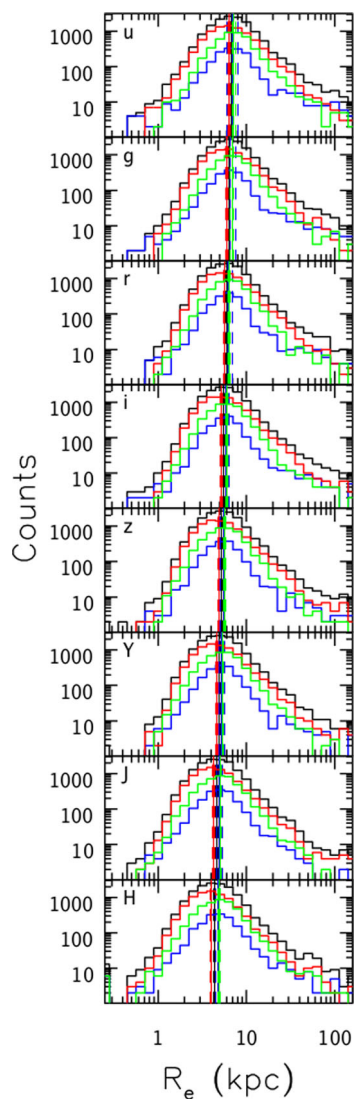
## 3.2 Wavelength dependence of the effective radius

### 3.2.1 Population trends

The effective, or half-light, radius is simply a measure of the size, and thus not normally considered to represent galaxy structure directly. However, the amount by which the size of a galaxy varies can be due to its inclination, and hence it depends on the opacity, or to its internal structure. In particular, depending upon the wavelength considered, it reveals radial variations of colour, and hence stellar population or attenuation, within a galaxy. These may be related to the presence of multiple structural components with different colours, e.g. a red bulge and blue disc, or gradients within a single structural element.

In this section, following the same approach as above for Sérsic index, we investigate how  $R_e$  varies with wavelength for galaxies divided by colour and Sérsic index, as described in Section 2.3.

Fig. 11 shows the distribution of  $R_e$  in each waveband, for the full galaxy sample and for our three colour subsamples. In contrast to  $n$  (Fig. 4), the distribution of  $R_e$  does not depend strongly on galaxy colour. The median and shape of the  $R_e$  distribution are very similar for the three samples in all wavebands.

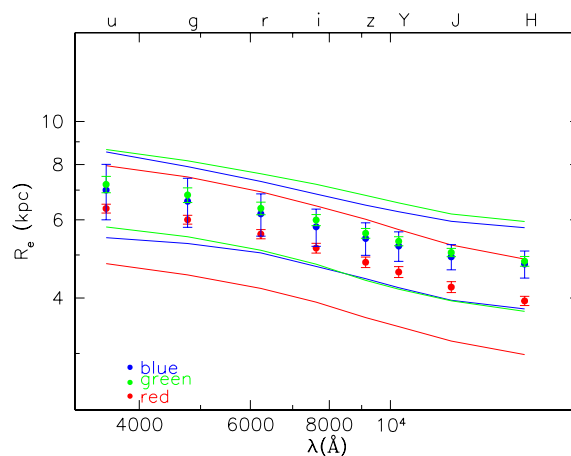


**Figure 11.** Effective radius distribution for our full sample (black line) and for galaxies in each of our colour subsamples (*red*, *green*, *blue*). Each panel shows the distribution in a different band: *ugrizYJH*. The median of each distribution, and its uncertainty, are indicated by vertical solid and dashed lines, respectively. The  $R_e$  distributions for each colour sample are very similar, and the medians vary only weakly with wavelength.

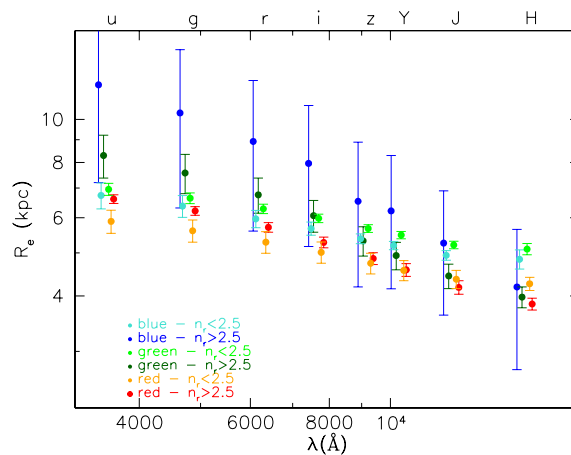
The median  $R_e$  decreases towards redder wavelengths. This behaviour is slightly more pronounced for the *red* sample. This is more apparent in Fig. 12, where the dependence of the median effective radius on wavelength is presented more compactly. The slope of the relations is similar for galaxies of different colour, just slightly steeper for *red* galaxies. *Red* galaxies also have a smaller median  $R_e$  at all wavelengths, while *blue* and *green* galaxies show very similar values. The median  $R_e$  in *u* band are  $6.4 \pm 0.1$ ,  $7.2 \pm 0.3$  and  $7 \pm 1$  kpc for *red*, *green* and *blue* subsamples, respectively. In *H* band, the corresponding figures are  $3.94 \pm 0.09$ ,  $4.9 \pm 0.1$  and  $4.8 \pm 0.3$  kpc.

In contrast to colour and Sérsic index, in our sample there is no obvious separation of populations in effective radius. We therefore do not attempt to consider samples divided by  $R_e$ , but continue to use  $n$  to isolate bulge- and disc-dominated populations.

Fig. 13 shows the dependence of the median effective radius on wavelength for galaxies characterized by different colour and



**Figure 12.** Median effective radius as a function of wavelength for our *red*, *green* and *blue* galaxy samples. Error bars represent the uncertainty on the median. Solid lines indicate the 16th- and 84th-percentiles of the distribution. The effective radius clearly depends on wavelength. *Blue* and *green* galaxies show very similar behaviour, while *red* galaxies have systematically smaller effective radii and a slightly steeper dependence on wavelength.

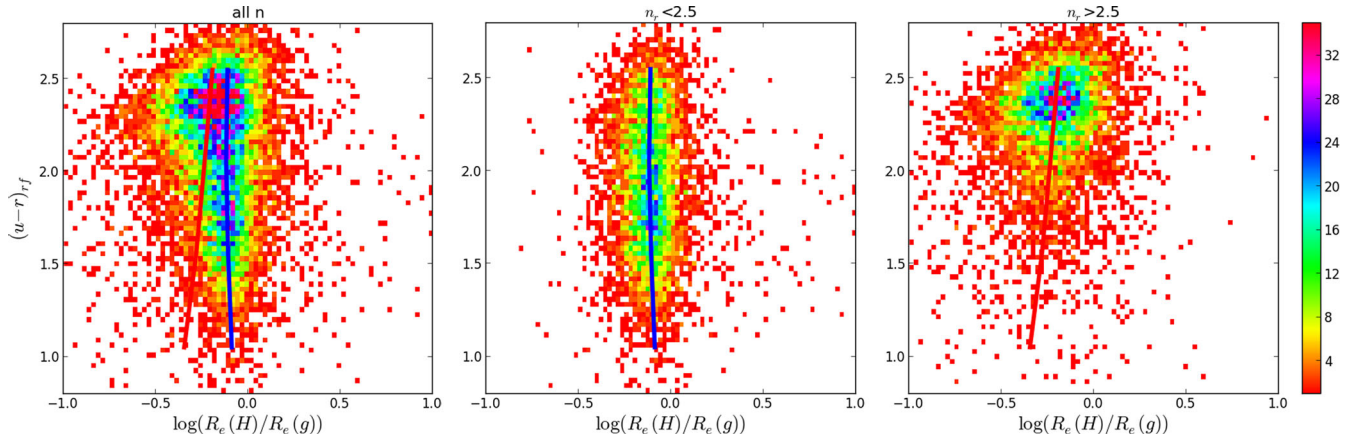


**Figure 13.** Median effective radius as a function of wavelength for galaxies of different colour and Sérsic index. Red, dark green and blue symbols represent *high- $n$*  galaxies; orange, light green and turquoise symbols *low- $n$*  galaxies. Error bars represent the uncertainty on the median. The median effective radius depends on wavelength. Small offsets in wavelength have been applied to all points for clarity. *Low- $n$*  samples display similar behaviour, while the *high- $n$*  samples show stronger, and more varied, trends.

Sérsic index. Each population shows a decrease in effective radius towards redder wavelengths. Galaxies with *high- $n$*  are characterized by a steeper trend (a  $\sim 45$  per cent reduction in  $R_e$  from *u* to *H*) than those with *low- $n$*  ( $\sim 25$  per cent reduction). The three *low- $n$*  samples behave very similarly; the variation of median  $R_e$  with wavelength does not depend on colour for *low- $n$*  galaxies. The *high- $n$*  samples display more variety, with bluer galaxies showing a stronger wavelength dependence.

