

# Galaxy Zoo: Evidence for Diverse Star Formation Histories through the Green Valley

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## ABSTRACT

Does galactic evolution proceed through the green valley via multiple pathways or as a single population? Motivated by recent results highlighting radically different evolutionary pathways between early- and late-type galaxies, we present results from a simple Bayesian approach to this problem wherein we model the star formation history of a galaxy and compare the predicted and observed optical and near-ultraviolet colours. We use a novel method to investigate the morphological differences between the most probable values for these parameters for both disc-like and elliptical-like populations of galaxies, by using probabilistic estimates of morphology from Galaxy Zoo\*. We find that the parameters for the green valley galaxies for both major morphologies follow those of the red sequence but at later times, predicting the build up of the red sequence. The green valley is therefore a transitional population regardless of morphology. However, the rate of this transition depends on the morphology, with three possible routes through the green valley dominated by smooth- (rapid timescales, attributed to major merger), intermediate- (intermediate timescales, attributed to minor mergers and galaxy interactions) and disc-like (slow timescales, attributed to secular evolution) galaxies. We hypothesise that morphological changes occur in systems which have undergone quenching with a timescale  $\tau < 1.5$  Gyr, in order for the evolution of galaxies in the green valley to match the ratio of smooth to disc galaxies observed in the red sequence. These rapid timescales are instrumental in the formation of the red sequence at earlier times, however we find that galaxies currently passing through the green valley typically do so at intermediate timescales. The onset of quenching for disc galaxies across the colour-magnitude diagram is distributed evenly over all lookback times, confirming the assumption that whatever is driving the evolution of discs is constant over cosmic time.

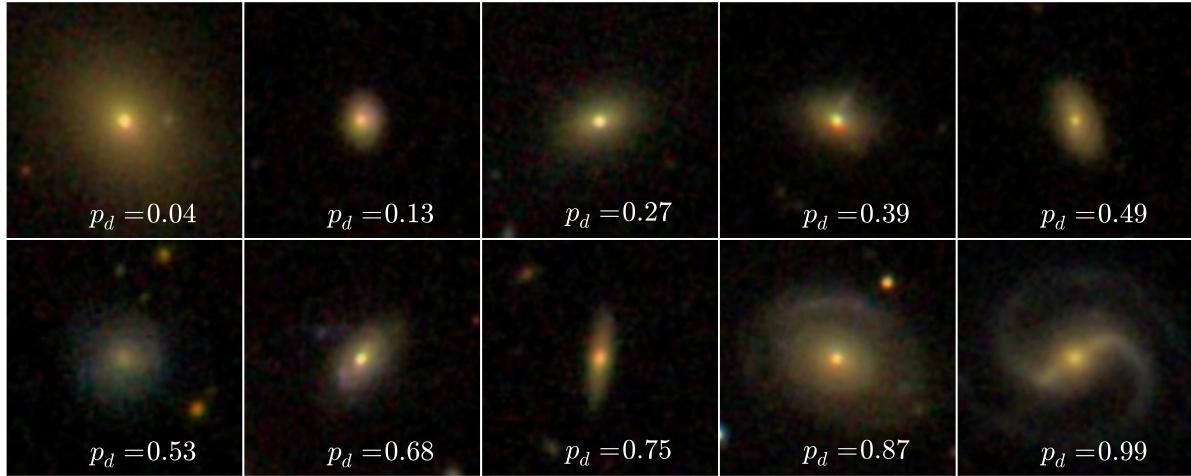
## 1 INTRODUCTION

Previous large scale surveys of galaxies have revealed a bimodality in the colour-magnitude diagram (CMD) with two distinct populations; one at relatively low mass, with blue optical colours and another at relatively high mass, with

red optical colours (Baldry et al. 2004, 2006; Willmer et al. 2006; Ball, Loveday & Brunner 2008; Brammer et al. 2009). These populations were dubbed the ‘blue cloud’ and ‘red sequence’ respectively. The Galaxy Zoo project (Lintott et al. 2011), which produced morphological classifications for a million galaxies, revealed that this bimodality is not entirely morphology driven (Strateva et al. 2001; Bamford et al. 2009; Skibba et al. 2009), detecting spiral galaxies in the red sequence (Masters et al. 2010) and elliptical galaxies in the blue cloud (Schawinski et al. 2009).

The sparsely populated colour space between these two

\* This investigation has been made possible by the participation of more than 250,000 users in the Galaxy Zoo project. Their contributions are individually acknowledged at <http://www.galaxyzoo.org/volunteers.aspx>



**Figure 1.** Randomly selected SDSS *gri* composite images showing the continuous probabilistic nature of the Galaxy Zoo sample from a redshift range  $0.070 < z < 0.075$ . The debiased disc vote fraction (see Willett et al. 2013) for each galaxy is shown. The scale for each image is 0.099 arcsec/pixel.

populations, the so-called ‘green valley’, provides clues to the nature and duration of galaxies’ transitions from blue to red. This transition must occur on rapid timescales, otherwise we would find an accumulation of galaxies residing in the green valley, rather than an accumulation in the red sequence as is observed (Arnouts et al. 2007; Martin et al. 2007). Green valley galaxies have therefore long been thought of as the ‘crossroads’ of galaxy evolution, a transition population between the two main galactic stages of the star forming blue cloud and the ‘dead’ red sequence (Bell et al. 2004; Wyder et al. 2007; Schiminovich et al. 2007; Martin et al. 2007; Faber et al. 2007; Mendez et al. 2011; Gonçalves et al. 2012; Schawinski et al. 2014; Pan et al. 2014).

The intermediate colours of these green valley galaxies have been interpreted as evidence for recent quenching (suppression) of star formation (Salim et al. 2007). Star forming galaxies are observed to lie on a well defined mass-SFR relation, however quenching a galaxy causes it to depart from this relation (Noeske et al. 2007; Peng et al. 2010; see Figure 5)

By studying the galaxies which have just left this mass-SFR relation, we can probe the quenching mechanisms by which this occurs. There have been many previous theories for the initial triggers of these quenching mechanisms, including negative feedback from AGN (Schawinski et al. 2007), mergers (Darg et al. 2010), supernovae winds (Marasco, Fraternali & Binney 2012) and secular evolution (Masters et al. 2010, 2011). By investigating the *amount* of quenching that has occurred in the blue cloud, green valley and red sequence; and by comparing the amount across these three populations, we can apply some constraints to these theories.

We have been motivated by a recent result suggesting two contrasting evolutionary pathways through the green valley by different morphological types (Schawinski et al. 2014, hereafter S14), specifically that late-type galaxies quench very slowly and form a nearly static disc population in the green valley, whereas early-type galaxies quench

very rapidly, transitioning through the green valley and onto the red sequence in  $\sim 1$  Gyr (Wong et al. 2012). That study used a toy model to examine quenching across the green valley. Here we implement a novel method utilising Bayesian statistics (for a comprehensive overview of Bayesian statistics see either MacKay 2003 or Sivia 1996) in order to find the most likely model description of the star formation histories of galaxies in the three populations. This method also enables a direct comparison with our current understanding of galaxy evolution from stellar population synthesis (SPS, see section 3) models.

Through this approach, we aim to determine the following:

- (i) What previous star formation history (SFH) causes a galaxy to reside in the green valley at the current epoch?
- (ii) Is the green valley a transitional or static population?
- (iii) If the green valley is a transitional population, how many routes through it are there?
- (iv) Are there morphology-dependent differences between these routes through the green valley?

This paper proceeds as follows. Section 2 contains a description of the sample data, which is used in the Bayesian analysis of an exponentially declining star formation history model, all described in Section 3. Section 4 contains the results produced by this analysis, with Section 5 providing a detailed discussion of the results obtained. We also summarise our findings in Section 6. The zero points of all *ugriz* magnitudes are in the AB system and where necessary we adopt the WMAP Seven-Year Cosmological parameters (Jarosik et al. 2011) with  $(\Omega_m, \Omega_\lambda, h) = (0.26, 0.73, 0.71)$ .

## 2 DATA

### 2.1 Multi-wavelength data

The galaxy sample is compiled from publicly available optical data from the Sloan Digital Sky Survey (SDSS;

**Table 1.** Table showing the decomposition of the GZ2 sample by galaxy type into the subsets of the colour-magnitude diagram.

	All	Red Sequence	Green Valley	Blue Cloud
Smooth-like ( $p_s > 0.5$ )	42453 (33.6%)	17424 (13.8%)	10687 (8.4%)	14342 (11.3%)
Disc-like ( $p_d > 0.5$ )	83863 (66.4%)	10722 (8.4%)	13257 (10.5%)	59884 (47.4%)
Early-type ( $p_s \geq 0.8$ )	10517 (8.3%)	5337 (4.2%)	2496 (2.0%)	2684 (2.1%)
Late-type ( $p_s \geq 0.8$ )	51470 (40.9%)	4493 (3.6%)	6817 (5.4%)	40430 (32.0%)
<b>Total</b>	<b>126316</b> (100.0%)	28146 (22.3%)	23944 (18.9%)	74226 (58.7%)

York et al. 2000) Data Release 8 (Aihara et al. 2011). Near-ultraviolet (NUV) photometry was obtained from the Galaxy Evolution Explorer (GALEX; Martin et al. 2005) and was matched with a search radius of  $1''$  in right ascension and declination.

Observed optical and ultraviolet fluxes are corrected for dust reddening using estimates of internal extinction (Oh et al. 2011) by applying the Cardelli et al. (1989) law. We also adopt k-corrections to  $z = 0.0$  from the NYU-VAGC (Blanton et al. 2005; Padmanabhan et al. 2008; Blanton & Roweis 2007) with a typical  $u-r$  correction of  $\sim 0.05$  mag. Omitting these corrections does not change the results significantly.

We obtained star formation rates and stellar masses from the MPA-JHU catalog (Kauffmann et al. 2003; Brinchmann et al. 2004; average values, AVG, corrected for aperture and extinction), which are in turn calculated from the SDSS spectra and photometry.

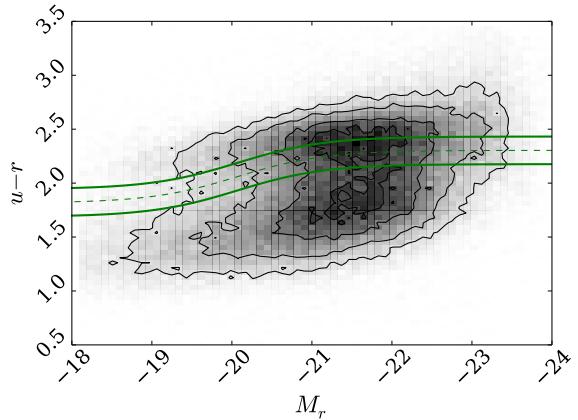
We further select a sub-sample with detailed morphological classifications, as described below.

