PyMorph

Software for Automated Galaxy Morphological Parameter Estimation

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1 PyMorph

PyMorph is a software pipeline which computes non-parametric and parametric morphological parameters of galaxies. PyMorph uses GALFIT (Peng et. al. 2002) for bulge disk decomposition of galaxy and SExtractor (Bertin et. al. 1996) for determining the initial values. PyMorph uses its own module to calculate Concentration index, Asymmetry, Clumpness, Gini Coefficient, second order moment of the brightest 20% pixels of galaxies(CASGM). In this section we will explain PyMorph in detail.

1.1 Dependencies

- 1. Python 2.4 or greater
- 2. Stsci_python (This package includes numpy, pyfits, pyraf)
- 3. GALFIT
- 4. SExtractor
- 5. matplotlib
- 6. xpa (optional, if you want to select PSF)

1.2 Working modes

The pipeline works in different modes. A short description of the available modes are the following

- 1. Normal Mode: In normal mode, user will be able give two kind of inputs
 - a. A large field(s) of galaxies. eg. HST-ACS/WFPC2, SDSS, 2MASS fields
 - \bullet b. Galaxy(ies) in cutout image(s)
- 2. Repeat Mode: The parameter estimation process can be failed due to several reasons. If the user feels that the fitting can be improved by adjusting the initial values or using an efficient mask, this mode can be used. Here the pipeline will run again on the failed galaxies using the user specified parameters and images.
- 3. Find and Fit: Generate parameters of objects which satisfy the magnitude range specified by the user.
- 4. PSF Selection: To select the PSFs from image

1.3 Pre-Pipeline Procedure

- 1. Run SExtractor on the frame and the resulting file contains the information of all the object in the frame. The output parameters of this catalogue MUST follow a particular order and that can be found in the Appendix. This is recommended, as the PyMorph may keep the sky value at the SExtractor value during the 2D decomposition. So running SExtractor needs care. If PyMorph does not find any SExtractor catalogue it will create one using the default parameters.
- 2. Create a catalogue of galaxies for which the user wants to generate the morphological parameters. The possible columns in the catalogue can be seen the Section 1.6. If the FindAndFit mode is enabled, then the program will not search for this catalogue.
- 3. Create PSF files
- 4. Edit the config.py which is the configuration file for the pipeline. The parameters in the configuration file are described in the Section 1.4.

1.4 Input parameters

- imagefile: The large image frame.
- whtfile: The corresponding rms/weight map of the large frame. If the name contains the string wht/rms then the program treats it as weight/rms image. If this file is not found the program will skip this step.
- sex_cata: The SExtractor catalogue of all the objects in the frame. If the user provide one SExtractor catalogue, PyMorph uses it. Otherwise it generate using the default SExtractor parameters in the pipeline. One can use the command line option -edit-conf to change these parameters according to their images.
- clus_cata: The list of all the objects of interest. The possible columns in this file are given in the Section: 1.6 and each column must have the title. The program needs at least gal_id or gimg to run.
- out_cata: The name of the output catalogue. Program will make a catalogue of all the galaxies for which the morphological parameters are generated.
- **rootname**: Root name. You can give just a blank " to avoid this. If the program finds *rootname*, it will be appended to all the intermediate files and the name of the galaxy in the result file.
- psfselect: Since selecting GOOD PSFs from large frames and make a list of them is time consuming, we have added a small utility which will help the user to find the PSF with out spending much time. This can be achieved by using the psfselect parameter. This parameter can take either 0, 1 or 2. The meaning of these are following
 - -0 = The pipeline will continue with the user given PSFs.
 - -1 = The pipeline will run only for finding PSFs.
 - -2 => Find PSFs and run pipeline.

It is recommended to use psfselect = 1 and select PSFs first. After having good PSFs, run pipeline with psfselect = 0.