### 3.2.2 Effective radius versus wavelength for individual galaxies

Following the same reasoning and approach for Sérsic index, we now move to quantifying the dependence of effective radius on wavelength for individual galaxies. We adopt the similar notation  $\mathcal{R}_b^r = R_e(r)/R_e(b)$ , where  $R_e(r)$  and  $R_e(b)$  are the effective radii in some (rest-frame) red and blue band, respectively



**Figure 14.** Density map of  $(u - r)$  colour versus the ratio of the  $H$ -band effective radius and  $g$ -band effective radius, defined here as  $\mathcal{R}_g^H = R_e(H)/R_e(g)$ . The left-hand panel considers all galaxies together, while centre and right panels show only galaxies with low and high Sérsic index, respectively. The median  $\mathcal{R}_g^H$  as a function of colour is also plotted, for both the *low-n* (blue line) and *high-n* (red line) samples. The two populations show different distributions, indicating that they are characterized by different internal structures. Most galaxies have  $\mathcal{R} < 1$ , indicating that they appear smaller at redder wavelengths, with *high-n* galaxies showing the greatest effect.

(again maintaining the standard colour convention where sensible). Using a ratio is appropriate, as we are more interested in fractional, rather than absolute, variations in  $R_e$ . As with  $\mathcal{N}$ , to avoid an asymmetry when plotting  $\mathcal{R}$ , we use a logarithmic scale. The resulting distributions appear symmetrical and approximately Gaussian.

To start, we examine the relationship between galaxy colour  $(u - r)$  and  $\mathcal{R}_g^H = R_e(H)/R_e(g)$  in Fig. 14. This displays similar behaviour to the distribution of  $(u - r)$  versus  $\mathcal{N}_g^H$  (Fig. 7). The distribution of  $\mathcal{R}_g^H$  is different for galaxies on either side of the usual colour bimodality, and the two overlapping modes can be well separated by dividing by Sérsic index. *Low-n* galaxies occupy a narrow vertical locus, indicating that they can assume a wide range of colours, but are limited to a narrow range around  $\mathcal{R}_g^H \sim 0.8$ . In contrast, *high-n* galaxies, which have preferentially red colour, display a broader distribution offset to lower  $\mathcal{R}_g^H \sim 0.6$ . Bluer *high-n* galaxies are offset to even lower  $\mathcal{R}_g^H$ . As with  $\mathcal{N}$ , this figure indicates that galaxies of different Sérsic index have  $R_e$  with different wavelength dependence, suggesting that  $\mathcal{R}$  could be useful for classifying galaxies.

We now compare the  $\mathcal{R}$  distributions for various combinations of bands, keeping  $g$  as our reference, for our full sample of galaxies and subsamples divided by colour and Sérsic index, as described in Section 2.3. Fig. 15 shows that galaxies of different colours show very similar  $\mathcal{R}$  distributions, for any wavelength baseline. As for  $\mathcal{N}$ , the distributions are unimodal, with widths that depend on the passbands involved: the longer the wavelength baseline, the broader the distributions. The medians of these distributions become lower for longer wavelength baselines. Focusing on galaxies with *low-n* and *high-n*, we find that *low-n* galaxies are characterized by an  $\mathcal{R}$  distribution which is completely independent of colour and varies only slightly with wavelength baseline. In contrast, the median  $\mathcal{R}$  for *high-n* galaxies depends on colour, becoming lower for bluer galaxies. Similar to  $\mathcal{N}$ , the  $\mathcal{R}$  distribution for *high-n* galaxies is typically broader than for *low-n* galaxies.

We summarize the median trends of  $\mathcal{R}$  versus wavelength in Fig. 16. Points represent the median of the  $\mathcal{R}_g^x$  values for the galaxies in each subsample, where  $x$  is the band corresponding to wavelength  $\lambda$ . For comparison, the lines in this figure show the ratio of the median  $R_e(g)$  to the median  $R_e(x)$  (as individually plotted in Fig. 13).

As before, thanks to the simplicity of the distributions in Fig. 15, these two approaches give equivalent results.

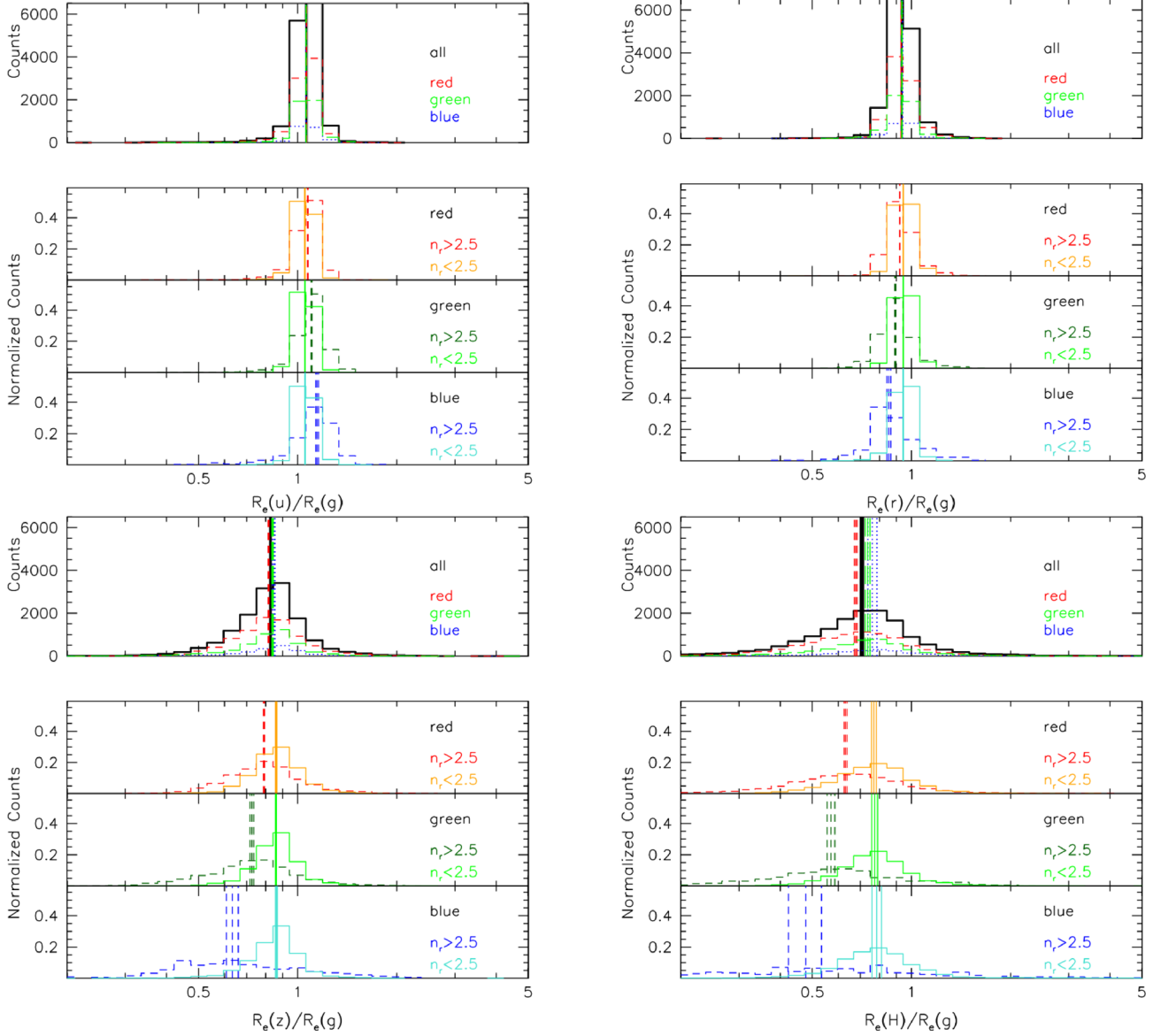
Galaxies with *low-n* and *high-n* clearly display different trends: the former show a relatively mild decrease in  $\mathcal{R}$  with wavelength, which is indistinguishable for the three colour samples. *Low-n* galaxies are characterized by very similar size distributions at any wavelength, regardless of their colour. In contrast, trends for *high-n* galaxies are more pronounced and become steeper for bluer samples. Blue, *high-n* galaxies decrease in effective radius by over a factor of 2 from  $u$  to  $H$  band.

Fig. 16 also plots the wavelength dependence of  $\mathcal{R}$  predicted for a disc population, due solely to the effect of dust attenuation, as computed in Pastrav et al. (2013a) from the radiative transfer model simulations of Popescu et al. (2011). Their prediction is significantly flatter than our disc-like (*low-n*) points, suggesting that only part of the slope we measure might be ascribable to the presence of dust. Note that, although the model of Popescu et al. (2011) contain colour gradients, here, we only plot the wavelength dependence due to dust alone. While the trends for disc galaxies may be due to their two-component nature, the strength of our *high-n* trends indicate that this subsample comprises galaxies with strong colour gradients. These may be due to multiple components with different SEDs, or substantial stellar population or dust gradients within a single structural component (Pastrav et al. 2013b).

### 3.3 The joint wavelength dependence of Sérsic index and effective radius

So far, we have considered the wavelength dependence of Sérsic index,  $\mathcal{N}$ , and effective radius,  $\mathcal{R}$ , separately. Summarizing the results obtained from Figs 7 and 14, we find that *low-n* galaxies, which can assume a wide range of colour, mostly have  $\mathcal{N}$  above 1 ( $\langle \mathcal{N}_g^H \rangle \sim 1.5$ ;  $0.8 \lesssim \mathcal{N}_g^H \lesssim 3$ ) and occupy a narrow  $\mathcal{R}$  range ( $\langle \mathcal{R}_g^H \rangle \sim 0.8$ ;  $0.5 \lesssim \mathcal{R}_g^H \lesssim 1.1$ ). At redder wavelengths, they therefore typically display smaller and peakier (higher  $n$ ) profiles. This is consistent with *low-n* galaxies typically being bulge–disc systems, comprising a small,  $n \gtrsim 2$ , red bulge and larger, exponential, blue disc. However, dust may also play a role in these trends.