## 2.2 Galaxy Zoo 2 Morphological classifications

In this investigation we use visual classifications of galaxy morphologies from the Galaxy Zoo 2<sup>1</sup> citizen science project (Willett et al. 2013), which obtains multiple independent classifications for each galaxy image; the full question tree for each image is shown in Figure 1 of Willett et al. 2013.

The Galaxy Zoo 2 (GZ2) project consists of 304,022 images from the SDSS DR8 (a subset of those classified in Galaxy Zoo 1; GZ1) all classified by *at least* 17 independent users, with the mean number of classifications standing at  $\sim 42$ . The GZ2 sample is more robust than the GZ1 sample and provides more detailed morphological classifications, including features such as bars, the number of spiral arms and the ellipticity of smooth galaxies. It is for these reasons we use the GZ2 sample, as opposed to the GZ1, allowing for further investigation of specific galaxy classes in the future (see Section 5.4). The only selection that was made on the sample was to remove objects considered to be stars or artefacts by the users (i.e. with  $p_{\text{star/artefact}} \geq 0.8$ ). Further to this, we required NUV photometry from the GALEX survey, within which  $\sim 42\%$  of the GZ2 sample were observed, giving a total sample size of 126,316 galaxies.

The first task asks users to choose whether a galaxy is mostly smooth, is featured and/or has a disc or is a



**Figure 2.** Colour-magnitude diagram for the Galaxy Zoo 2 population showing the definition between the blue cloud and the red sequence from Baldry et al. (2004) with the dashed line, as defined in Equation 1. The solid lines show  $\pm 1\sigma$  either side of this definition; any galaxy within the boundary of these two solid lines is considered a green valley galaxy. The overwhelming numbers of blue galaxies in the sample make the green valley hard to see by eye, therefore a literature definition of the green valley is used, to ensure comparisons can be made with other works.

star/artefact. Unlike other tasks further down in the decision tree, every user who classifies a galaxy image will complete this task (others, such as whether the galaxy has a bar, is dependent on a user having first classified it as a featured galaxy). Therefore we have the most statistically robust classifications at this level.

The classifications from users produce a vote fraction for each galaxy (the debiased fractions calculated by Willett et al. (2013) were used in this investigation); for example if 80 of 100 people thought a galaxy was disc shaped, whereas 20 out of 100 people thought the same galaxy was smooth in shape (i.e. elliptical), that galaxy would have vote fractions  $p_s = 0.2$  and  $p_d = 0.8$ . In this example this galaxy would be included in the ‘clean’ disc sample ( $p_d \geq 0.8$ ) according to Willett et al. (2013) and would be considered a late-type galaxy. All previous Galaxy Zoo projects have incorporated extensive analysis of volunteer classifications to measure classification accuracy and bias, and compute user weightings (for a detailed description of debiasing and consistency-based user weightings, see either Section 3 of Lintott et al. 2009 or Section 3 of Willett et al. 2013).

<sup>1</sup> <http://zoo2.galaxyzoo.org/>

The classifications are highly accurate and provide a continuous scale of morphological features, as shown in Figure 1, rather than a simple binary classification separating elliptical and disc galaxies. These classifications allow each galaxy to be considered as a probabilistic object with both bulge and disc components. For the first time, we incorporate this advantage of the GZ classifications into a large statistical analysis of how elliptical and disc galaxies differ in their SFHs.

### 2.3 Defining the Green Valley

To define which of the sample of 126,316 galaxies were in the green valley, we looked to previous definitions in the literature defining the separation between the red sequence and blue cloud to ensure comparisons can be made with other works. Baldry et al. (2004) used a large sample of local galaxies from the SDSS to trace this bimodality by fitting double Gaussians to the colour magnitude diagram without cuts in morphology. Their relation is defined in their Equation 11 as:

$$C'_{ur}(M_r) = 2.06 - 0.244 \tanh\left(\frac{M_r + 20.07}{1.09}\right) \quad (1)$$

and is shown in Figure 2 by the dashed line. This ensures that the definition of the green valley used is derived from a complete sample, rather than from our sample that is dominated by blue galaxies due to the necessity for NUV photometry. Any galaxy within  $\pm 1\sigma$  of this relationship, shown by the solid lines in Figure 2, is therefore considered a green valley galaxy. The decomposition of the sample into red sequence, green valley and blue cloud galaxies is shown in Table 1 along with further subsections by galaxy type. This table also lists the definitions we adopt henceforth for early-type ( $p_s \geq 0.8$ ), late-type ( $p_d \geq 0.8$ ), smooth-like ( $p_s > 0.5$ ) and disc-like ( $p_d > 0.5$ ) galaxies.

## 3 MODELS

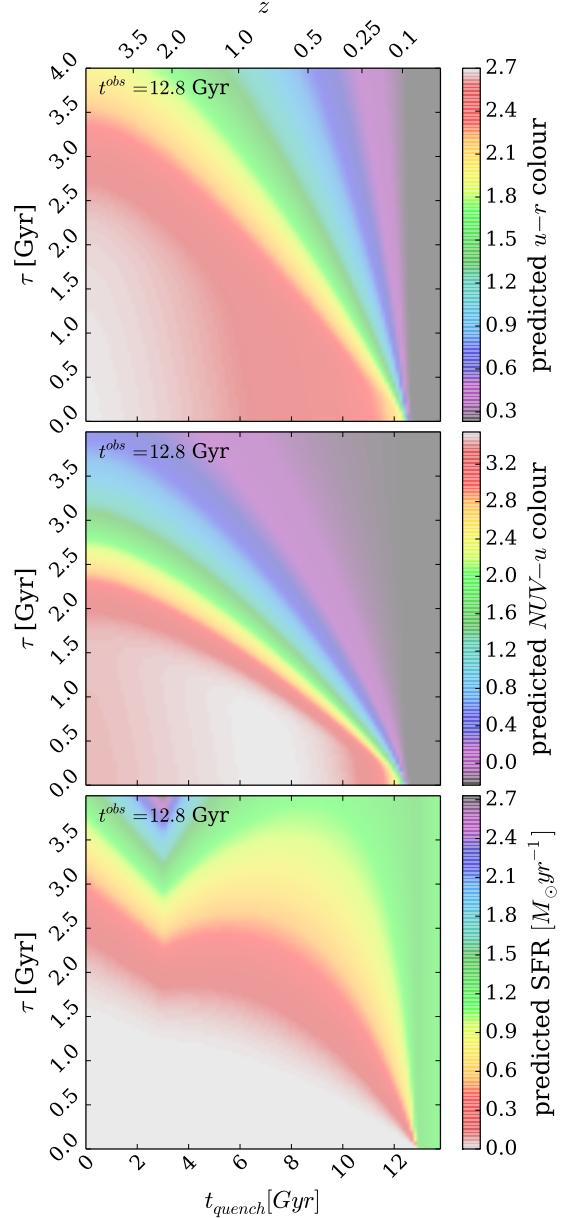
### 3.1 Quenching Models

The quenched star formation history (SFH) of a galaxy can be simply modelled as an exponentially declining star formation rate (SFR) across cosmic time ( $0 \leq t [\text{Gyr}] \leq 13.8$ ) as:

$$\text{SFR} = \begin{cases} i_{sfr}(t_q) & \text{if } t < t_q \\ i_{sfr}(t_q) \times \exp\left(\frac{-(t-t_q)}{\tau}\right) & \text{if } t > t_q \end{cases} \quad (2)$$

where  $t_q$  is the onset time of quenching,  $\tau$  is the timescale over which the quenching occurs and  $i_{sfr}$  is an initial constant star formation rate dependent on  $t_q$ . A smaller  $\tau$  value corresponds to a rapid quench, whereas a larger  $\tau$  value corresponds to a slower quench.

We assume that all galaxies formed at a time  $t = 0$  Gyr with an initial burst of star formation. The mass of this initial burst is controlled by the value of the  $i_{sfr}$  which is set as the average specific SFR (sSFR) at the time of quenching  $t_q$ . By empirically fitting to SDSS data, Peng et al. (2010) defined a relation (their equation 1) for the average sSFR



**Figure 3.** Quenching timescale  $\tau$  versus quenching onset time  $t$  in all three panels. Colour shadings show model predictions of the  $u - r$  optical colour (top panel),  $NUV - u$  colour (middle panel), and star formation rate in  $M_\odot \text{ yr}^{-1}$  (lower panel), at  $t^{obs} = 12.8$  Gyr, the mean ‘observed’ time of the GZ2 sample. The combination of optical and NUV colours is a sensitive measure of the  $\theta = [t_q, \tau]$  parameter space. Note that all models with  $t > 12.8$  Gyr are effectively un-quenched. The ‘kink’ in the bottom panel is due to the assumption that the sSFR is constant prior to  $t \sim 3$  Gyr ( $z \sim 2.2$ ).

and redshift (cosmic time,  $t$ ) as:

$$sSFR(m, t) = 2.5 \left( \frac{m}{10^{10} M_\odot} \right)^{-0.1} \left( \frac{t}{3.5} \right)^{-2.2} \text{ Gyr}^{-1}. \quad (3)$$

Beyond  $z \sim 2$  the characteristic SFR flattens and is roughly constant back to  $z \sim 6$ . The cause for this change is not well understood but can be seen across similar observational

data (Peng et al. 2010; González et al. 2010; Béthermin et al. 2012). Motivated by these observations, the relation defined in Peng et al. (2010) is taken up to a cosmic time of  $t = 3$  Gyr ( $z \sim 2.3$ ) and prior to this a constant average SFR is assumed (see Figure 6). At the point of quenching,  $t_q$ , the models are defined to have a SFR which lies on this relationship for the sSFR, for a galaxy with mass,  $m = 10^{10.27} M_\odot$  (the mean mass of the GZ2 sample; see Section 4).