• psflist: List of PSFs. You can give it either as a list like ['psfl.fits, 'psf2.fits', etc] or point to a file which contains the names of PSFs as '@psflist.txt'. The pipeline will select the nearest PSF to the object of interest either using the header information or using the information from its name. In the latter case, the PSF's name should have the form psf_radec.fits.

Eg. If the PSF's position is (12:16:43.5, -12:03:12.0) then the name should be psf_1216435-1203120.fits.

This convention is used to find the nearest PSF. The pipline will first check whether the mode is *repeat*. If *repeat* is false and if the program fails to find the configuration file, then it will try to find the coordinate information of the galaxy. If the program doesn't find the RA and DEC information of the galaxy, then it chooses the PSF one by one from the list.

- mag_zero: Magnitude zero point.
- mask_reg, thresh_area, threshold: Parameters for masking condition. It is explained in the Section 1.8.1.
- **size:** This parameter is a list of five quantities which controls the size and shape of the stamp image of the galaxy. The size parameters are in the order

size = [resize, varsize, fracrad, square, fixsize]

- resize This will be used when the user supply a cutout of galaxy and wants to resize the image. This particular parameter is useful when we have a large number of frames from surveys like SDSS.
- varsize This parameter will be used to find the image cutout size. When it is true the size of the image will be decided from the half light radius of the galaxy.
- fracrad Size of the cutout image will be fracrad times half light radius of the galaxy.
- square This will decide the shape of the cutout. If it is true, then the cutout will be square otherwise a rectangle.
- fixsize If the user wants to make an image of fixed size, this keyword will provide the size information.
- pixelscale:
- H0, WM, WV: Hubble parameter, Ω_M , Ω_{Λ}
- back_extraction_radius: The radius of the background region which will be used to calculate the background asymmetry and background clumpness.
- The following parameters decide the working mode of PyMorph

repeat: If it is True, repeat the pipeline manually.

galcut: True, if the input is cutout of galaxies.

decompose: True, if the user wants to extract the structural parameters.

cas: True, if user wants to find the CASGM parameters.

findandfit: True, to run PyMorph for galaxies within some magnitude range.

crashhandler: If it is True, then the PyMorph will handle the possible crashes during the pipeline process and try to fix those errors in the next run.

- components: The user can decide the components for fitting. By default PyMorph assumes a disk and a bulge to model the light distribution of the galaxy. The available components are bulge, disk and point.
- fitting This is also a list of three parameters which can be used to fix/fit center and sky.

```
fitting = [bulge_center, disk_center, sky]
```

• **center_deviation:** Using this parameter, the user can specify the amount of deviation allowed for the center. If the fitted center deviates from the initial center more than this amount, that will be considered as a crash and refit the galaxy, provided the *crashhandler* is True.