In contrast, *high-n* galaxies, which span the full range of colour but are preferentially red, have  $\mathcal{N}$  centred on unity ( $\langle \mathcal{N}_g^H \rangle \sim 1.0$ ;

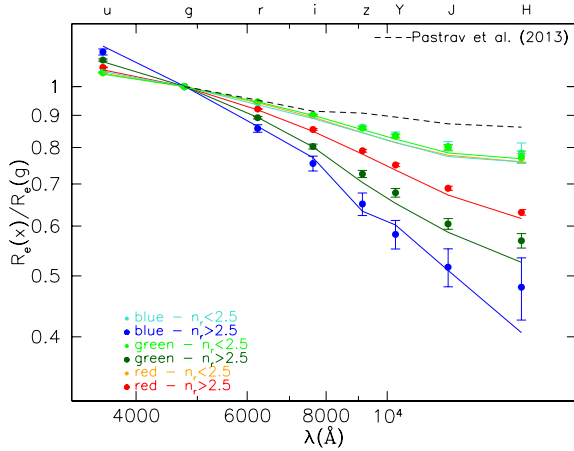


**Figure 15.** Distributions of  $\mathcal{R}$  for a representative selection of bands. The four groups of panels show (1)  $\mathcal{R}_g^u$ , (2)  $\mathcal{R}_g^r$ , (3)  $\mathcal{R}_g^z$  and (4)  $\mathcal{R}_g^H$ . Within each group, the upper panel (a) shows the distribution of  $\mathcal{R}$  for the sample overall and divided by colour, without taking into account the Sérsic index. The lower windows show the normalized histograms of  $\mathcal{R}$  for *low-n* and *high-n* galaxies, for *red* (b), *green* (c) and *blue* (d) samples separately.

$0.5 \lesssim \langle \mathcal{N}_g^H \rangle \lesssim 2.0$ ), and  $\mathcal{R}$  offset to slightly lower values ( $\langle \mathcal{R}_g^H \rangle \sim 0.6$ ;  $0.3 \lesssim \mathcal{R}_g^H \lesssim 1.1$ ). At the reddest wavelengths, their profiles typically maintain the same shape ( $n$ ) but become substantially smaller. This is initially surprising, as a stellar population gradient would, in general, be expected to result in both the Sérsic index and effective radius varying with wavelength. Our *high-n* galaxies are consistent with comprising either a single spheroidal structural component with a strong stellar population gradient, or multiple spheroidal components with different  $R_e$  and stellar populations such that the larger components have bluer colours. The former may be identified with a single monolithic collapse, for which the colour gradient would be driven by metallicity. The latter may correspond to distinct phases of collapse or merging.

We can generalize our findings for  $\mathcal{N}_g^H$  and  $\mathcal{R}_g^H$  by considering  $\mathcal{N}$  and  $\mathcal{R}$  for multiple wavebands. Fig. 17 shows how the median of the  $\mathcal{N}$ – $\mathcal{R}$  distribution varies with wavelength for galaxies belonging to

each of our six subsamples, and neatly presents many of the trends we have explored above. *Low-n* and *high-n* galaxies show different behaviour with respect to wavelength: *low-n* galaxies vary substantially in  $\mathcal{N}$ , but over only a narrow range in  $\mathcal{R}$ . On the other hand, *high-n* galaxies vary widely in  $\mathcal{R}$ , but only slightly in  $\mathcal{N}$ . Colour has a more subtle influence on these trends. For *low-n* galaxies, redder galaxies vary less in  $\mathcal{N}$ , but equally in  $\mathcal{R}$ . *High-n* galaxies show a particularly interesting behaviour with colour. *Red* galaxies, which comprise the majority of the *high-n* population, show almost no variation in  $\mathcal{N}$ , but vary significantly in  $\mathcal{R}$ . *Green high-n* galaxies show a slight increase in  $\mathcal{N}$  with wavelength, potentially indicating the presence of a blue disc, but show an even greater variation in  $\mathcal{R}$ , in contrast to the *low-n* objects. *Blue high-n* galaxies continue the trend of a strengthening wavelength dependence for  $\mathcal{R}$ , but *reverse* their behaviour in terms of  $\mathcal{N}$ , appearing peakier at shorter wavelengths. The trends with wavelength are relatively linear in  $\mathcal{N}$  versus  $\mathcal{R}$ . They are therefore well described by any one



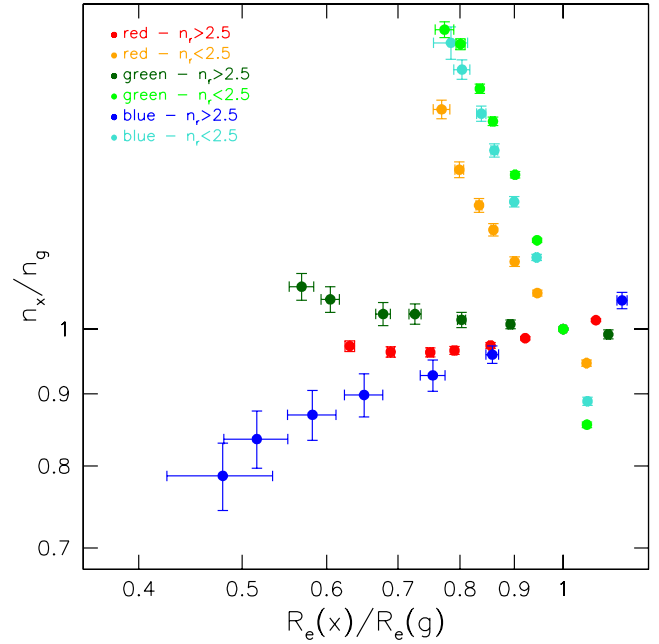
**Figure 16.** Median values of  $\mathcal{R}_g^x$  as a function of wavelength, where  $x$  denotes the band corresponding to wavelength  $\lambda$ . As indicated by the legend, red, dark green and blue symbols and lines represent *high- $n$*  galaxies; orange, light green and turquoise symbols and lines represent *low- $n$*  galaxies. Median  $\mathcal{R}_g^x = R_e(x)/R_e(g)$  are plotted by points. Error bars give the uncertainty on the median. Lines plot median[ $R_e(x)$ ]/median[ $R_e(g)$ ], i.e. the points from Fig. 13 normalized to the  $g$  band. Small offsets in wavelength have been applied to all points for clarity. The black dashed line represent the wavelength dependence of  $\mathcal{R}$  for a disc population due to the effects of dust, as predicted by Pastrav et al. (2013a). We do not plot the prediction for the  $u$  band since it has not been calculated in the model, but it is a linear interpolation from the  $B$  band to the near-UV. The trends for the *low- $n$*  samples are indistinguishable, irrespective of galaxy colour. The *high- $n$*  samples show steeper trends which depend on colour.

pair of wavebands, justifying our approach of focusing on  $H$  and  $g$  throughout this work.

### 3.4 $\mathcal{N}$ and $\mathcal{R}$ as a classifier

Above we find, somewhat unsurprisingly, that the wavelength dependence of *low- $n$*  galaxies is consistent with them containing both a spheroid and a disc, while *high- $n$*  galaxies comprise one or more spheroidal components. This allows the possibility of using  $\mathcal{N}$  and  $\mathcal{R}$  to directly identify bulge–disc systems, irrespective of their overall colour or Sérsic index. Furthermore, we can combine information from  $\mathcal{N}$  and  $\mathcal{R}$  with colour and Sérsic index to isolate galaxies with specific structural properties. We now briefly investigate the use of  $\mathcal{N}_g^H$  and  $\mathcal{R}_g^H$  alone to separate galaxy populations with distinct internal structure. In Fig. 18, we consider the main contrasting populations: *blue low- $n$*  galaxies and *red high- $n$*  galaxies. Although the averages of the two populations are significantly offset (see Fig. 17), their distributions are sufficiently broad that they overlap considerably. *Blue low- $n$*  galaxies inhabit a compact locus within that of *red high- $n$*  galaxies. It is therefore possible to cut the  $\mathcal{N}$ – $\mathcal{R}$  plane to isolate a pure, but incomplete, sample of *red high- $n$*  galaxies, but any selection of *blue low- $n$*  objects will be significantly contaminated. It is not yet clear whether the breadth of these distributions is determined by measurement uncertainties or intrinsic variations. Our sample has relatively low S/N and poor spatial resolution. With higher quality data or a lower redshift sample, it may well be that galaxy populations will separate more cleanly in the  $\mathcal{N}$ – $\mathcal{R}$  plane. However, for galaxy classification  $\mathcal{N}$  and  $\mathcal{R}$  are best considered as complementary to Sérsic index or colour, rather than a potential replacement.