Under these assumptions the average SFR of our models will result in a lower value than the relation defined in Peng et al. (2010) at all cosmic times; each galaxy only resides on the ‘main sequence’ at the point of quenching. However galaxies cannot remain on the ‘main sequence’ from early to late times throughout their entire lifetimes given the unphysical stellar masses and SFRs this would result in at the current epoch in the local Universe (Béthermin et al. 2012; Heinis et al. 2014). If we were to include prescriptions for no quenching, starbursts, mergers, AGN etc. into our models we would improve on our reproduction of the average SFR across cosmic time; however we chose to initially focus on the simplest model possible.

Once this evolutionary SFR is obtained, it is convolved with the Bruzual & Charlot (2003) population synthesis models to generate a model SED at each time step. The observed features of galaxy spectra can be modelled using simple stellar population techniques which sum the contributions of individual, coeval, equal-metallicity stars. The accuracy of these predictions depends on the completeness of the input stellar physics. Comprehensive knowledge is therefore required of (i) stellar evolutionary tracks and (ii) the initial mass function (IMF) to synthesise a stellar population accurately.

These stellar population synthesis (SPS) models are an extremely well explored (and often debated) area of astrophysics (Maraston 2005; Eminian et al. 2008; Conroy, Gunn & White 2009; Falkenberg et al. 2009; Chen et al. 2010; Kriek et al. 2010; Miller, Rose & Cecil 2011; Melbourne et al. 2012). In this investigation we chose to utilise the Bruzual & Charlot (2003) *GALEXEV* SPS models, to allow a direct comparison with S14, along with a Chabrier (Chabrier et al. 2003) IMF, across a large wavelength range ( $0.0091 < \lambda [\mu\text{m}] < 160$ ) with solar metallicity ( $\text{m62}$  in the Bruzual & Charlot (2003) models; hereafter BC03).

Fluxes from stars younger than 3 Myr in the SPS model are suppressed to mimic the large optical depth of protostars embedded in dusty formation cloud (as in S14), then filter transmission curves are applied to the fluxes to obtain AB magnitudes and therefore colours. Given that information about these modelled populations is available across all cosmic time, they can be ‘observed’ at a given time in their history  $t^{obs}$ ; this corresponds to the observed redshift of the GZ2 sample given the modelling assumptions. Therefore, for the GZ2 sample, the observed redshift was used to calculate the assumed age of each galaxy, in order to compare the observed colours to the predicted models colours directly.

Figure 3 shows these predicted optical and NUV colours at a time of  $t^{obs} = 12.8$  Gyr (the average observed time of the Galaxy Zoo 2 sample,  $z \sim 0.076$ ) provided by the exponential SFH model. These predicted colours will be referred to as  $d_{c,p}(t_q, \tau, t^{obs})$ , where  $c=\{\text{opt}, \text{NUV}\}$  and  $p = \text{predicted}$ . The SFR at a time of  $t^{obs} = 12.8$  Gyr is also shown in Figure 3 to compare how this correlates with the predicted

colours. The  $u - r$  predicted colour shows an immediate correlation with the SFR, however the  $NUV - u$  colour is more sensitive to the value of  $\tau$  and so is ideal for tracing any recent star formation in a population. At small  $\tau$  (rapid quenching timescales) the  $NUV - u$  colour is insensitive to  $t_q$ , whereas at large  $\tau$  (slow quenching timescales) the colour is very sensitive to  $t_q$ . Together the two colours are ideal for tracing the effects of  $t_q$  and  $\tau$  in a population.

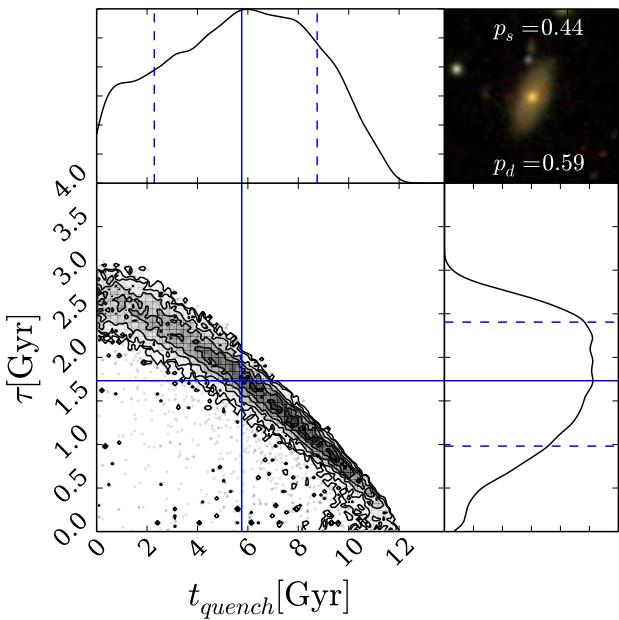
We stress here that this model is not a fully hydrodynamical simulation, it is a simple model built in order to test the understanding of the evolution of galaxy populations. These models are therefore not expected to accurately determine the SFH of every galaxy in the GZ2 sample, in particular galaxies which have not undergone any quenching. In this case the models described above can only attribute a constant star formation rate to these unquenched galaxies. In reality, there are many possible forms of SFH that a galaxy can take, a few of which have been investigated in previous literature; starbursts (Canalizo & Stockton 2001), a power law (Glazebrook et al. 2003), single stellar populations (Trager et al. 2000; Snchez-Blzquez et al. 2006; Vazdekis et al. 2010) and metallicity enrichment (de Lucia 2014). Incorporating these different SFHs into our models is a possible future extension to this work once the results of this initial study are well enough understood to permit additional complexity to be added.

### 3.2 Probabilistic Fitting

In order to achieve robust conclusions we conduct a Bayesian analysis (Sivia 1996; MacKay 2003) of our SFH models in comparison to the observed GZ2 sample data. This approach requires consideration of all possible combinations of  $\theta \equiv (t_q, \tau)$ . Assuming that all galaxies formed at  $t = 0$  Gyr with an initial burst of star formation, we can assume that the ‘age’ of each galaxy in the GZ2 sample is equivalent to an observed time,  $t_k^{obs}$  (see Section 2.2). We then use this ‘age’ to calculate the predicted model colours at this cosmic time for a given combination of  $\theta$ :  $d_{c,p}(\theta_k, t_k^{obs})$  for both optical and NUV ( $c = \text{opt}, \text{NUV}$ ) colours. We can now directly compare our model colours with the observed GZ2 galaxy colours, so that for a single galaxy  $k$  with optical ( $u - r$ ) colour,  $d_{opt,k}$  and NUV ( $NUV - u$ ) colour,  $d_{NUV,k}$ , the likelihood  $P(d_k|\theta_k, t_k^{obs})$  is:

$$P(d_k|\theta_k, t_k^{obs}) = \frac{1}{\sqrt{2\pi\sigma_{opt,k}^2}} \frac{1}{\sqrt{2\pi\sigma_{NUV,k}^2}} \exp \left[ -\frac{(d_{opt,k} - d_{opt,p}(\theta_k, t_k^{obs}))^2}{\sigma_{opt,k}^2} \right] \exp \left[ -\frac{(d_{NUV,k} - d_{NUV,p}(\theta_k, t_k^{obs}))^2}{\sigma_{NUV,k}^2} \right], \quad (4)$$

We have assumed that  $P(d_{opt}|\theta_k, t_k^{obs})$  and  $P(d_{NUV}|\theta_k, t_k^{obs})$  are independent of each other and that the errors on the observed colours are also independent. To obtain the probability of each combination of  $\theta$  values given the GZ2 data:  $P(\theta_k|d_k, t_k^{obs})$ , i.e. how likely is a single SFH model given the observed colours of a single



**Figure 4.** Example output from STARFPY for a galaxy within the red sequence. The contours show the positions of the ‘walkers’ in the Markov Chain (which are analogous to the areas of high probability) for the quenching models described by  $\theta = (t_q, \tau)$  and the histograms show the 1D projection along each axis. Solid (dashed) blue lines show the best fit model (with  $\pm 1\sigma$ ) to the galaxy data. The postage stamp image from SDSS is shown in the top right along with the vote fractions for smooth ( $p_s$ ) and disc ( $p_d$ ) from Galaxy Zoo 2.

GZ2 galaxy, we utilise Bayes’ theorem:

$$P(\theta_k | d_k, t^{obs}) = \frac{P(d_k | \theta_k, t^{obs}) P(\theta_k)}{\int P(d_k | \theta_k, t^{obs}) P(\theta_k) d\theta_k}. \quad (5)$$

We assume a flat prior on the model parameters so that:

$$P(\theta_k) = \begin{cases} 1 & \text{if } 0 \leq t_q [\text{Gyr}] \leq 13.8 \text{ and } 0 \leq \tau [\text{Gyr}] \leq 4 \\ 0 & \text{otherwise} \end{cases} \quad (6)$$

As the denominator of Equation 5 is a normalisation factor, comparison between likelihoods for two different SFH models (i.e., two different combinations of  $\theta_k = [t_q, \tau]$ ) is equivalent to a comparison of the numerators. Calculation of  $P(\theta_k | d_k, t^{obs})$  for any  $\theta$  is possible given data for the GZ2 sample (or a sub-sample thereof). Markov Chain Monte Carlo (MCMC; MacKay 2003; Foreman-Mackey et al. 2013; Goodman & Weare 2010) provides a robust comparison of the likelihoods between  $\theta$  values; here we choose *emcee*, a Python implementation of an affine invariant ensemble sampler by Foreman-Mackey et al. (2013).