1.5 config.py

Here is the configuration file for PyMorph.

```
rootname = 'j8f643'
###----Psf list----###
                                     #0 => No psfselection
psfselect = 0
                                     #1 => Only Select psf
                                     #2 => Select psf and run pipeline
                                     #Recommended: Run with '1' and then run
                                     #pipeline
                                     #psf image size will be startsize times
starsize = 20
                                     #the SMA given by SExtractor
#psflist = ['psf_1216382-1200443.fits', 'psf_1216408-1200251.fits']
psflist = '@psflist.list'
                                     #List of psf contains their
                                     #position information in the
                                     #header (RA_TARG, DEC_TARG).
                                     #Make psf with the names as here
                                     #and use psf_header_update.py.
                                     #It will update the header information.
mag_zero = 25.256
                                     #magnitude zero point
###----Conditions for Masking----###
manual mask = 0
mask\_reg = 2.0
thresh_area = 0.2
threshold = 3.0
                                     #Masking will be done for neighbours
                                     #whose semimajor*threshold overlaps with
                                     #threshold * semi-major axis of
                                     #the object and area of the neighbour
                                     #less than thresh_area * object area in
                                     #sq.pixel.
                                     #The masking will be for a circular
                                     #region of radius mask_reg*semi-major
                                     #axis of the nighbour with respect to
                                     #the center of the neightbour.
###---Size of the cut out and search conditions---###
###---size = [resize?, varsize?, fracrad, square?, fixsize]---###
size = [0, 1, 6, 1, 120]
                                     #size of the stamp image
searchrad = '0.3arc'
                                     #The search radius
###----Parameters for calculating the physical parameters of galaxy----###
pixelscale = 0.045
                                     #Pixel scale (arcsec/pixel)
HO = 71
                                     #Hubble parameter
WM = 0.27
                                     #Omega matter
WV = 0.73
                                     #Omega Lambda
###----Parameters to be set for calculating the CASGM----###
back_extraction_radius = 15.0
#back_ini_xcntr = 32.0
#back_ini_ycntr = 22.0
angle = 180.0
###----Fitting modes----###
repeat = False
                                     #Repeat the pipeline manually
galcut = False
                                     #True if we provide cutouts
decompose = True
galfit = True #Always keep this True as it is not functional yet!
cas = True
findandfit = 0
crashhandler = 1
###---Galfit Controls---###
components = ['bulge', 'disk']
                                     #The components to be fitted to the objec
###---fixing = [bulge_center, disk_center, sky]
fitting = [1, 1, 0]
                                     # = 0, Fix params at SExtractor value
###----Set the SExtractor and GALFIT path here----###
GALFIT_PATH = '/home/vinu/software/galfit/modified/galfit'
SEX_PATH = '/home/vinu/software/sextractor-2.5.0/sex/bin/sex'
```

```
PYMORPH_PATH = '/home/vinu/serial_pipeline/trunk/pymorph'
```

1.6 Possible columns in clus_cata

- gal_id: The identifier of the galaxy.
- ra1, ra2, ra3: The RA of the galaxy. ra1 is the degree part, ra2 is minute and ra3 is the second part.
- dec1, dec2, dec3: The DEC of the galaxy and have same syntax as RA
- **z:** The redshift of the galaxy
- **gimg:** The galaxy image if PyMorph runs in GALCUT mode (ie. input will be cutouts of galaxies).
- wimg: The corresponding weight image
- cfile: Configuration file for GALFIT (if user wants to run PyMorph manually)
- **ximg:** The x center of the galaxy
- yimg: The y center of the galaxy
- bxcntr: The x center of the background to find the CASGM parameters
- bycntr: The y center of the background to find the CASGM parameters
- psf: The PSF corresponding to the galaxy
- flag: This will be used when the *crashhandler* is on. See the Flags section to know more.

Example clus_cata

The clus_cata looks something like the following

```
gal_id ra1 ra2 ra3 dec1 dec2 dec3 mag z bxcntr bycntr ximg yimg cfile psf flag EDCSNJ1216453-1201176 12 16 45.26 -12 01 17.6 20.663 0.7955 20.0 20.0 60.0 Gj8f647_EDCSNJ1216453-1201176.in psf_1216435-1203120.fits 128
```

Another look

```
gimg wimg ximg yimg bxcntr bycntr
Ij8f647_EDCSNJ1216453-1201176.fits Wj8f647_EDCSNJ1216453-1201176.fits 60.0 60.0 20.0 20.0
```

The minimal clus_cata

```
gimg
Ij8f647_EDCSNJ1216453-1201176.fits
```

Here we assumed that the image $Ij8f647_EDCSNJ1216453-1201176.fits$ contains a galaxy within 10 pixels radius from the center. In the case of cutouts, the minimal configuration which uses all the PyMorph functionalities is the following

```
gimg z
Ij8f647_EDCSNJ1216453-1201176.fits 0.79
```