From the behaviour of the various colour- and Sérsic index-selected samples in the  $\mathcal{N}$ – $\mathcal{R}$  plane, it is certain that  $\mathcal{N}$  and  $\mathcal{R}$



**Figure 17.** Median  $\mathcal{N}_g^x$  versus median  $\mathcal{R}_g^x$  for galaxies in each of our different subsamples divided by colour and Sérsic index. Symbols are as usual. Multiple points of the same symbol correspond to different wavebands,  $x$ . These consistently follow the wavelength sequence from  $H$  on the left to  $u$  on the right. All the  $g$ -band points lie at (1, 1) by definition.

contain additional information. For example, within *red high- $n$*  objects,  $\mathcal{N}$  and  $\mathcal{R}$  may be used to isolate galaxies which show evidence for perhaps containing a blue disc ( $\mathcal{N} \gg 1$ ), or central star formation ( $\mathcal{R} \ll 1$ ).

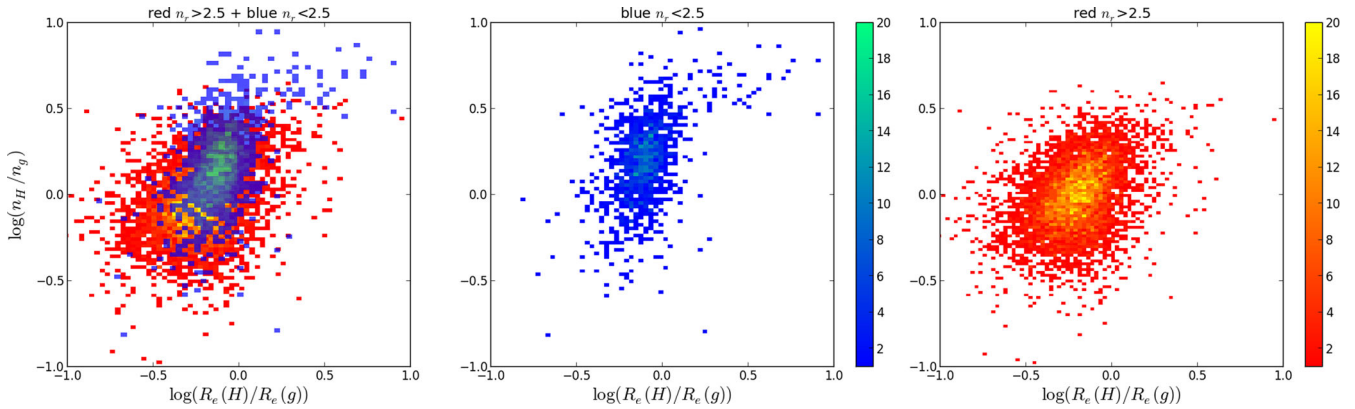
## 4 INTERPRETATION

Our analysis has demonstrated that the wavelength dependences of Sérsic index and effective radius are related to other galaxy properties. However, it is now helpful to pause and consider what  $\mathcal{N}$  and  $\mathcal{R}$  actually mean. What do galaxies with different values of  $\mathcal{N}$  and  $\mathcal{R}$  look like, and how do they compare with the more usual concept of colour gradients?

$\mathcal{N}$  primarily indicates the degree to which the central concentration of the light profile varies with wavelength. However, remember that for a given  $R_e$  a greater central concentration also implies more light in the outer regions of the profile. A value of  $\mathcal{N} > 1^5$  implies that the galaxy has a peakier (higher  $n$ ) profile in redder bands. All else being equal, galaxies with  $\mathcal{N} > 1$  should therefore appear redder in their centres, bluer at intermediate radii and then redder again in their outskirts. In practice, however, the behaviour in the outskirts is often lost in the sky noise and the S/N-weighting scheme employed by GALFIT means that it cares much less about the outer profile.<sup>6</sup>  $\mathcal{N} < 1$  implies the opposite behaviour that galaxies are peakier in bluer bands, whereas  $\mathcal{N} \sim 1$  indicates that the profile has a similar shape at all wavelengths.

<sup>5</sup> We remind the reader that  $\mathcal{N}$  and  $\mathcal{R}$  have been defined as the ratios of the reddest to the bluest  $n$  and  $R_e$ , respectively; hence, these relations are reversed when we look at  $\mathcal{N}_g^u$  and  $\mathcal{R}_g^u$ .

<sup>6</sup> This is much like the fact that, analytically, a de Vaucouleurs bulge must always dominate over an exponential disc at sufficiently large radii, but this is rarely observed because it typically occurs at very faint surface brightness.



**Figure 18.**  $\mathcal{N}_g^H$  versus  $\mathcal{R}_g^H$  for *blue low- $n$*  galaxies (blue points) and *red high- $n$*  galaxies (red points). In the left-hand panel, the two samples are plotted together, while the central and right panels separately plot the *blue low- $n$*  and *red high- $n$*  samples, respectively. These are the main contrasting populations in terms of colour and Sérsic index, and it can be seen that they also occupy different, though overlapping, loci in this plane.

$\mathcal{R}$  quantifies the variation in size with wavelength. For example,  $\mathcal{R} < 1$  implies that a galaxy is smaller in redder bands. All else being equal, galaxies with  $\mathcal{R} < 1$  should therefore appear redder in their centres and bluer towards their outskirts.  $\mathcal{R} > 1$  implies the opposite behaviour, whereas  $\mathcal{R} \sim 1$  indicates a constant colour with radius.  $\mathcal{R}$  thus works much like a conventional colour gradient, and in the same sense, in that a negative colour gradient would imply a bluer colour with increasing radius.

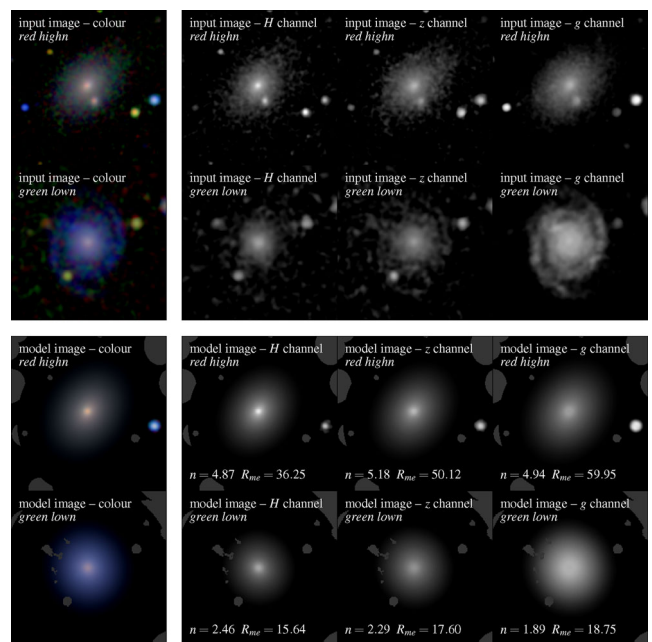
Note that (considering only the behaviour at  $\lesssim R_e$ ) variations in  $\mathcal{N}$  may represent similar visual effects to variations in  $\mathcal{R}$ , but in an opposite sense (i.e. in broad terms, increasing  $\mathcal{N}$  mimics decreasing  $\mathcal{R}$ ). However, although  $\mathcal{N}$  and  $\mathcal{R}$  can produce superficially the same appearance, as we have seen above, they are certainly not interchangeable, providing distinct information regarding the dependence of galaxy structure on wavelength.

Fig. 19 presents colour images of two galaxies. These are chosen to be bright, well-resolved objects, but are otherwise typical examples from our *red, high- $n$*  and *green, low- $n$*  samples. We have examined a large number of similar images, and see that the general behaviour expected from our  $\mathcal{N}$  and  $\mathcal{R}$  measurements is confirmed by visual inspection.

When we compare individual galaxies with similar properties, but different values of  $\mathcal{R}$  or  $\mathcal{N}$ , it is possible to see differences. However, this is somewhat obscured by other variations between individual galaxies, and the relatively low S/N of many of the objects in our sample. In order to demonstrate that  $\mathcal{R}$  and  $\mathcal{N}$  do represent true differences in the appearance of galaxies in an incontrovertible manner, we have stacked galaxies with similar properties. In this way, individual galaxy-to-galaxy variations are averaged out and the S/N is improved.

Recall that Figs 17 and 18 shows that  $\mathcal{N}$  and  $\mathcal{R}$  are somewhat correlated, although the correlation is reduced when dividing by colour and Sérsic index. It is therefore difficult to completely separate out the behaviour of  $\mathcal{N}$  and  $\mathcal{R}$  in stacked images. However, given their opposing behaviour, they will tend to cancel out each other's effect on galaxy appearance. Thus, if anything, the stacks may underrepresent the individual effects of  $\mathcal{N}$  and  $\mathcal{R}$ .