This method allows for a more efficient exploration of the parameter space by avoiding those areas with low likelihood. A large number of ‘walkers’ are started at an initial position where the likelihood is calculated; from there they individually ‘jump’ to a new area of parameter space. If the likelihood in this new area is greater (less) than the original position then the ‘walkers’ accept (reject) this change in position. Any new position then influences the direction

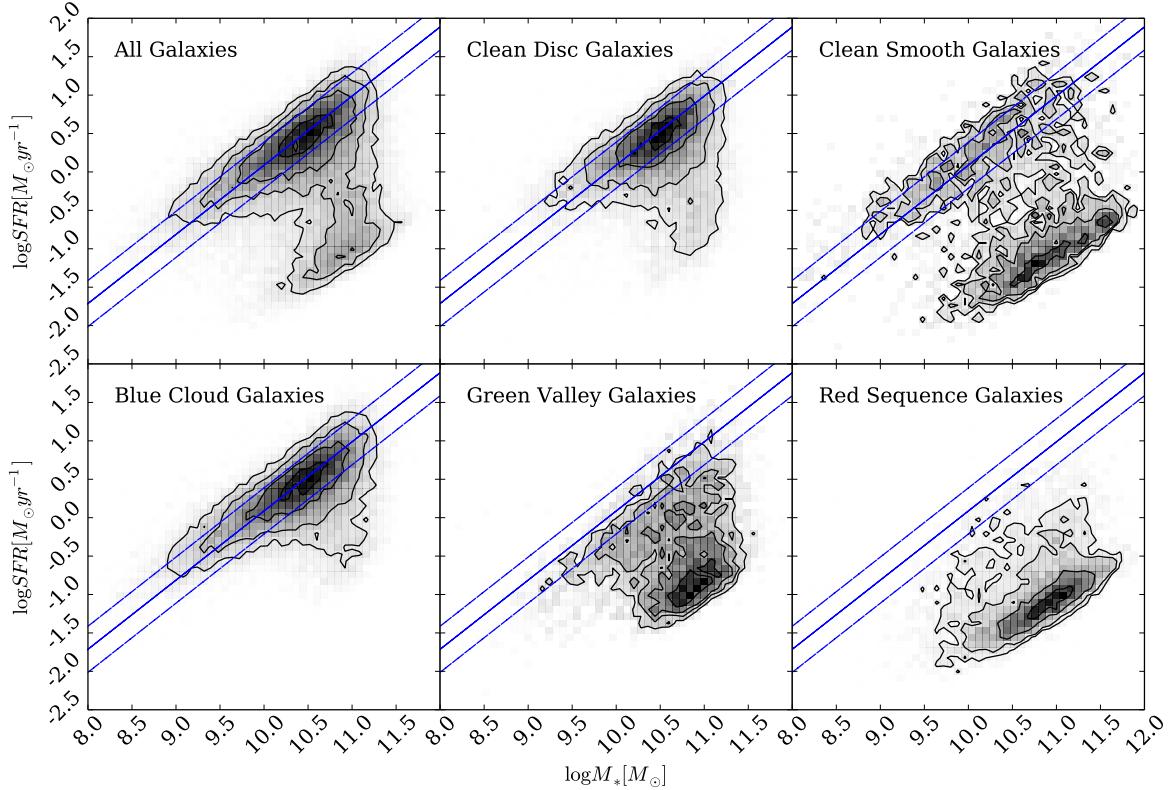
of the ‘jumps’ of other walkers. This is repeated for the defined number of steps after an initial ‘burn-in’ phase. *emcee* returns the positions of these ‘walkers’, which are analogous to the regions of high probability in the model parameter space. The model outlined above has been coded using the *Python* programming language into a package named STARFPY which has been made freely available to download<sup>2</sup>. An example output from this Python package for a single galaxy from the GZ2 sample in the red sequence is shown in Figure 4. The contours show the positions of the ‘walkers’ in the Markov Chain which are analogous to the areas of high probability.

We wish to consider the model parameters for the populations of galaxies across the colour magnitude diagram for both smooth and disc galaxies, therefore we run the STARFPY package on each galaxy in the GZ2 sample. This was extremely time consuming; for each combination of  $\theta$  values which *emcee* proposes, a new SFH must be built, prior to convolving it with the BC03 SPS models at the observed age and then predicted colours calculated from the resultant SED. For a single galaxy this takes up to 2 hours on a typical desktop machine for long Markov Chains. A look-up table was therefore generated at 50  $t^{obs}$ , for 100  $t_{quench}$  and 100  $\tau$  values; this was then interpolated over for a given observed galaxy’s age and proposed  $\theta$  values at each step in the Markov Chain. This ensured that a single galaxy took 2 minutes to run on a typical desktop machine. This interpolation was found to incorporate an error of  $\pm 0.04$  into the median  $\theta$  values (see Appendix section B for further information).

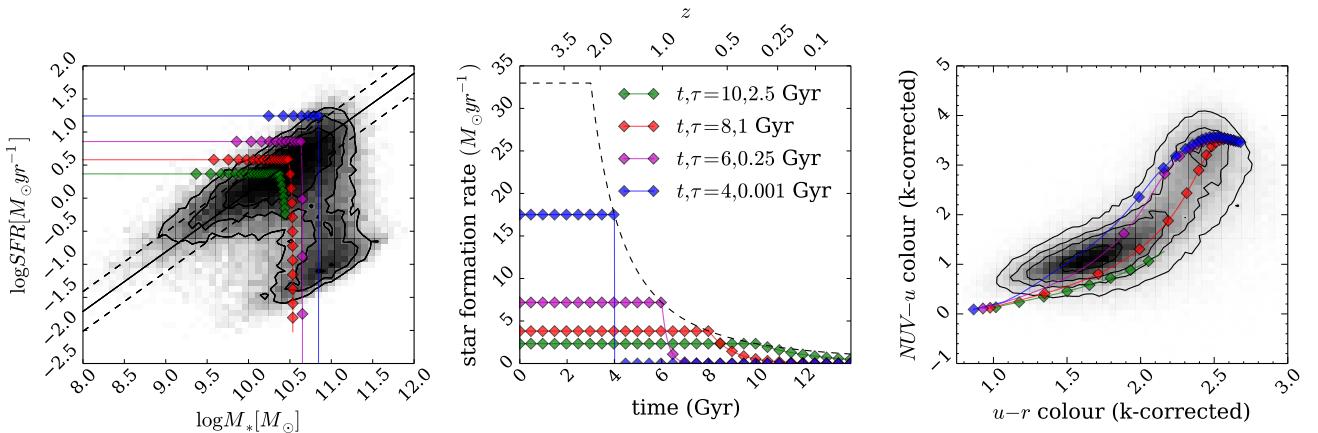
Using this lookup table, each of the 126,316 total galaxies in the GZ2 sample was run through STARFPY on multiple cores of a computer cluster to obtain the Markov Chain positions (analogous to  $P(\theta_k | d_k)$ ) for each galaxy,  $k$  (see Figure 4). In each case the Markov Chain consisted of 100 ‘walkers’ which took 400 steps in the ‘burn-in’ phase and 400 steps thereafter, at which point the MCMC acceptance fraction was checked to be within the range  $0.25 < f_{acc} < 0.5$  (which was true in all cases). Due to the Bayesian nature of this method, a statistical test on the results is not possible; the output is probabilistic in nature across the entirety of the parameter space.

These individual galaxy positions are then combined to visualise the areas of high probability in the model parameter space across a given population (e.g. the green valley). We do this by first discarding positions with a corresponding probability of  $P(\theta_k | d_k) < 0.2$  in order to exclude galaxies which are not well fit by the quenching model; for example blue cloud galaxies which are still star forming will be poorly fit by a quenching model (see Section 2). The Markov Chain positions are then binned and weighted by their corresponding logarithmic probability  $\log[P(\theta_k | d_k)]$ , provided by the *emcee* package, to further emphasise the features and differences between each population. The GZ2 data also provides uniquely powerful continuous measurements of a galaxy’s morphology, therefore we utilise the user vote fractions to obtain separate model parameters for both smooth and disc galaxies. This is obtained by also weighting by the morphology vote fraction when the binned positions are summed. We

<sup>2</sup> [github.com/rjsmethurst/starfp](https://github.com/rjsmethurst/starfp)



**Figure 5.** Star formation rate versus stellar mass diagrams show the different populations of galaxies (top row, left to right: all galaxies, GZ2 ‘clean’ disc and smooth galaxies; bottom row, left to right: blue cloud, green valley and red sequence galaxies) and how they contribute to the star forming sequence (from Peng et al. (2010), shown by the solid blue line with 0.3 dex scatter by the dashed lines). Based on positions in these diagrams, the green valley does appear to be a transitional population between the blue cloud and the red sequence. Detailed analysis of star formation histories can elucidate the nature of the different populations’ pathways through the green valley. The clean smooth and disc samples are described in Section 2.2.



**Figure 6.** Left panel: SFR vs.  $M_*$  for all 126,316 galaxies in our full sample (shaded contours), with model galaxy trajectories shown as coloured points/lines with each point representing a time step of 0.5 Gyr. The SFHs of the models are shown in the middle panel, where the SFR is initially constant before quenching at time  $t$  and thereafter exponentially declining with a characteristic timescale  $\tau$ . We set the SFR at the point of quenching to be consistent with the typical SFR of a star-forming galaxy at the quenching time,  $t$  (dashed line; Peng et al. 2010). The full range of models reproduces the observed colour-colour properties of the sample (right panel); for clarity the figures show only 4 of the possible models explored in this study.

stress that this portion of the methodology is a non-Bayesian visualisation of the combined individual galaxy results for each population.

For example, the galaxy shown in Figure 4 would contribute almost evenly to both the smooth and disc parameters due to the GZ2 vote fractions. Since galaxies with similar vote fractions contain both a bulge and disc component, this method is effective in incorporating intermediate galaxies which are thought to be crucial to the morphological changes between early- and late-type galaxies. It was the consideration of these intermediate galaxies which was excluded from the investigation by S14.

## 4 RESULTS

### 4.1 Initial Results

Figure 5 shows the SFR versus the stellar mass for the observed GZ2 sample which has been split into blue cloud, green valley and red sequence populations as well as into the ‘clean’ disc and smooth galaxy samples (with GZ2 vote fractions of  $p_d \geq 0.8$  and  $p_s \geq 0.8$  respectively). The green valley galaxies are indeed a population which have either left, or begun to leave, the star forming sequence or have some residual star formation still occurring. Interestingly, when we compare those galaxies which reside on the star forming sequence we find that the tail ends of this population (the low and high mass galaxies) are primarily made up of smooth galaxies as opposed to disc galaxies.

The left panel in Figure 6 shows how well the quenching models reproduce the observed relationship between the SFR and the mass of a galaxy, including how at the time of quenching they reside on the star forming sequence shown by the solid black line for a galaxy of mass,  $M = 10^{10.27} M_\odot$ .

These models were implemented in the STARFPY package to produce Figures 7, 8 & 9 for the red sequence, green valley and blue cloud populations of smooth and disc galaxies respectively. The percentages shown in Figures 7, 8 & 9 are calculated as the fractions of the combined posterior probability distribution located in each region of parameter space for a given population.

Since the sample contains such a large number of galaxies, we interpret these fractions as broadly equivalent to the percentage of galaxies in a given population undergoing quenching within the stated timescale range. Although this is not quantitatively exact, it is nevertheless a useful framework for interpreting the results of combining the individual posterior probability distributions of each galaxy. In this Section we refer to rapid, intermediate and slow quenching timescales which correspond to ranges of  $\tau$  [Gyr]  $< 1.0$ ,  $1.0 < \tau$  [Gyr]  $< 2.0$  and  $\tau$  [Gyr]  $> 2.0$  respectively.