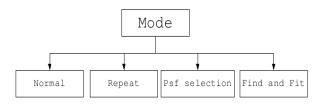


Figure 1: The PyMorph Modes

1.7 Command line Options

Some command line options are also available and are explained as follows

- -edit-conf (-e): PyMorph uses default set of parameters to generate SExtractor catalogue. These parameters can affect the photometric output from SExtractor. This option allows the user to edit the SExtractor configuration file interactively.
- -force (-f): Normally PyMorph will not generate SExtractor catalogue if it find one. Using this option user can force the pipeline to generate SExtractor catalogue.
- **—with-psf:** By default, PyMorph will use the nearest PSF from the psflist during decomposition. User can alter this behavior by this parameter. So *—with-psf=0* takes the nearest PSF, *—with-psf=1* uses second nearest PSF and so on. By using *—with-psf=-1* one can select the farthest available PSF. This option becomes important when the user wants to test the results with different PSFs in the frame.
- -help (-h):
- -lmag, -umag: Magnitude constraints for GALFIT.
- -ln, -un: The minimum and maximum allowed values of Sersic index. Defaults are 0.1 and 20.0.
- -lre, -ure: Minimum and maximum allowed values of bulge scale length, re. Default 0 and 500 pixels.
- -lrd, -urd: Minimum and maximum allowed values of disk scale length, rd. Default 0 and 500 pixels.
- -with-in: Fitting will be done for objects which are NXPTS / 2 + with-in or NYPTS / 2 + with-in from the main object. By default it takes a value of 150. Usage: -with-in=150.
 -with-filter: Manually give the filter. This will go to the database. -with-db: The MySQL database name. -with-area: The area of PSFs.

1.8 Working

The architecture of the PyMorph is shown in the Figures 1, 2 and explained as follows

1.8.1 Normal Mode with large field

PyMorph compares the user given galaxy catalogue (clus_cata) and SExtractor catalogue (sex_cata). If the pipeline finds an object in the SExtractor catalogue, it will create a stamp image and the corresponding weight map of the galaxy. Initially the pipeline try to match the RA and DEC information from the clus_cata with SExtractor catalogue using serachrad. If the clus_cata doesn't have RA, DEC information the pipeline will try to compare it with the pixel coordinate of the

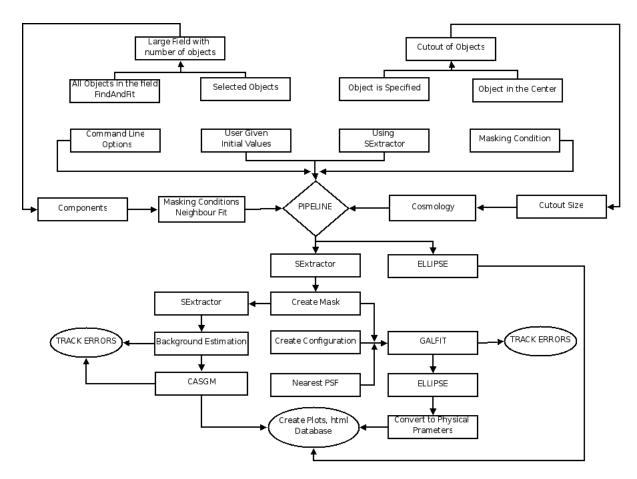


Figure 2: The PyMorph Architecture

object in the frame. For that it will search for columns with headers *ximg* and *yimg*. The pipeline stops if it does not find these columns. To find the structural parameters the pipeline works as follows.

The first step in 2D bulge-disk decomposition is the creation of stamp size image of the object. The size of the image should be in such a way that the image must include enough sky and should not loose light from the outer part of the objects. An image with very large size will leads to the unnecessary usage of CPU. We use the FLUX_RADIUS (R_{50}) , THETA_IMAGE (θ) , ELONGATION $(\frac{a}{b})$ values from SExtractor to find the required size of the cutout. Here the FLUX_RADIUS corresponds to the half light radius (R_{50}) of the galaxy. The size of the stamp image will be found by the following formula

$$X = F_{\rm rad} R_{50} \left(|\cos \theta| + \frac{b}{a} |\sin \theta| \right) \tag{1}$$

$$Y = F_{\rm rad} R_{50} \left(|\sin \theta| + \frac{b}{a} |\cos \theta| \right) \tag{2}$$

where X and Y are the x and y dimension of the stamp image. F_{rad} is the user specified controlling parameters. In our case we found $F_{rad} = 6$ is a good compromising value for the determination of the postage stamp. We cut same portion of the noise map and use it as the weight image to GALFIT.