We combine the images using a  $3\sigma$  clipped mean, to exclude neighbouring object and atypical galaxies from the resulting stacked image. We further avoid any undue influence from outliers by applying the following limits to the objects in the stacks:  $0.05 < z < 0.2$ ;  $-22.5 < M_r < -21.2$ ;  $6 < R_e < 8$  pixels and  $1.0 < (u - r) < 3.0$ . We can therefore be sure that any of the features we see are



**Figure 19.** Left: example  $Hzg$  images of a *red, high- $n$*  and a *green, low- $n$*  galaxy, each with typical dependences of  $n$  and  $R_e$  on wavelength (they lie at the peaks of their respective distributions in Fig. 18). The images are displayed using the colour-preserving method of Lupton et al. (2004), with an asinh stretch to reveal the full range of surface brightness. The upper panels show the data, while the lower panels show the GALFITM model. Grey regions in the model images indicate where pixels were masked during the fit. Right: individual red, green and blue bands from the colour images, which make it easier to appreciate the relative distributions of the  $H$ -,  $z$ - and  $g$ -band light. For both galaxies, the central region is significantly redder than the outskirts. This is more subtle for the *high- $n$*  galaxy, as  $n$  is stable with wavelength, but still amounts to an increase in  $R_e$  by almost a factor of 2 between the  $H$  and  $g$  bands.

associated with the main distribution of galaxies. So that the stack is not dominated by bright galaxies, before averaging we scale the images to the same object magnitude, and to preserve axial ratio information we rotate each image such that the galaxy's major axis is horizontal. No scaling of the object sizes or circularization is performed, as these operations were found to introduce artefacts due

to distorting the PSF. However, note that only galaxies with similar apparent  $R_e$  are included in these stacks.

We stack galaxies with similar colour, Sérsic index and ratio of either Sérsic index or effective radius in the  $H$  and  $g$  bands. In addition to our usual divisions in terms of  $(u - r)$  and  $n$ , for each set of stacks, we divide the galaxy sample into three representative groups, by cutting at  $\mathcal{N}_g^H = 1.4$  and  $1.9$  and  $\mathcal{R}_g^H = 0.70$  and  $0.85$ , respectively. This results in 36 stacked images. For example, one stack contains only red, low- $n$ , mid- $\mathcal{N}$  galaxies, whereas another contains only blue, high- $n$ , low- $\mathcal{R}$  galaxies. Each stack typically contains 10–100 galaxies. For comparison, we also create stacked images for all galaxies of a given colour and Sérsic index, irrespective of  $\mathcal{N}$  or  $\mathcal{R}$ , for example, all red, high- $n$  objects.

The differences between the stacked images are relatively clear. However, to further aid their comparison, for each  $\mathcal{N}^-$  or  $\mathcal{R}^-$  specific stack we subtract the stack of all galaxies with the same colour and Sérsic index. The results are presented as both  $Hzg$  residual colour images and maps of the ratio of the  $H$  and  $g$  residuals. The former retain intensity information, and therefore display variations in the total brightness or surface brightness profile between categories. The latter remove this brightness information and just present the residual variation in  $H - g$  colour with position. As a final visualization, we azimuthally average the residual images to compare the radial profiles for  $H$ ,  $z$  and  $g$ .

Fig. 20 presents the behaviour of  $\mathcal{N}$  for the common combinations of Sérsic index and colour. As expected from the above arguments, when compared to the average, galaxies with higher  $\mathcal{N}$  are fainter and redder in the centre, but bluer at intermediate radii, and vice versa for lower values of  $\mathcal{N}$ . In some of the stacks, particularly for high- $n$  galaxies, the residuals are dominated by colour variations in the centre of the galaxy. For low- $n$  galaxies, the residuals are dominated by colour differences further out and are often elongated, suggesting the presence of a disc. Low (high) values of  $\mathcal{N}$  appear to reflect the presence (absence) of a red disc, while the centre of the galaxy remains unchanged.

Fig. 21 presents the same information for variations in  $\mathcal{R}$ . Again, the behaviour is broadly as anticipated. Compared to the average, objects with lower  $\mathcal{R}$  display redder centres, while higher  $\mathcal{R}$  implies bluer centres. As with  $\mathcal{N}$ , for low- $n$  galaxies, there are indications that the value of  $\mathcal{R}$  partly reflects the presence of a disc. However, unlike  $\mathcal{N}$ , the value of  $\mathcal{R}$  is also strongly related to the presence of a red central component. Objects with lower  $\mathcal{R}$  possess brighter, redder centres.

These stacks visually demonstrate that the different  $\mathcal{N}$  and  $\mathcal{R}$  values we have measured represent subtle but significant differences in the appearances of the galaxies.

## 5 DISCUSSION

In this paper, we have explored how galaxy structure varies with wavelength (from rest-frame  $u$  to  $H$ ), for populations selected by Sérsic index and colour, using a volume-limited sample of 14 274 bright galaxies. We measure galaxy sizes and radial profile shapes more accurately than previous studies, by utilizing a new technique which fits consistent, wavelength-dependent, two-dimensional Sérsic profiles to imaging in a collection of wavebands. Using this method, we confirm that the behaviours of individual galaxies generally follow the average trends of populations of similar objects. We are also able to identify individual galaxies with a particular wavelength dependence of their structural parameters, and hence create samples of objects that are similar in this respect.

We find that both effective radius and Sérsic index typically vary with wavelength. The sizes of all types of galaxies decrease substantially with increasing wavelength, with high- $n$  galaxies showing the greatest variation. The behaviour of Sérsic index is more sensitive to galaxy type: for high- $n$  galaxies, Sérsic index is constant with wavelength, while for low- $n$  galaxies, it varies dramatically.

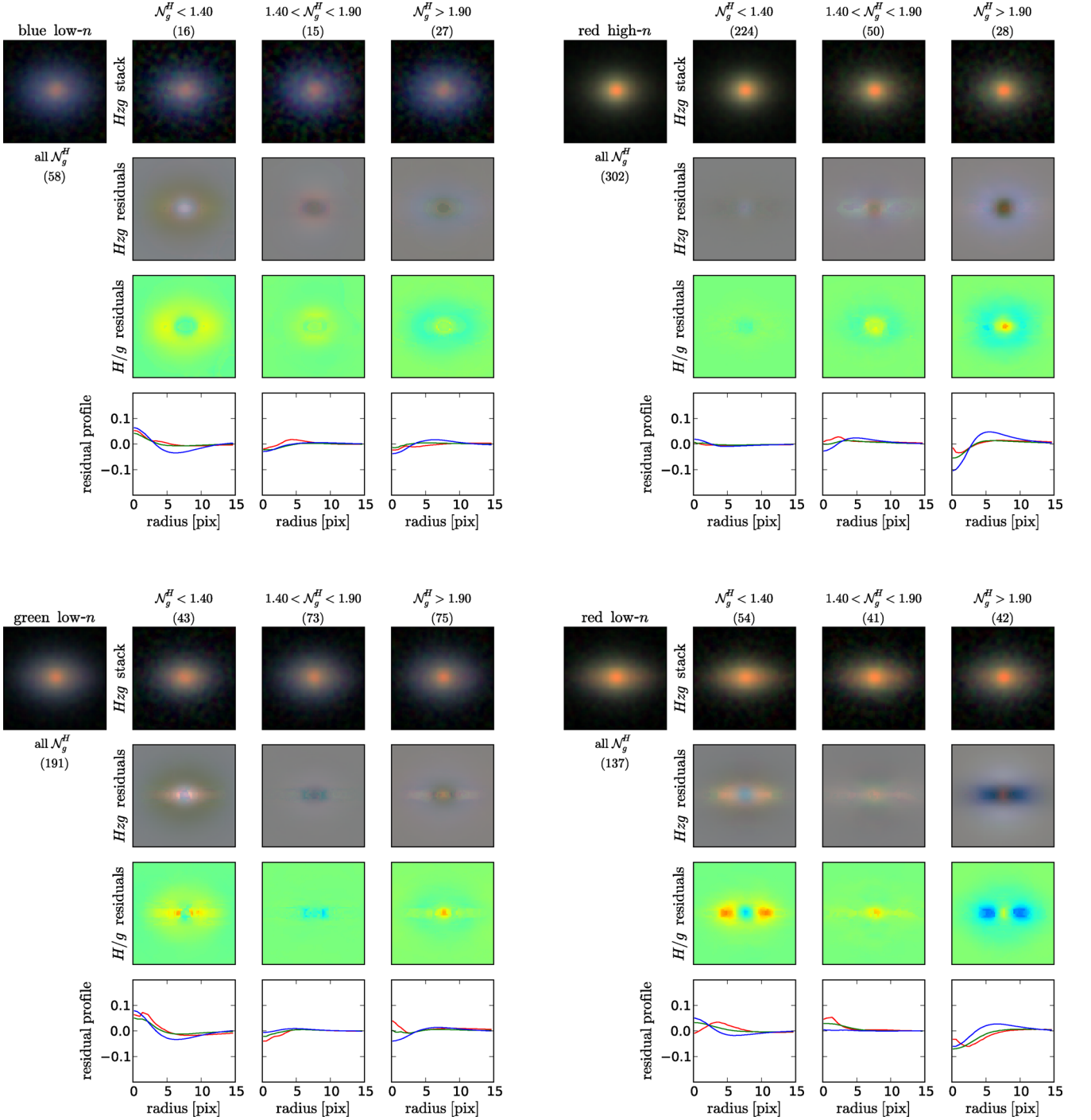
We now discuss our findings in the context of other works: first, comparing to similar studies on whose results we build, then considering the physical processes responsible for the trends we measure and finally suggesting how subsequent studies of galaxy structure can help to further differentiate between models of galaxy formation and evolution.