### 4.2 Red Sequence Galaxies

The left hand panel of Figure 7 reveals that smooth galaxies found in the optical red sequence show a preference (49.5%) for rapid quenching timescales across all cosmic time. These are therefore the typical ‘red and dead’ galaxies expected to be found on the red sequence.

The rapid quenching timescales are dominant especially in smooth galaxies to  $z \sim 1$ , prior to which intermediate and

slower quenching timescales are the preferred mode. If we take into account the observed peak of average star formation rate in the Universe, which has been found to occur at  $z \sim 2$  (Hopkins 2004), we can assume that when more SF is occurring, quenching is a more arduous task. We can see that post  $z \sim 2$  the preference for the quenching time begins to rise (top histogram in the left hand panel of Figure 7), coinciding with the decline in the average star formation.

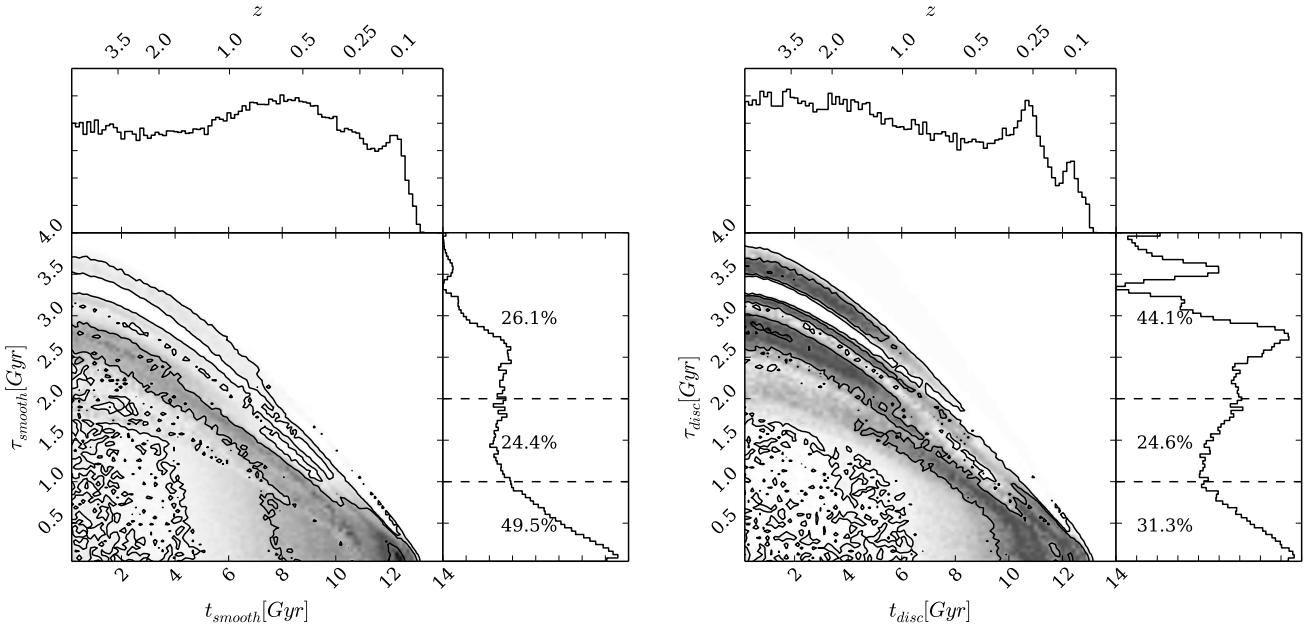
For these smooth red sequence galaxies we also see, at early times only, a preference for slow and intermediate timescales in the left panel of Figure 7. Perhaps this is the influence of intermediate galaxies (with  $p_s \sim p_d \sim 0.5$ ), hence why similar high likelihood areas exist for both the smooth-like and disc-like galaxies. This is especially apparent considering there are far more of these intermediate galaxies than those that are definitively early- or late-types (see Table 1). These galaxies are those whose morphology cannot be easily distinguished either because they are at a large distance or because they are an S0 galaxy whose morphology can be interpreted by different users in different ways. Willett et al. (2013) find that S0 galaxies expertly classified by Nair & Abraham (2010) are more commonly classified as ellipticals by GZ2 users, but have a significant tail to high disc vote fractions, giving a possible explanation as to the origin of this area of probability.

The right panel of Figure 7 reveals that disc galaxies show similar preferences for rapid (31.3%) and slow (44.1%) quenching timescales. The preference for very slow ( $\tau > 3.0$  Gyr) quenching timescales (which are not seen in either the green valley or blue cloud, see Figures 8 and 9) suggests that these galaxies have only just reached the red sequence after a very slow evolution across the colour-magnitude diagram. Considering their limited number it is likely that these galaxies are currently on the edge of the red sequence having recently (and finally) moved out of the green valley. Table 1 shows that 3.9% of our sample are red sequence clean disc galaxies, i.e. red late-type spirals. This is, within uncertainties, in agreement with the findings of Masters et al. (2010), who find  $\sim 6\%$  of late-type spirals are red when defined by a cut in the  $g - r$  optical colour at the ‘blue end of the red sequence’ (rather than with  $u - r$  as implemented in this investigation).

Despite the dominance of slow quenching timescales, the red sequence disc galaxies also show some preference for rapid quenching timescales (31.3%), similar to the red sequence smooth galaxies but with a lower probability. Perhaps these rapid quenching timescales can also be attributed to a morphological change, suggesting that the quenching has occurred more rapidly than the morphological change to a bulge dominated system.

The top histogram in the right panel of Figure 7 shows that the quenching preference for red sequence disc galaxies is distributed evenly over cosmic time. Downsizing has only ever been observed in elliptical galaxies (Thomas et al. 2010) therefore this detection of constant occurrence of quenching confirms that irrespective of the mechanism, the evolution of discs is constant over cosmic time.

Comparing the resultant SFRs for both the smooth- and disc-like galaxies in Figure 7 by noticing where the areas of high probability lie with respect to the bottom panel of Figure 3 (which shows the predicted SFR at an observation time of  $t \sim 12.8$  Gyr, the average ‘observed’ time of



**Figure 7.** Contour plots showing the combined positions in the Markov Chain for all galaxies in the red sequence, weighted by the logarithmic probability of each position (see Section 3.2) and also by the morphological vote fractions from GZ2 to give the areas of high probability in the model parameter space for both bulge (left) and disc (right) dominated systems. The histograms show the projection into one dimension for each parameter. The dashed lines show the separation between rapid ( $\tau$  [Gyr] < 1.0), intermediate ( $1.0 < \tau$  [Gyr] < 2.0) and slow ( $\tau$  [Gyr] > 2.0) quenching timescales with the fraction of the combined posterior probability distribution in each region shown (see Section 3.2).

the GZ2 population) reveals that red sequence disc galaxies with a preference for slow quenching still have some residual star formation occurring,  $SFR \sim 0.105 M_{\odot} yr^{-1}$ , whereas the smooth galaxies with a dominant preference for rapid quenching have a resultant  $SFR \sim 0.0075 M_{\odot} yr^{-1}$ . This is approximately 14 times less than the residual SFR still occurring in the red sequence disc galaxies. Within error, this is in agreement with the findings of Tojeiro et al. (2013) who, by using the VErsatile SPectral Analyses spectral fitting code (VESPA; Tojeiro et al. 2007), found that red late-type spirals show 17 times more recent star formation than red elliptical galaxies.

These results for red sequence galaxies have many implications for green valley galaxies, as all of these systems must have passed through the green valley on their way to the red sequence.

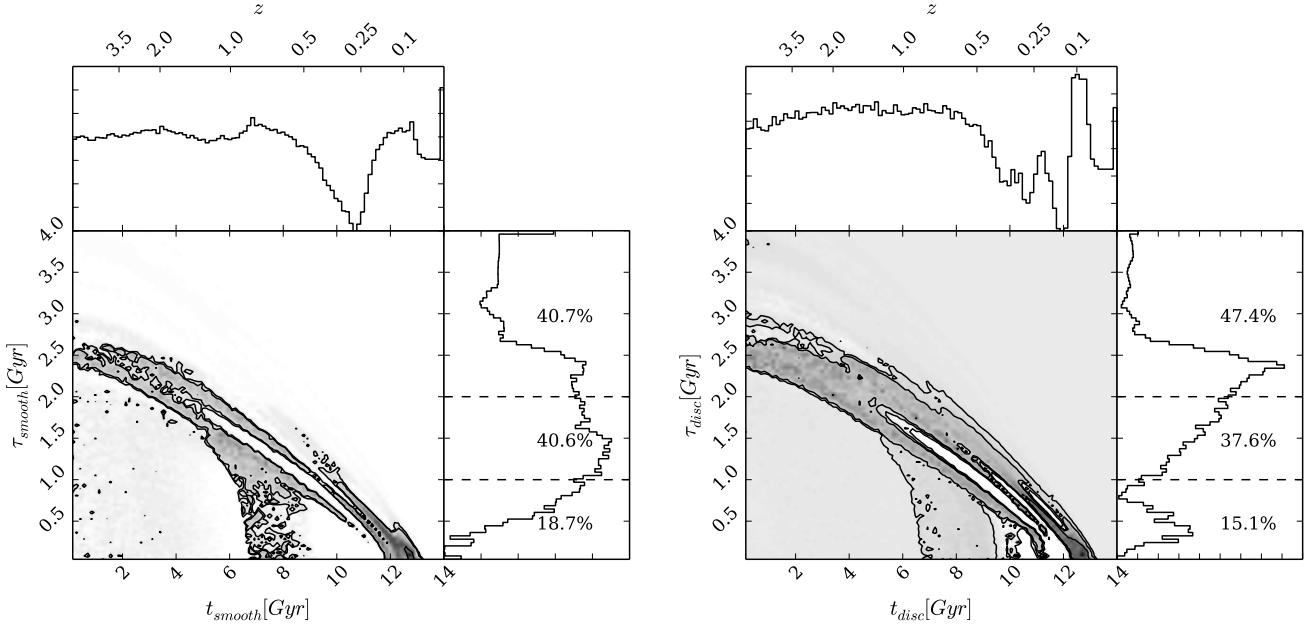
### 4.3 Green Valley Galaxies

In Figure 8 we can make similar comparisons for the green valley galaxies to those discussed previously for the red sequence. Among green valley galaxies the preference for rapid quenching timescales drops by over a factor of two for both morphologies. For the red sequence galaxies, an argument can be made for two possible tracks across the green valley, shown by the bimodal nature of both distributions in  $\tau$  with a common area in the intermediate timescales region where the rapid and slow timescales peaked distributions intersect. However in the green valley this intermediate quenching timescale region becomes more significant, particularly for the smooth-like galaxies (see the left panel of Figure 8).