GALFIT allows us to fit more than one objects simultaneously. We fit a single Sersic function to the neighbour objects to reduce the contamination from these objects to the main galaxy. So the next step is to find the neighbour objects and determine whether it should be fitted simultaneously with the main object. To do that, we use SExtractor A_IMAGE (R) and ISO0 (A) parameters of both objects and neighbour. The criterion for simultaneous fit is the following

$$|x_o - x_n| < T_R(R_o + R_n)$$
 or
 $|y_o - y_n| < T_R(R_o + R_n)$ or
 $A_n > T_A A_o$ (3)

where x_o, x_n, y_o, x_n are the x and y centers of object and neighbour and R_o, R_n, A_o and A_n are the A.IMAGE and ISO0 of object and neighbour. We found the controlling parameters $T_R = 3.0$ and $T_A = 0.3$ are promising. We mask all the neighbour objects which does not satisfy the above criterion (Eqn 3). We mask all the pixels of the neighbour objects which satisfy $r < T_M R_n$, where r is the radius in an elliptical aperture. We have used $T_M = 2.0$ so that all the pixels of the neighbour object will be masked. This masking technique will work only if SExtractor detect the neighbour object. Since the detection depends on the DETECT_THRESH and DETECT_MINAREA parameters, it is possible that some furious pixels can left undetected by SExtractor. So we use the following simple technique to mask those furious pixels. From the center of the main object we make elliptical annuli with increasing radii. In the inner aperture we find the maximum value of the galaxy. We assume a smooth distribution for the galaxy's light profile which decreases from the center. This implies the largest value in the central elliptical aperture is the maximum value the object can have. So we mask all the other pixels outside the inner aperture with value greater than this maximum value. Now we go to next annulus and find the maximum and mask other pixels outside this aperture which has value larger than the maximum of this aperture. This procedure continue till the aperture radius hit the image limit. Then we use a set of binary morphology operations to clean the mask. Now almost all the furious pixels and undetected objects will be masked properly and we combine this with the neighbour mask.

Next step is to find initial values for the fitting parameters. To each galaxy in the catalogue we fit a Sersic and exponential functions. The Sersic function which is used to model the luminosity profile of the bulge part is given by

$$I(r) = I_e e^{-b_n (\frac{r}{r_e}^{1/n} - 1)}$$
(4)

and the exponential function which model the disk part of the galaxy is given by

$$I(r) = I_d e^{-\frac{r}{r_d}} \tag{5}$$

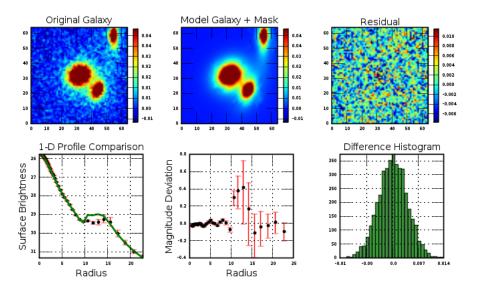


Figure 3: Output image from PyMorph

where r_e is the bulge scale length, n is the Sersic index and r_d is the disk scale length. b_n is a parameter which depends on the Sersic index.