### 5.1 Comparison with previous results

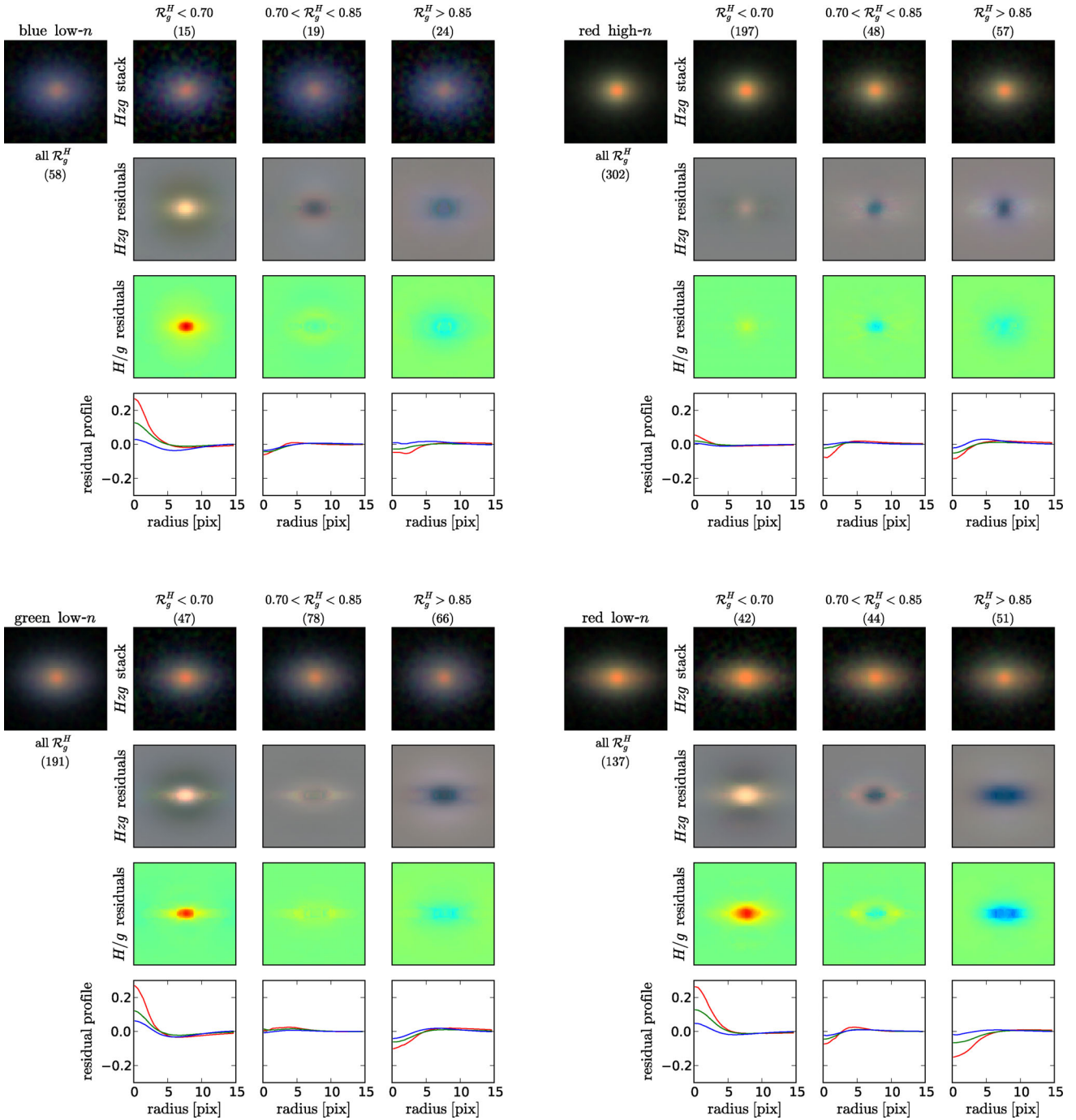
The SPIDER project (La Barbera et al. 2010a) has performed a careful analysis of the structural parameters of low-redshift early-type galaxies as a function of wavelength. They fit Sérsic profiles to imaging data from the same surveys as us (*griz* from SDSS and *YJHK* from UKIDSS LAS) using a similar tool (2dphot; La Barbera et al. 2008), but fitting each waveband independently. La Barbera et al. found that, for early types,  $R_e$  decreases by  $\sim 35$  per cent from (observed frame)  $g$  to  $K$ . They attributed this variation to the presence of negative internal colour gradients such that the light profile becomes more compact as one moves from shorter to longer wavelengths. The Sérsic indices of their objects span  $n \sim 2-10$ , with a median of 6 for all wavebands. They find little variation of Sérsic index with wavelength. Although their average  $n$  does not increase slightly ( $\sim 20$  per cent) from  $g$  to  $K$ , the trend is noisy and consistent with being flat.

La Barbera et al. (2010a) select their early-type galaxies as being bright ( $M_r < -20$ ), having a passive spectral type and being better represented by a de Vaucouleur profile than an exponential one. This roughly corresponds to our selection of red high- $n$  objects, although our average  $\langle n \rangle \sim 4$  is slightly lower than theirs. For this sample, we find very similar results: a  $\sim 40$  per cent increase in  $R_e$  from (rest-frame)  $u$  to  $H$ , while the Sérsic index remains stable, varying by  $< 5$  per cent over the same wavelength range. As La Barbera et al. point out, this behaviour is also consistent with Ko & Im (2005), Pahre, Djorgovski & de Carvalho (1998a), Pahre (1999) and Pahre, de Carvalho & Djorgovski (1998b); the latter of which demonstrates that the behaviour of  $R_e$  corresponds to an increase in the slope of the Fundamental Plane with wavelength, further confirmed by La Barbera et al. (2010b) and references therein.

Kelvin et al. (2012) similarly perform two-dimensional single-Sérsic fits to SDSS and UKIDSS LAS *ugrizYJHK* images of galaxies in the GAMA survey, using GALFIT to fit each bandpass independently. They defined two galaxy subpopulations, based on  $K$ -band Sérsic index and  $(u - r)$  rest-frame colour, and analysed the wavelength dependence of their structural parameters. They find that the mean effective radius of their early types shows a smooth variation with wavelength, decreasing by  $\sim 38$  per cent from (observed frame)  $g$  through  $K$ . Although their early-type selection is similar to ours, their sample is magnitude limited ( $r \lesssim 19.4$ ). Compared to the volume-limited samples of our work and La Barbera et al. (2010a), it therefore contains additional low-luminosity, low-redshift and high-luminosity, high-redshift objects. Even so, the majority of galaxies in all these studies have similar luminosity ranges, and their findings are very similar. Kelvin et al. quote an increase in average Sérsic index of early types of  $\sim 30$  per cent over  $g$  to  $K$ . However, as with La Barbera et al., the trend is rather noisy, and fairly consistent with being flat.



**Figure 20.** Stacked  $\mathcal{N}_g^H$  gradients, for galaxies with similar colour and Sérsic index. For each set of stacks, we divide the galaxy sample into three groups, by cutting at  $\mathcal{N}_g^H = 1.4$  and  $1.9$  (see text for details). In each subplot, the top panels show the stacked images using the  $H,z,g$  bands, the second-to-top panels show the residuals, the second-to-bottom panels show the ratio of the  $H$  and  $g$  residuals and the bottom panels show the radial profiles of the  $H$ ,  $z$  and  $g$  residuals. Numbers in parenthesis are the numbers of galaxies used in each stack. The  $H,z,g$  stack and residuals are displayed using the colour-preserving method of Lupton et al. (2004). The stack images have an asinh stretch, while the residual images are shown with a linear stretch. The  $H/g$  residuals image has a false-colour scale, where green corresponds to equal residuals in  $H$  and  $g$ , red indicates that the  $H$  residuals are brighter than those in  $g$  and blue indicates the converse. Each image is 30 pixels across. The radial profiles show the fractional difference in flux between this image stack and that of all objects in the same colour and Sérsic index subsample. It is clear that galaxies with higher  $\mathcal{N}$  are fainter and redder in the centre, but bluer at intermediate radii, and vice versa for lower values of  $\mathcal{N}$ . We do not show images for blue and green *high-n* galaxies because they are too few to produce meaningful stacked images.



**Figure 21.** Stacked  $\mathcal{R}_g^H$  gradients, for galaxies with similar colour and Sérsic index. For each set of stacks, we divide the galaxy sample into three groups, by cutting at  $\mathcal{R}_g^H = 0.70$  and  $0.85$  (see text for details). Panels are as in Fig. 20. Each image is 30 pixel across. Galaxies with lower  $\mathcal{R}$  are redder in the centre, and vice versa for higher values of  $\mathcal{R}$ . We do not show images for blue and green *high-n* galaxies because they are too few to produce meaningful stacked images.

Kelvin et al. (2012) expand on the study of La Barbera et al. (2010a) by also considering the late-type galaxy population. These exhibit a more dramatic change in average Sérsic index, increasing by 52 per cent from  $g$  to  $K$ , and a more gentle variation in effective radius, decreasing by 25 per cent over the same wavelength range. We find an identical 25 per cent variation in effective radius, but an even more extreme variation in Sérsic index, of  $\sim 100$  per cent (i.e. a factor of 2) from rest-frame  $u$  to  $H$  band.

Our results are therefore in excellent qualitative agreement with those of Kelvin et al. (2012). It may be that the differing selections

play a role in the detailed differences: in addition to the different luminosity ranges, the joint  $n_K$  and  $(u - r)$  selection adopted by Kelvin et al. contrasts with our orthogonal  $n_r$  and  $(u - r)$  selections. For example, Kelvin et al. includes objects with low Sérsic index ( $n \sim 1$ ) in the early-type sample provided they are sufficiently red. We also expect our individual measurements to display significantly less scatter, due to our multiwavelength method (H13; Vika et al. 2013), which may help us recover smoother, more accurate trends.