The smooth galaxy parameters favour these intermediate quenching timescales (40.6%) with some preference for slow quenching at early times ( $z > 1$ ). This may be counter intuitive at first, as one of the main arguments for the lack of galaxies in the green valley is due to the hypothesised rapid movement across it; however the proportion of present day green valley galaxies with this history will therefore be lower. Those galaxies with such a rapid decline in star formation will pass so quickly through the green valley they will be detected at a lower number than those galaxies which have stalled in the green valley with intermediate quenching timescales; accounting for the observed number of intermediate galaxies which are present in the green valley and the dominance of rapid timescales detected in the red sequence for both morphologies.

The disc galaxy parameters for the green valley population now overwhelmingly prefer slow quenching timescales (47.4%) with a similar amount of intermediate quenching compared to the smooth galaxy parameters (37.6%; see Figure 8). Compared to red sequence disc galaxies, there is still some preference for galaxies with a high current SFR, suggesting there are also some late-type galaxies that have just progressed from the blue cloud into the green valley.

If we compare Figure 8 to Figure 7 we can see a larger amount of quenching is occurring at later (more recent) cosmic times in the green valley than in the red sequence for both galaxy types. Therefore both morphologies are tracing the evolution of the red sequence, confirming that the green valley is indeed a transitional population between blue cloud and red sequence regardless of morphology. Currently



**Figure 8.** Contour plots showing the combined positions in the Markov Chain for galaxies in the green valley, weighted by the logarithmic probability of each position (see Section 3.2) and also by the morphological vote fractions from GZ2 to give the areas of high probability in the model parameter space for both bulge (left) and disc (right) dominated systems. The histograms show the projection into one dimension for each parameter. The dashed lines show the separation between rapid ( $\tau [\text{Gyr}] < 1.0$ ), intermediate ( $1.0 < \tau [\text{Gyr}] < 2.0$ ) and slow ( $\tau [\text{Gyr}] > 2.0$ ) quenching timescales with the fraction of the combined posterior probability distribution in each region shown (see Section 3.2).

as we observe the green valley, its main constituents are very slowly evolving disc-like galaxies along with intermediate- and smooth-like galaxies which pass across it with intermediate timescales within  $\sim 1.0 - 1.5$  Gyr.

Given enough time ( $t \sim 4 - 5$  Gyr), the disc galaxies will eventually fully pass through the green valley and make it out to the red sequence (the right panel of Figure 6 shows galaxies with  $\tau > 1.0$  Gyr do not approach the red sequence within 3 Gyr post quench). This is most likely the origin of the ‘red spirals’.

If we consider the red sequence as the ‘end point’ of galactic evolution, then we can expect that the ratio of smooth:disc galaxies that is currently observed in the green valley will evolve into the ratio observed in the red sequence. Table 1 shows the ratio of smooth : disc galaxies in the observed red sequence of the GZ2 sample is 62 : 38 whereas in the green valley it is 45 : 55. In order to obtain the same ratio as seen in the red sequence, 31.2% of the disc-dominated galaxies currently residing in the green valley would have to undergo a morphological change to a bulge-dominated galaxy. We find that the fraction of the probability for green valley disc galaxies occupying the parameter space  $\tau < 1.5$  Gyr is 29.4%, and therefore suggest that quenching mechanisms with these timescales are capable of destroying the disc-dominated nature of galaxies.

All of this evidence suggests that there are not just two routes for galaxies through the green valley but a continuum of quenching time scales which we can divide into three regimes: with rapid ( $\tau < 1.0$  Gyr), intermediate ( $1.0 < \tau < 2.0$  Gyr) and slow ( $\tau > 2.0$  Gyr). The intermediate quenching time scale galaxies live in the space between

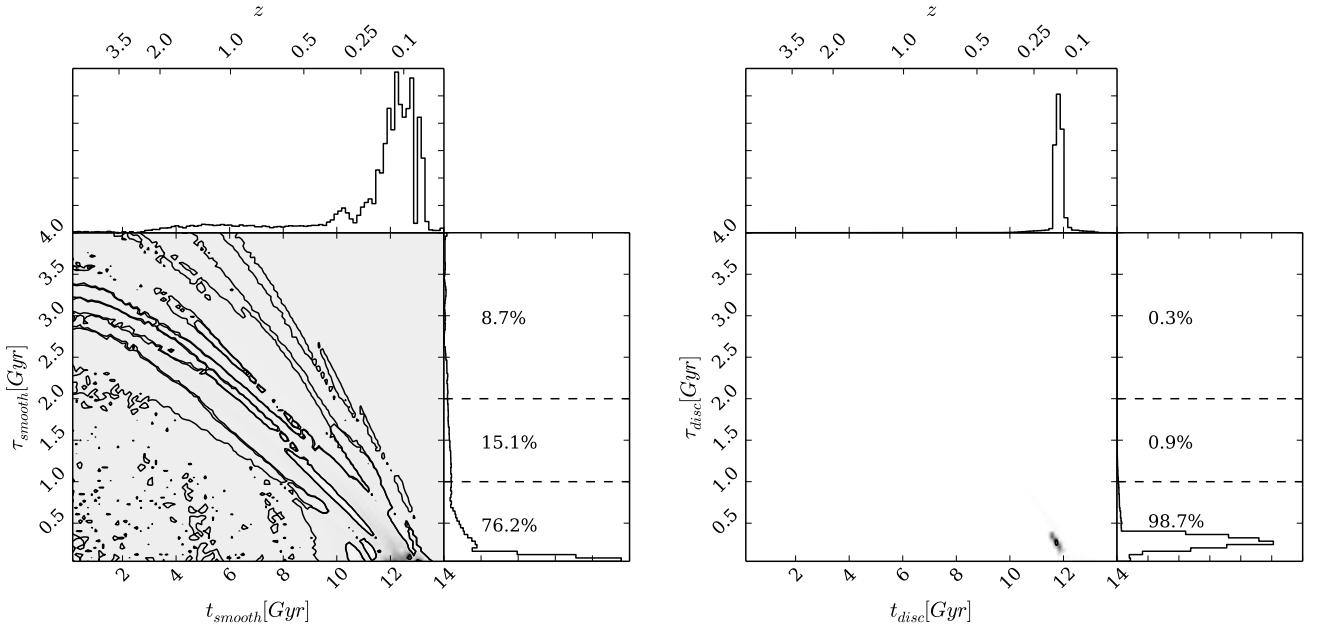
the extremes sampled by the UV/optical diagrams of S14; the inclusion of the intermediate galaxies in this investigation (unlike in S14) and the more precise Bayesian analysis, quantifies this range of  $\tau$  and specifically ties the intermediate timescales to all variations of galaxy morphology.

#### 4.4 Blue Cloud Galaxies

Since the blue cloud is considered to be primarily made of star forming galaxies we expect STARFPY to have some difficulty in determining the most likely quenching model to describe them, as confirmed by Figure 9. The attempt to characterise a star forming galaxy with a quenched SFH model leads STARFPY to attribute the extremely blue colours of the majority of these galaxies to fast quenching at recent times (i.e. very little change in the SFR; see the right hand panel of Figure 9 in comparison with the bottom panel of Figure 3).

Similarly the only quenching detected within the blue cloud disc galaxy population is for rapid quenching at recent times. Perhaps even galaxies which are currently quenching slowly across the blue cloud cannot be well fit by the quenching models implemented, as they still have high SFRs despite some quenching (although a galaxy has undergone quenching, star formation can still occur in a galaxy, just at a slower rate than at earlier times, described by  $\tau$ ).

There is a very small preference among blue bulge dominated galaxies for slow quenching which began prior to  $z \sim 0.5$ . These populations have been blue for a considerable period of time, slowly using up their gas for star formation by the Kennicutt–Schmidt law (Schmidt 1959; Kennicutt



**Figure 9.** Contour plots showing the combined positions in the Markov Chain for galaxies in the blue cloud, weighted by the logarithmic probability of each position (see Section 3.2) and also by the morphological vote fractions from GZ2 to give the areas of high probability in the model parameter space for both bulge (left) and disc (right) dominated systems. The histograms show the projection into one dimension for each parameter. The dashed lines show the separation between rapid ( $\tau$  [Gyr]  $<$  1.0), intermediate (1.0  $<$   $\tau$  [Gyr]  $<$  2.0) and slow ( $\tau$  [Gyr]  $>$  2.0) quenching timescales with the fraction of the combined posterior probability distribution in each region shown (see Section 3.2). Positions with probabilities less than 0.2 are discarded as poorly fit models, therefore we can conclude unsurprisingly that blue cloud galaxies are not well described by a quenching star formation model.

1997). However the major preference is for rapid quenching at recent times in the blue cloud; this therefore supports the theories for blue ellipticals as either merger-driven ( $\sim 76\%$ ) or gas inflow-driven reinvigorated star formation that is now slowly decreasing ( $\sim 24\%$ ).

The blue cloud is therefore primarily composed of both star forming disc or smooth galaxies and smooth galaxies which are undergoing a rapid quench, presumably after a previous event triggered star formation and turned them blue.

## 5 DISCUSSION

We have implemented a Bayesian statistical analysis of the star formation histories (SFHs) of a large sample of galaxies morphologically classified by Galaxy Zoo. We have found differences between the SFHs of smooth- and disc-like galaxies across the colour-magnitude diagram in the red sequence, green valley and blue cloud. In this section we will speculate on the question: what are the possible mechanisms driving these difference and the mechanisms responsible for the three different timescales observed?

### 5.1 Rapid Quenching Mechanisms

Rapid quenching is much more prevalent in smooth galaxies than disc galaxies, and red sequence galaxies are also much more likely to be characterised by a rapid quenching model than green valley galaxies (ignoring blue cloud galaxies due

to their apparent poor fit by the quenching models, see Figure 9). In the green valley there is also a distinct lack of preference for rapid quenching timescales with  $\tau < 0.5$  Gyr. This suggests that this rapid quenching mechanism causes a change in morphology from a disc- to a smooth-like galaxy as it quickly traverses the colour-magnitude diagram to the red sequence, supported by the number of disc galaxies that would need to undergo a morphological change in order for the disc:smooth ratio of the galaxies in the green valley to match that of the red sequence (see Section 4.3). From this indirect evidence we suggest that this rapid quenching mechanism is due to major mergers.