GALFIT accepts the initial values of the total magnitude, scale radii, axis ratios and position angles of bulge and disk and Sersic index of the bulge. We set MAG_AUTO value from SExtractor as the input value to the total magnitudes of both bulge and disk. For the scale radii we give the half light radius of the galaxy. By default PyMorph set the initial value for Sersic index (n) to 4, which corresponds to de Vaucouleurs' law. After setting the initial value we create a contrain file, which restrict the free parameters from going to unphysical values during the fit. The position angle and axis ratio are set from the values of the THETA_IMAGE and ELONGATION parameters.

The estimation of CASGM parameters are explained in the Section 2. Finally the pipeline creates diagnostic plots (Figures 3, 4) and results in different formats which includes html, csv, mysql database and fits cutouts.

1.8.2 Normal Mode with cutouts

In this mode the pipeline follows the same route as explained in the previous section. In this case if the program doesn't find the RA, DEC information or the centroid of the object, it extract the morphological parameters of the object in the center of the image.

1.8.3 Repeat Mode

During this mode of run the pipeline will not create or modify the mask image or GALFIT configuration file, if they exist. So one can adjust his GALFIT configuration file / mask image before running the pipeline in the REPEAT mode.

1.8.4 Find and Fit

In this mode user can fit objects without creating *clus_cata*. The user has to give the magnitude range of the object to be fitted. This is useful when one wants to find the quantitative morphology of all the objects in the frame.

1.9 Filenames

The PyMorph makes a number of files and those filenames follow unique format. The filename convention is illustrated below. Suppose in the config.py the parameter *rootname* = j8f645 and

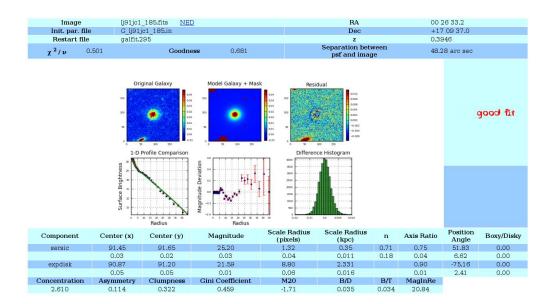


Figure 4: HTML output from PyMorph

gal_id, which is the name of the galaxy in the clus_cata is 9999, then

- Ij8f645_9999.fits: The cut out of the galaxy.
- Wj8f645_9999.fits: Corresponding weight image.
- Mj8f645_9999.fits: Mask image for GALFIT.
- EMj8f645_9999.fits: Mask image for ellipse fitting.
- EMj8f645_9999.fits.p:l EMj8f645_9999.fits will be converted to EMj8f645_9999.fits.pl for ellipse task.
- **Gj8f645_9999.in:** Configuration file for GALFIT.
- Oj8f645_9999.fits: The output image from GALFIT.
- fit2.log: The output parameters will be append to this file
- error.log: The status of the process. From this file the user gets the information about crashes.
- E_j8f645_9999.txt: 1D surface brightness profile of the input image.
- OE_j8f645_9999.txt: 1D surface brightness profile of the model.
- P_j8f645_9999.png: The plot of input, output, residue images and the 1-D profile comparison.
- $R_{j}8f645_{999}.html$: The html output.
- index.html: The index file of all the objects.
- result.csv: The csv file contains all the parameters
- agm_result_with_radius.csv: The file contains the radial variation of Asymmetry , Gini coefficients and M20. Also r_{20} , r_{50} , r_{80} , r_{90} , Petrosian radius etc. are included.
- restart.cat: The catalogue contains all the failed objects with the corresponding lines in the clus_cata. This catalogue can be used to restart the PyMorph in the case of failed galaxies.

• CRASH.CAT: Probably the user may not want to use this. This will be used by the pipeline if the *crashhandler* is True.

2 CASGM Module

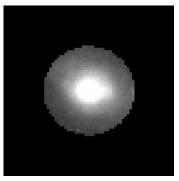
Concentration, Asymmetry, Clumpness, Gini coefficient and Moment of the galaxy (CASGM) are widely used to generate quantitative galaxy morphology, for the last few years. In this section we describe the implementation of these parameters in **PyMorph**.