Note that Kelvin et al. chose to classify galaxies using the Sérsic index in the  $K$  band, in order to avoid any potential misclassifications

due to the effects of dust attenuation. However, we assert that it is cleaner to use an optical Sérsic index for this purpose, as the separation between early- and late-type galaxies is greater at shorter wavelengths.

Since our analysis is based on the same imaging, we can directly compare our results to Kelvin et al. (2012). We have tried applying their selection criteria to our measurements and find excellent agreement between the recovered trends. When averaging over a large sample, our different approaches to measuring the wavelength dependence of Sérsic index and effective radius give very similar results.

## 5.2 Physical implications

The patterns revealed in Fig. 17 provide important insights regarding the links between the stellar populations and internal structures of galaxies. Some of the revealed trends are rather surprising and deserve deeper investigation.

### 5.2.1 Early-type galaxies

For *high- $n$*  galaxies, the constancy of Sérsic index with wavelength ( $\mathcal{N} \sim 1$ ), despite strong variations in effective radius ( $\mathcal{R} < 1$ ), points to very substantial differences in the stellar populations of early types as a function of radius, but which are not associated with a change in profile shape.

Our clear result that *high- $n$*  galaxies appear substantially smaller at longer wavelengths appears to largely rule out the scenario in which gas-rich mergers build high- $n$  galaxies that are a combination of an old (red), large- $R_e$  component together with a younger (bluer), inner stellar component formed from the gas (Hopkins et al. 2008, 2009). If this is a significant mechanism in the formation of massive ellipticals, it must primarily occur at higher redshifts, and its signatures must be eclipsed by subsequent evolutionary processes, such as dry minor mergers (e.g. two-phase galaxy formation; Oser et al. 2010).

Lower mass galaxies (both star forming and passive) contain younger and lower metallicity stellar populations, and are therefore bluer in colour (e.g. Kauffmann et al. 2003). At later times, accreting material will fall on to the primary galaxy at higher velocities, as both the total mass of the primary and the distance from which merging galaxies originate increases with time. Stars accreted at later times relax into a more extended structure than the stars produced in the initial formation of the primary galaxy (Naab, Johansson & Ostriker 2009). This is analogous to the preferential accretion of collisionless dark matter to the outskirts of haloes, leaving their inner profiles unchanged (Hiotelis 2003; Salvador-Solé, Manrique & Solanes 2005). Recent simulation studies have demonstrated similar behaviour for stars accreted on to galaxies during minor mergers (Cooper et al. 2013; Hilz, Naab & Ostriker 2013). Stars added by minor mergers end up in extended Sérsic profiles resulting in a substantial increase in their effective radii for a modest increase in mass. This ‘inside-out’ growth scenario has gained widespread support as the mechanism responsible for the dramatic evolution of compact high-redshift ellipticals to their present, extended forms (e.g. Hopkins et al. 2010).

Early-type galaxies are thus expected to comprise a compact red population of stars formed in situ and a more diffuse, bluer population of stars formed in accreted systems. It is therefore reasonable for their effective radius to decrease with wavelength. However, as well as increasing the effective radius, the addition of surface brightness to the outskirts of galaxies would also be expected

to increase the Sérsic index. Indeed, this effect is seen in previously mentioned simulations (Cooper et al. 2013; Hilz et al. 2013), and is consistent with observations of massive elliptical galaxies with high Sérsic indices (Kormendy et al. 2009). So, how can we reconcile the substantial variation in effective radius with wavelength with little or no corresponding change in Sérsic index?

The reality is that an early-type galaxy will have experienced a variety of merger events. The stars from each of these will be accreted over different ranges of radius, while in situ stars will be somewhat redistributed, and the presence of gas may lead to the formation of stars in the galaxy centre. Adding stars in the outskirts of a galaxy increases  $n$  and  $R_e$ . Adding stars in the centre increases  $n$  and decreases  $R_e$ . However, adding stars at the effective radius (i.e.  $\sim 1 R_e$ ) decreases  $n$  with no change in  $R_e$ . So, by adding material around  $R_e$  as well as further out, it is possible to increase  $R_e$  while maintaining  $n$  roughly constant. Also note that as the effective radius grows due to stellar accretion, subsequent accretion at the same physical radius (in terms of absolute distance and gravitational potential) will be closer to the effective radius, and hence will act to stabilize  $n$ . It can be easily checked that the sum of multiple Sérsic profiles spanning a range of  $R_e$ , but each with the same  $n$  and similar central surface brightness or total magnitude, is well approximated by another Sérsic profile with a similar value of  $n$  and intermediate  $R_e$  (though this does depend somewhat on the weighting given to different radii). Measuring significant variations in  $R_e$  with wavelength ( $\mathcal{R} < 1$ ), but small variations in  $n$  ( $\mathcal{N} \sim 1$ ), therefore appears to be a natural outcome of the two-stage formation scenario.

Cosmological models incorporating these various early-type evolutionary processes are now becoming available (e.g. Shankar et al. 2013). Comparing the properties of simulated populations of spatially resolved galaxies to the results of this paper will help to determine if and when each of these processes are occurring.

### 5.2.2 Late-type galaxies

For *low- $n$*  objects, there is a substantial increase in the average Sérsic index from  $\langle n \rangle \sim 1$  in the blue to  $\langle n \rangle \sim 2$  in the NIR. This suggests that at short wavelengths, which are sensitive to young stellar populations, the galaxy profile is dominated by an exponential disc, while at longer wavelengths, which are more representative of total stellar mass, the surface brightness profile is steepened by the presence of a bulge.

Section 4 demonstrates that the effect of  $\mathcal{N} > 1$  and  $\mathcal{R} < 1$  is to produce a red galaxy centre and blue outskirts. As mentioned in the Introduction, such colour gradients of disc galaxies are typically attributed to radial age profiles, in that they are younger at larger radii. Considering colour gradients in terms of the wavelength dependence of Sérsic profile parameters gives a complementary perspective, and emphasizes the association between the stellar populations and structural components of these galaxies.

The fact that *low- $n$*  galaxies display only a small change in effective radius with wavelength, while showing a significant variation in Sérsic index, suggests that the bulge component in these systems is a spheroid with  $n \gtrsim 2$ , but which is not substantially smaller than the disc. This goes against conventional wisdom, but may be a result of our selection of very luminous galaxies, which are typically bulge dominated.

The different trends in Sérsic index versus wavelength seen for *red* and *blue/green low- $n$*  galaxies support the interpretation of  $\mathcal{N}$  and  $\mathcal{R}$  in terms of a bulge and disc. *Red low- $n$*  galaxies show very

little variation in Sérsic index ( $\mathcal{N} \sim 1$ ) because their bulge and disc components have similar red colours. *Green* and *blue low- $n$*  galaxies show more substantial variation ( $\mathcal{N} > 1$ ) because they possess a bluer disc, which contrasts with a red bulge.

Although the above argument provides a simple explanation, one must not underestimate the role of dust attenuation in driving, or at least complicating, the trends we observe for *low- $n$*  galaxies. Dust attenuation can significantly modify the apparent structure of a galaxy, and introduce substantial variations with wavelength. Obscuring the central region of a galaxy shifts the balance of total flux towards larger radii, artificially increasing the effective radius and reducing the Sérsic index, particularly at shorter wavelengths. This predicted effect has been well discussed in the literature (Evans 1994; Cunow 2001; Möllenhoff et al. 2006; Graham & Worley 2008). The effects on the recovered parameters of multiwavelength Sérsic model fits have been particularly studied by Pastrav et al. (2013a,b). We include their predictions in our Figs 9 and 16, which show that while some of the behaviour we observe may be attributable to dust, their model is not able to account for all of the measured variation in  $n$  and  $R_e$  with wavelength.

Dust is not expected to be a dominant factor in the attenuation of light within high- $n$  (spheroid-dominated) systems, hence variations in structural parameters with wavelength cannot be ascribed to its presence. Still, we find that these systems exhibit a larger variation in effective radius than that found in low- $n$  (disc-dominated) systems. Given that such substantial dependences of structure on wavelength are seemingly possible from stellar population gradients alone, it is difficult to judge the importance of dust in driving the trends in low- $n$  galaxies. Combining measurements of structural parameters versus wavelength with constraints on the mass and distribution of dust from submm observations and appropriate models (e.g. Popescu et al. 2011; Smith et al. 2012) will greatly help in this regard.

Finally, it should be mentioned that another possible explanation for peculiar variations in  $n$  and  $R_e$  with wavelength is the interdependence between recovered Sérsic index and effective radius. A change in the Sérsic index arising due to relatively subtle unmodelled effects, e.g. a small core dust component, additional unresolved or disturbed structure in the core, the presence of an active galactic nucleus or uncertainty in the PSF, may all induce compensatory changes in the measured effective radius. However, to be responsible for the average trends we describe, which represent the behaviour of most galaxies in each subsample, such perturbances must be the norm. Future work fitting more complex multicomponent models to specific galaxy samples will shed light on this issue, as well as address many of the science questions highlighted above.