Inspection of the galaxies contributing to this area of likelihood reveals that this does not arise due to currently merging pairs identified by GZ users, but by typical smooth galaxies with red optical and NUV colours that the model attributes to rapid quenching at early times.

One simulation of interest by Springel, Di Matteo & Hernquist (2005) showed that feedback from black hole activity is a necessary component of destructive major mergers to produce such rapid quenching timescales. Powerful quasar outflows remove much of the gas from the inner regions of the galaxy, terminating star formation on extremely short timescales. Bell et al. (2006), using data from the COMBO-17 redshift survey ( $0.4 < z < 0.8$ ), estimate a merger timescale from being classified as a close galaxy pair and recognisably disturbed as  $\sim 0.4$  Gyr. Springel, Di Matteo & Hernquist (2005) consequently find using hydrodynamical simulations that after  $\sim 1$  Gyr the merger remnant has reddened to  $u - r \sim 2.0$ . This is in agreement with our

simple quenching models which show (Figure 6) that within  $\sim 1$  Gyr the models with a SFH with  $\tau < 0.4$  Gyr have reached the red sequence with  $u - r \gtrsim 2.2$ . This could explain the preference for red sequence disc galaxies with rapid quenching timescales (31.3%), as they may have undergone a major merger recently but are still undergoing a morphological change from disc, to disturbed, to an eventual smooth galaxy (see also van der Wel et al. 2009).

We reiterate that this rapid quenching mechanism occurs much more rarely in green valley galaxies of both morphologies than in the red sequence, however does not fully characterise all the galaxies in either the red sequence or green valley. Dry major mergers therefore do not fully account for the formation of any galaxy type at any redshift, supporting the observational conclusions made by Bell et al. (2007); Bundy et al. (2007); Kaviraj (2014) and simulations by Genel et al. (2008).

## 5.2 Intermediate Quenching Mechanisms

Intermediate quenching timescales are found to be equally prevalent across populations for both smooth and disc galaxies across cosmic time, [particularly in the green valley](#). [Unlike in the red sequence, intermediate timescales are the prevalent mechanism for quenching smooth green valley galaxies, unlike the rapid quenching prevalent in the red sequence.](#) We suggest that this intermediate quenching route must therefore be possible with routes that both preserve and transform morphology. It is this result of [another route through the green valley that is in contradiction](#) with the findings of S14.

If we once again consider the simulations of Springel, Di Matteo & Hernquist (2005), this time without any feedback from black holes, they suggest that if even a small fraction of gas is not consumed in the starburst following a merger (either because the mass ratio is not large enough or from the lack of strong black hole activity) the remnant can sustain star formation for periods of several Gyrs. The remnants from these simulations take  $\sim 5.5$  Gyr to reach red optical colours of  $u - r \sim 2.1$ . We can see from Figure 6 that the models with intermediate quenching timescales of  $1.0 \lesssim \tau [\text{Gyr}] \lesssim 2.0$  take approximately  $2.5 - 5.5$  Gyr to reach these red colours.

We speculate that the intermediate quenching timescales are caused by gas rich major mergers, major mergers without black hole feedback and from minor mergers, the latter of which is the dominant mechanism. This is supported by the findings of Lotz et al. (2008) who find that the timescales for equal mass gas rich mergers with large initial separations range from  $\sim 1.1 - 1.9$  Gyr, and of Lotz et al. (2011), who find in further simulations that as the baryonic gas fraction in a merger with mass ratios of 1:1:1:4 increases, so does the timescale of the merger from  $\sim 0.2$  Gyr (with little gas, as above for major mergers causing rapid quenching timescales) up to  $\sim 1.5$  Gyr (with large gas fractions).

The simulations in Lotz et al. (2008) also show that the remnants of these equal mass gas rich disc mergers (wet disc mergers) are observable for  $\gtrsim 1$  Gyr post merger and appear “disc-like and dusty”, which is consistent with an *early-type spiral morphology*. Such galaxies are often observed to have spiral features with a dominant bulge, suggesting that such

galaxies may divide the votes of the GZ2 users, producing vote fractions of  $p_s \sim p_d \sim 0.5$ . We believe this is why the intermediate quenching timescales are equally dominant for both smooth and disc galaxies across each population in Figures 7 and 8.

Other simulations (e.g. such as Robertson et al. (2006) and Barnes (2002)) support the conclusion that both gas rich major mergers and minor mergers can produce disc-like remnants. Observationally, Darg et al. (2010) showed an increase in the spiral to elliptical ratio for merging galaxies ( $0.005 < z < 0.1$ ) by a factor of two compared to the general population. They attribute this to the much longer timescales during which mergers of spirals are observable compared to mergers with elliptical galaxies, confirming our hypothesis that the quenching timescales  $\tau < 1.5$  Gyr preferred by disc galaxies may be undergoing mergers which will eventually lead to a morphological change. Similarly, Casseels et al. (2013) observe that galaxies ( $0.01 < z < 0.09$ ) which are interacting often retain their spiral structures and that a spiral galaxy which has been classified as having ‘loose winding arms’ by the GZ2 users are often entering the early stages of mergers and interactions.

40.6% of the likelihood for smooth galaxies in the green valley arises due to intermediate quenching timescales (see Figure 8); this is in agreement with work done by Kaviraj (2014) who by studying SDSS photometry ( $z < 0.07$ ) state that approximately half of the star formation in early-type galaxies is driven by minor mergers at  $0.5 < z < 0.7$  therefore exhausting available gas for star formation and consequently causing a gradual decline in the star formation rate. This supports earlier work by Kaviraj et al. (2011) who, using multi wavelength photometry of galaxies in COSMOS (Scoville et al. 2007), found that 70% of early-type galaxies appear morphologically disturbed, suggesting either a minor or major merger in their history. This is in agreement with the total percentage of probability with  $\tau < 2.0$  [Gyr]; 73.9% and 59.3%, for the smooth red sequence and green valley galaxies in Figures 7 and 8 respectively.

The resultant intermediate quenching timescales occur due to one interaction mechanism, unlike the rapid quenching, which occurs due to a major merger combined with AGN feedback, and decreases the SFR over a short period of time. Therefore any external event which can cause either a burst of star formation (depleting the gas available) or directly strip a galaxy of its gas (for example galaxy harassment, interactions, ram pressure stripping and interactions internal to clusters) would cause quenching on an intermediate timescale. Considering that the majority of galaxies reside in groups or clusters where such interactions are common, it is not surprising that the majority of our galaxies are considered intermediate in morphology (see Table 1) [and therefore are undergoing or have undergone such an interaction](#).

## 5.3 Slow Quenching Timescales

Although intermediate and rapid quenching timescales are the dominant mechanisms across the colour-magnitude diagram, together they cannot completely account for the quenching of disc galaxies. S14 concluded that slow quenching timescales were the most dominant mechanism for disc galaxies. However we show that: (i) intermediate quenching

timescales are equally important in the green valley and (ii) rapid quenching timescales are equally important in the red sequence. There is also a significantly lower preference for smooth galaxies to undergo such slow quenching timescales; suggesting that the evolution (or indeed creation) of typical smooth galaxies is dominated by processes external to the galaxy. This is excepting galaxies in the blue cloud where a small amount of slow evolution of blue ellipticals is occurring, presumably after a reinvigoration of star formation which is slowly depleting the gas available according to the Kennicutt–Schmidt law.

Bamford et al. (2009) using GZ1 vote fractions of galaxies in the SDSS, found a significant fraction of high stellar mass red spiral galaxies in the field. As these galaxies are isolated from the effects of interactions from other galaxies, the slow quenching mechanisms present in their preferred star formation histories are most likely due to secular processes (i.e. mechanisms internal to the galaxy, in the absence of sudden accretion or merger events; Kormendy & Kennicutt 2004; Sheth et al. 2012). Bar formation in a disc galaxy is such a mechanism, whereby gas is funnelled to the centre of the galaxy by the bar over long timescales where it is used for star formation (Masters et al. 2012; Saintonge et al. 2012; Cheung et al. 2013), consequently forming a ‘pseudo-bulge’ (Kormendy et al. 2010; Simmons et al. 2013).

If we believe that these slow quenching timescales are due to secular evolution processes, this is to be expected since these processes do not change the disc dominated nature of a galaxy.

#### 5.4 Future Work

Due to the flexibility of our model we believe that the STARFPY module will have a significant number of future applications, including the investigation of various different SFHs (e.g. constant SFR and starbursts). Considering the number of magnitude bands available across the SDSS, further analysis will also be possible with a larger set of optical and NUV colours, providing further constraints. It would also be of interest to consider galaxies at higher redshift (e.g. out to  $z \sim 1$  with Hubble Space Telescope photometry and the GZ:Hubble project, see Melvin et al. 2014 for first results) and consider different redshift bins in order to study the build up of the red sequence with cosmic time.

With further use of the robust, detailed GZ2 classifications, we believe that STARFPY will be able to distinguish any statistical difference in the star formation histories of barred vs. non-barred galaxies. This will require a simple swap of  $\{p_s, p_d\}$  with  $\{p_{bar}, p_{nobar}\}$  from the available GZ2 vote fractions. We believe that this will aid in the discussion of whether bars act to quench star formation (by funnelling gas into the galaxy centre) or promote star formation (by causing an increase in gas density as it travels through the disc) both sides of which have been fiercely argued (Masters et al. 2011, 2012; Sheth et al. 2005; Ellison et al. 2011).

Further application of the STARFPY code could be to investigate the SFH parameters of:

- (i) Currently merging/interacting pairs in comparison to those galaxies classified as merger remnants, from their degree of morphological disturbance,

- (ii) Slow rotators and fast rotators which are thought to

result from dry major mergers on the red sequence (Emsellem et al. 2011) and gas rich, wet major mergers (Emsellem et al. 2007) respectively,

- (iii) Field and cluster galaxies using the projected neighbour density,  $\Sigma$ , from Baldry et al. (2006).

The SAMI (Croom et al. 2012) and MANGA (Bundy et al. in prep.) surveys will provide large samples of galaxies in order to test these ideas in future work.