2.1 Concentration (C)

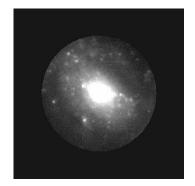
1. Find the Petrosian radius r_{η} at which parameter (η) becomes 0.2. The Petrosian parameter, η , is defined as

$$\eta = \frac{L(R)}{L(\langle R)} \tag{6}$$

L(R) is the average surface brightness at the radius R and L(< R) is the average brightness inside the radius R.



20% light contained portion



80% light contained portion

Figure 5: Portion of galaxy within r_{20} and r_{80}

- 2. Find the total light of the galaxy as the light inside $1.5 \times r_n$.
- 3. Find the 80% and 20% light contained radii. ie. r_{80} and r_{20} .
- 4. The concentration index will be found using the equation

$$C = 5\log(\frac{r_{80}}{r_{20}})\tag{7}$$

2.2 Asymmetry (A)

- 1. Define an extraction region of radius $1.5 \times r_n$.
 - 2. Rotate the image 1 by 180^{0}
 - 3. Find the asymmetry parameter using the equation

$$A = \frac{\sum |I_0 - I_{\phi}|}{2\sum |I_{\phi}|} \tag{8}$$

where I_{ϕ} is the rotated image and I_0 is the original image.

- 4. Centering correction will be applied by minimizing the A value w.r.t. center.
- 5. Noise correction will also be done by subtracting the asymmetry of the background from the image asymmetry.

¹The image used here is of NGC 5585 in R band.

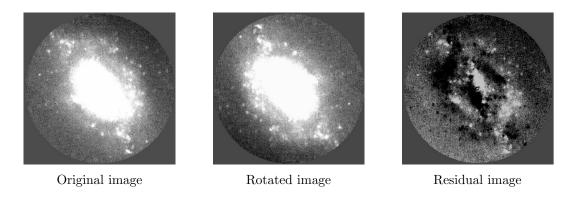


Figure 6: Images within the extraction radius

2.3 Clumpness (S)

- 1. Smooth the image with a boxcar of size $r_{\eta}/4$
- 2. Remove the center region of the galaxy within a radius $r_{\eta}/4$ as the center is not always resolved.
 - 3. Clumpness parameter can be computed using the equation

$$S = 10 \times \frac{I - I^{\sigma}}{I} \tag{9}$$

where I is the original image and I^{σ} is the smoothed image.

4. Subtract the background clumpness to get the final clumpness.

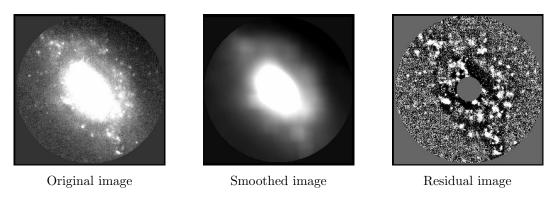


Figure 7: Images within the extraction radius

2.4 Gini coefficient (G)

Gini coefficient quantifies galaxy's light distribution among the pixels. Its value lie in between 0 and 1. If all the light is concentrated in one pixel, then G will be 1 and if the light distributed uniformly among the pixels, then G will be zero. To find Gini coefficient we use the following technique

1. Create a segmentation map, ie, find the pixels belong to the galaxy. To do this we smooth the image by a boxcar of size $r_{\eta}/5$. This will increase the signal-to-noise ratio at the outer regions of the galaxy. The surface brightness μ_{η} at r_{η} is measured and pixels in the smoothed image with flux values greater than μ_{η} and less than 10σ is assigned to the galaxy. σ is the sky deviation in the image. The upper limit assures that any remaining cosmic rays or spurious noise pixels in the image are not included in the segmentation map.