### 5.3 Potential applications and further studies

In this paper, we have demonstrated how the wavelength dependence of Sérsic index ( $\mathcal{N}$ ) and effective radius ( $\mathcal{R}$ ) provide an alternative way of considering galaxy colour gradients, and enable a deeper appreciation of the physical origins of such gradients. For simplicity, we have focused on a sample of bright galaxies, with the added advantage that this selection demonstrates our method's ability to recover meaningful information even for poorly resolved galaxy images. Obvious next steps are to study the variation of  $\mathcal{N}$  and  $\mathcal{R}$  as a function of luminosity (or stellar mass) and to examine how the distinctions between galaxies of different colour and concentration (e.g. Fig. 17) are modified for lower luminosity systems. The distribution of colour gradients, and hence  $\mathcal{N}$  and  $\mathcal{R}$ , also varies significantly with environment (e.g. Weinmann et al. 2009), as implied by the dramatic change in the relationship be-

tween overall colour and morphology with environment (e.g. Bamford et al. 2009). The relative behaviour of colour, Sérsic index and their respective dependences on wavelength will help us better understand the physical origins of the environmental trends observed (e.g. Vulcani et al. 2012).

In addition to considering the overall distribution of  $\mathcal{N}$  and  $\mathcal{R}$  for particular galaxy samples, in this paper, we have discussed using  $\mathcal{N}$  and  $\mathcal{R}$  to classify galaxies and identify objects with specific properties. Our approach is somewhat similar to that presented by Park & Choi (2005), which uses  $(u - r)$  colour versus  $(g - i)$  colour gradient space to perform a morphological classification of galaxies in SDSS. In this space, galaxies form well-separated early- and late-type branches. The location of galaxies along the branches reflects the degree and locality of star formation activity, and monotonically corresponds to a sequence in morphology. An analysis of the correspondence between  $\mathcal{N}$ ,  $\mathcal{R}$  and morphology is underway (Vika et al., in preparation), using the same small, but very well characterized, sample of galaxies studied in Vika et al. (2013). One major advantage of utilizing colour gradient information is that blue early-type galaxies are separated from spiral galaxies, as the former tend to have either a nearly constant colour profile or bluer cores, while the latter tend to have a red central bulge plus blue outer disc. We can make similar distinctions using the different  $\mathcal{N}$  and  $\mathcal{R}$  behaviour for galaxies with contrasting internal structures. Both Park & Choi and our method are capable of identifying a variety of unusual objects, such as central starbursts and passive disc galaxies. We therefore foresee much potential in studying the occurrence of such galaxies as a function of stellar mass and environment.

Of course, another extension of this work would be to go beyond single-Sérsic profiles, to fit multiple component models. These are already starting to be used to great effect (e.g. Hudson et al. 2010; Huang et al. 2013b; Lackner & Gunn 2013). Using a multicomponent, wavelength-dependent model is straightforward with GALFITM, and we are currently working with bulge–disc decompositions to help identify the correct interpretation of the trends in single-Sérsic parameters. However, while multicomponent models provide more detail, they require more assumptions, not least that the chosen multicomponent combination is appropriate to each galaxy in question. They are also more sensitive to practical details of galaxy data, e.g. the presence of spiral arms or small, undebled companions, and ensuring one finds that the true optimal fit is considerably more difficult. The simplicity and robustness of single-Sérsic fitting means that it will long continue to be a valuable approach, especially when pushing the  $S/N$  and resolution boundaries of any data set.

## 6 SUMMARY

We have studied the dependence of Sérsic index ( $n$ ) and effective radius ( $R_e$ ) on wavelength using a volume-limited sample of bright galaxies ( $M_r < -21.2$ ,  $z < 0.3$ ), with homogeneous *ugrizYJHK* imaging compiled by the GAMA survey (Hill et al. 2011). The Sérsic profile parameters were obtained by exploiting the capability of GALAPAGOS-2 and GALFITM to fit consistent, wavelength-dependent galaxy models to a collection of multiwavelength imaging. These measurements have been shown to be more accurate and robust than those obtained by fitting galaxies independently in each waveband (see H13; Vika et al. 2013).

We presented the wavelength dependence of the Sérsic index and effective radius distributions for the entire sample, and for subsamples split by rest-frame  $(u - r)$  colour and the  $r$ -band Sérsic index ( $n_r$ ). Importantly, our multiwavelength measurements are accurate and meaningful on an individual galaxy basis. Our analysis is thus

able to go a step further than previous studies and consider the wavelength variation of  $n$  and  $R_e$  for individual galaxies. We describe this using the ratio of the values in two wavebands, which we denote as  $\mathcal{N}$  and  $\mathcal{R}$ , respectively. In this paper, we primarily focus on variations between  $g$  and  $H$  band, which is representative of the behaviour for other pairs of optical and NIR bands. We present the distributions of  $\mathcal{N}$  and  $\mathcal{R}$  for the various colour and Sérsic index combinations, and show that their unimodality implies that results based on population trends well represent the behaviour of individual galaxies in each subsample. The dependence of median ( $\mathcal{N}$ ) and ( $\mathcal{R}$ ) on wavelength shows contrasting trends for different galaxy types, which reveal their different physical natures. The  $\mathcal{N}$ – $\mathcal{R}$  plane can be used to classify galaxies and, particularly in combination with colour and Sérsic index, identify objects with interesting properties. Finally, we have illustrated the implications of  $\mathcal{N}$  and  $\mathcal{R}$  on the appearance of galaxies, and demonstrated their relationship to colour gradients, by co-adding images for various selections.

Our main results from all this analysis can be summarized as follows. All these results are based on a volume-limited sample of bright galaxies. The studied trends are likely to vary for the less-luminous, dwarf galaxy population, but we leave an exploration of this issue for future work.

(i) Galaxies of opposing colour are characterized by very different Sérsic index distributions, which depend differently upon the wavelength at which the Sérsic index is measured. The median Sérsic index for *red* galaxies does not depend on wavelength, while for our *blue* and *green* galaxy subsamples, the median Sérsic index increases significantly at longer wavelengths. In contrast, galaxies with different colours display similar distributions of effective radius. While galaxies in our *red* subsample are typically slightly smaller than the others, the distributions of all colours shift consistently towards lower values at longer wavelengths.

(ii) Using Sérsic index to divide the galaxy population, *high- $n$*  galaxies display much less Sérsic index variation with wavelength than *low- $n$*  galaxies. *Red*, *high- $n$*  galaxies show no significant dependence of Sérsic index on wavelength at all. On average, they possess a classic de Vaucouleur profile at all wavelengths. *Bluer high- $n$*  galaxies show mild dependences on wavelength. However, the median Sérsic index for our *green high- $n$*  subsample increases towards longer wavelengths, while our more extreme *blue high- $n$*  subsample shows a significant decrease. The Sérsic indices of *low- $n$*  galaxies increase dramatically towards longer wavelengths, irrespective of colour, though our *red low- $n$*  subsample shows slightly less variation.

(iii) With regard to effective radius, *low- $n$*  samples of all colours display very similar behaviour. Our *high- $n$*  samples show stronger trends, which vary for different colour selections. In all the cases, sizes decrease towards redder wavelengths.

(iv) By measuring for the first time the dependence of Sérsic index on wavelength for individual galaxies ( $\mathcal{N}$ ), we find that this quantity adds important information about galaxy structure, helping to robustly separate single-component and bulge–disc systems. *Low- $n$*  galaxies show  $\mathcal{N} > 1$ , with the value strongly increasing with the wavelength range considered, suggesting a combination of a blue exponential disc and smaller and/or higher- $n$  red spheroid. *High- $n$*  galaxies show rather flat trends ( $\mathcal{N} \sim 1$ ), indicating that they are typically one-component objects. Galaxies that deviate from these behaviours are likely to be at interesting evolutionary stages.

(v) Similarly, the ratio of effective radii at different wavelengths ( $\mathcal{R}$ ) provides insight into the structural make-up of galaxies, although it does not present such disparate behaviour for the various colour and Sérsic index subsamples. The vast majority of galaxies have  $\mathcal{R} < 1$ ; at longer wavelengths, galaxies appear smaller. *Low- $n$*  galaxies show a mild dependence of effective radius on wavelength, which is identical for the different colour subsamples. *High- $n$*  galaxies have a more dramatic dependence, which is stronger for bluer samples.

(vi) Combining  $\mathcal{N}$  and  $\mathcal{R}$  together, we show that the medians of different galaxy types (in terms of colour and Sérsic index) display strikingly different variations in  $\langle \mathcal{N} \rangle$  and  $\langle \mathcal{R} \rangle$  with wavelength, which succinctly describe the correlations between their internal structures and stellar populations.

(vii) While galaxy subsamples do overlap in the  $\mathcal{N}$ – $\mathcal{R}$  plane, the location of a galaxy in this diagram puts useful constraints on its structural properties. This is particularly true if Sérsic index and colour are considered too, allowing one to identify, e.g. central starbursts, blue ellipticals, passive disc galaxies. The separation of galaxy populations in  $\mathcal{N}$ – $\mathcal{R}$  may improve for higher resolution and S/N imaging data.

(viii) On average, bright *high- $n$*  galaxies appear consistent with possessing multiple superimposed  $n \sim 4$  components, each with different effective radii, where the larger profiles are composed of bluer stellar populations. Since the vast majority of galaxies are significantly redder in their central regions, it appears that the proposed formation of young (blue), inner stellar components in elliptical galaxies from accreted gas is negligible for typical bright galaxies at recent times.

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