## 6 CONCLUSION

We have used morphological classifications from the Galaxy Zoo 2 project to determine the morphology-dependent star formation histories of galaxies via a Bayesian analysis of an exponentially declining star formation quenching model. We determined the most likely parameters for the quenching onset time,  $t_q$  and quenching timescale  $\tau$  in this model for galaxies across the blue cloud, green valley and red sequence to trace galactic evolution across the colour-magnitude diagram. We find that the green valley is indeed a transitional population for all morphological types (in agreement with Schawinski et al. (2014)), however this transition proceeds slowly for the majority of disc-like galaxies and occurs rapidly for the majority of smooth-like galaxies in the red sequence. However, in addition to Schawinski et al. (2014), our Bayesian approach has revealed a more nuanced result, specifically that the prevailing mechanism across all morphologies and populations is quenching with intermediate timescales. Our main findings are as follows:

- (i) Red sequence galaxies, regardless of morphology, are found to have similar preferences for quenching timescales compared to the green valley galaxies, but occurring at earlier quenching times (see Figures 7 and 8). Therefore the quenching mechanisms currently occurring in the green valley were active in creating the red sequence at earlier times; confirming that the green valley is indeed a transitional population, regardless of morphology.

- (ii) The typical red sequence galaxy is elliptical in morphology and has undergone a rapid to intermediate quench at any point in cosmic time, resulting in a very low current SFR (see Section 4.2).

- (iii) The green valley as it is currently observed is dominated by very slowly evolving disc-like galaxies along with intermediate- and smooth-like galaxies which pass across it with intermediate timescales within  $\sim 1.0 - 1.5$  Gyr (see Section 4.3).

- (iv) There are three routes through the green valley dependant on galaxy type, with the smooth- and disc-like galaxies each having different dominant star formation histories across the colour-magnitude diagram.

- (v) Blue cloud galaxies are not well fit by a quenching model of star formation due to the continuous high star formation rates occurring (see Figure 9).

- (vi) The distribution for the quenching time for disc galaxies is found to be constant over all redshifts, confirming the assumption that regardless of the mechanism, the evolution of disc galaxies is constant over time.

- (vii) Rapid quenching timescales are detected with a lower probability for green valley galaxies than red sequence galaxies. We speculate that this quenching mechanism is

caused by major mergers with black hole feedback, which are able to expel the remaining gas not initially exhausted in the merger-induced starburst and which can cause a change in morphology from disc- to bulge-dominated. The colour-change timescales from previous simulations of such events agree with our derived timescales (see Section 5.1). These rapid timescales are instrumental in forming the red sequence, however galaxies at the current epoch passing through the green valley do so at more intermediate timescales (see Figure 8).

(viii) Intermediate quenching timescales ( $1.0 < \tau [\text{Gyr}] < 2.0$ ) are found with constant probability across the red sequence and green valley for both smooth- and disc-like morphologies, the timescales for which agree with observed and simulated minor merger timescales (see Section 5.2). We hypothesise such timescales can be caused by a number of external processes, including gas rich major mergers, mergers without black hole feedback, galaxy harassment, interactions and ram pressure stripping. The timescales and observed morphologies from previous studies agree with our findings, including that this is the dominant mechanisms for intermediate galaxies such as early-type spiral galaxies with spiral features but a dominant bulge, which split the GZ2 vote fractions (see Section 5.2).

(ix) Slow quenching timescales are the most dominant mechanism in the disc galaxy populations across the colour-magnitude diagram. Disc galaxies are often found in the field, therefore we hypothesise that such slow quenching timescales are caused by secular evolution and processes internal to the galaxy. We also detect a small amount of slow quenching timescales for blue elliptical galaxies which we attribute to a reinvigoration of star formation which is slowly depleting the gas available (see Section 4.4).

(x) Due to the flexibility of this model we believe that the STARFPY module compiled for this investigation will have a significant number of future applications, including the different star formation histories of barred vs non-barred galaxies, merging vs merger remnants, fast vs slow rotating elliptical galaxies and cluster vs field galaxies (see Section 5.4).

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This publication made extensive use of the Tool for Operations on Catalogues And Tables (TOPCAT; Taylor 2005) which can be found at <http://starlink.ac.uk/topcat/>. Ages were calculated from the observed redshifts using the *cosmology* package provided in the Python module *astroPy*<sup>3</sup>; Robitaille et al. 2013). This research has also made use of NASA's ADS service and Cornell's ArXiv.

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<sup>3</sup> <http://www.astropy.org/>

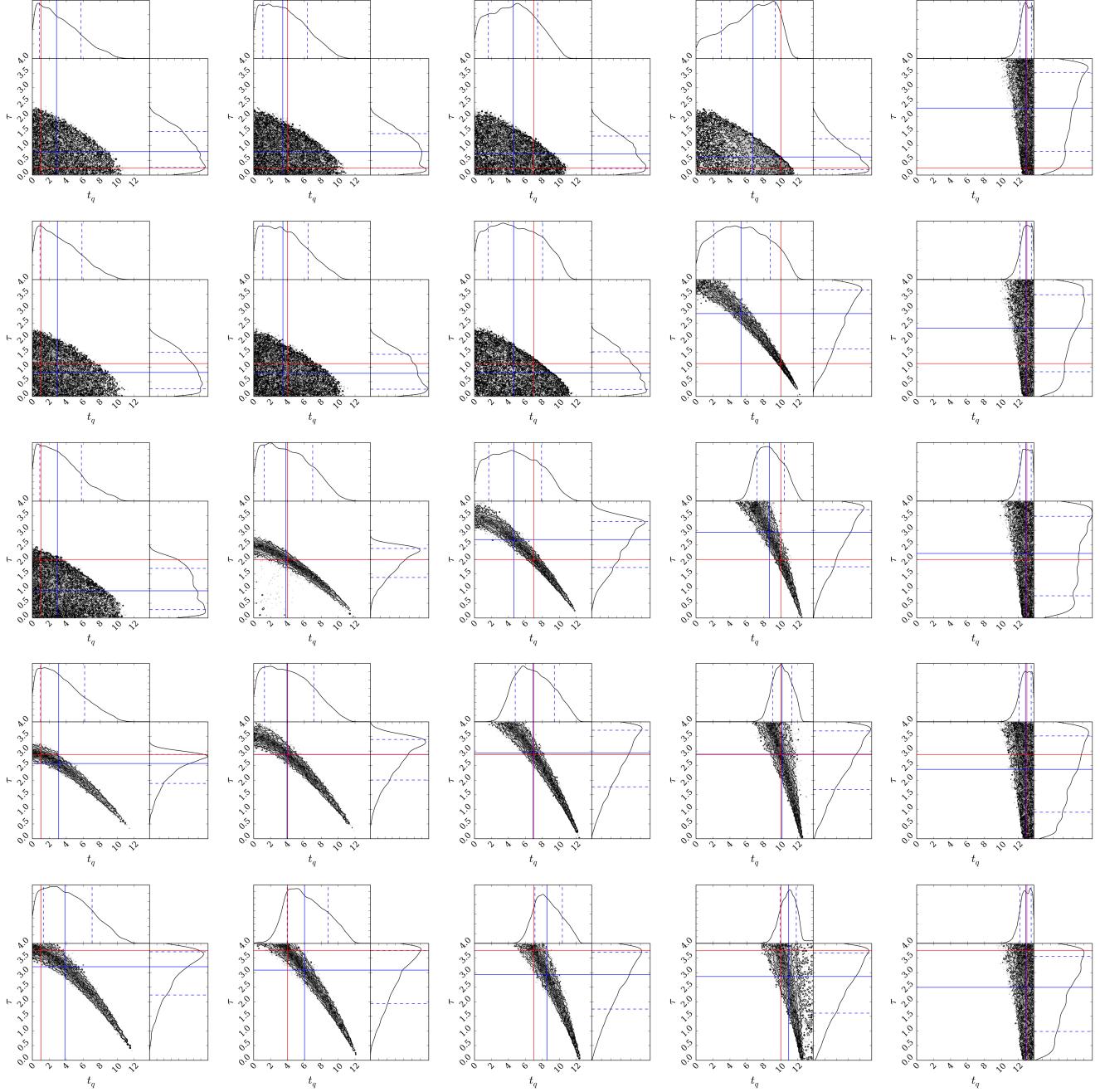
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## APPENDIX A: TESTING StarfPy

In order to test that STARFPy can find the correct quenching model for a given observed colour, 25 true (i.e. known) values of  $\theta$  were input into STARFPy to ensure that these values were reproduced within error. Figure A1 shows the results of each of these tests, with the known values of  $\theta$  shown by the red lines. In some cases this red line does not coincide with the peak of the distribution shown in the histograms for one parameter, however in all cases the intersection of the red lines is within the sample contours.

## APPENDIX B: USING LOOK UP TABLES

Considering the size of the sample in this investigation of 126,316 galaxies total, a three dimensional look up table (in observed time, quenching time and quenching rate) was generated using the star formation history function in STARFPy to speed up the run time. Figure ?? shows an example of how using the look up table in place of the full



**Figure A1.** Results from STARFPY for an array of *true*  $t_q$  and  $\tau$  values (marked by the red lines) using the complete function to calculate the predicted colour of a proposed set of  $\theta$  values in each MCMC iteration, assuming an error on the calculated known colours of  $\sigma_{u-r} = 0.124$  and  $\sigma_{NUV-u} = 0.215$ , the average errors on the GZ sample colours. In each case STARFPY succeeds in locating the true parameter values within the degeneracies of the star formation history model. These degeneracies can clearly be seen in Figure 3.

function does not affect the results to a significant level. Table B quotes the median values along with their  $\pm 1\sigma$  ranges for both methods in comparison to the true values specified to test STARFPY. The uncertainties incorporated into the quoted values by using the look up table are therefore minimal with a maximum  $\Delta = 0.043$ .

**Table B1.** Median values found by STARFPY using the complete star formation history function and a look up table to speed up the run time, shown by the blue solid lines in Figure ???. The errors quoted define the region in which 68% of the samples are located, shown by the dashed blue lines in Figure ???. The known true values are also quoted, as shown by the red lines in Figure ???. All values are quoted to three significant figures.

	$t_q$	$\tau$
True	4.37	2.12
Complete	$3.893 \pm^{3.014}_{2.622}$	$2.215 \pm^{0.395}_{0.352}$
Look up table	$3.850 \pm^{2.988}_{2.619}$	$2.218 \pm^{0.399}_{0.649}$