2. Sort the pixels in the segmentation map according to their photon counts and the Gini coefficient will be computed using the equation

$$G = \frac{1}{\overline{X}n(n-1)} \sum_{i=1}^{n} (2i - n - 1)X_{i}$$
(10)

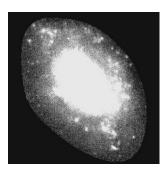


Figure 8: Segmentation map of the galaxy

2.5 The Moment of the Light (M20)

 M_{20} is the second order moment of the brightest 20% pixels of the galaxy.

1. Find the second-order moment M_{tot} of the galaxy. Here only the pixels belongs to segmentation map will be considered. We use the following equation to find M_{tot}

$$M_{tot} = \sum_{i}^{n} M_{i} = \sum_{i}^{n} f_{i} \left[(x_{i} - x_{c})^{2} + (y_{i} - y_{c})^{2} \right]$$
(11)

where x_c, y_c is the galaxy's center.

- 2. Minimize M_{tot} w.r.t. center of the galaxy.
- 3. Sort the pixels by flux, sum M_i over the brightest pixels until the sum of the pixel values equals 20% of the total galaxy flux, and then normalize by M_{tot} .

$$M_2 0 = \log \left(\frac{\sum M_i}{M_{tot}} \right) \tag{12}$$

while $\sum_{i} f_{i} < 0.2 f_{tot}$

where f_{tot} is the total flux of the segmentation map. The normalization by M_{tot} removes the dependence on total galaxy flux or size.

3 Parallel PyMorph

We have parallelized the pipeline based on Single Program, Multiple Data technique. The algorithm used here is shown in the Figure 3. In this implementation we will have a master processor and N_P slaves. The master will do the pre-processing and post-processing. In the pre-processing part the master processor will create stamp image of the galaxy and pass it to the slave. This process continues until the number of jobs (N_J) less than N_P . The slave runs PyMorph in the GALCUT mode and send the result to the master. As soon as the master get the result from the N^{th} slave it creates cutout of another galaxy and send to the same processor. Finally, the master generate a final result file which is the only post-processing part. We have tested the parallel PyMorph and found that if we increase the number of slaves 10 fold, then the time requires to generate the parameters decreases ~ 6 fold.

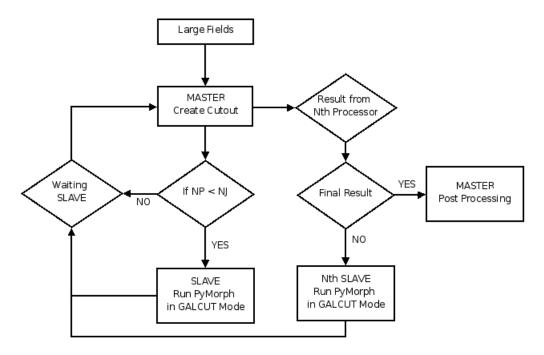


Figure 9: The schematic diagram of Parallel PyMorph. N_P is the number of slaves and N_J is the number of jobs

4 Appendix

SExtractor needs a configuration file, output parameters file, convolution kernel file and Neural Network file for Star/Galaxy classification files for its execution. PyMorph uses the following files as default.

4.1 SExtractor Configuration File

| # | | Catalog |
|------------------------------------|------------------------------|---|
| CATALOG_NAME CATALOG_TYPE | j8f631_sex.cat ASCII_HEAD | <pre># name of the output catalog # NONE,ASCII,ASCII_HEAD, ASCII_SKYCAT, # ASCII_VOTABLE, FITS_1.0 or FITS_LDAC</pre> |
| PARAMETERS_NAME | default.param | # name of the file containing catalog contents |
| # | | Extraction |
| DETECT_TYPE | CCD | $\mbox{\tt\#}$ CCD (linear) or PHOTO (with gamma correction) |
| DETECT_MINAREA | 6 | # minimum number of pixels above threshold |
| DETECT_THRESH | 1.5 | # <sigmas> or <threshold>, <zp> in mag.arcsec-2</zp></threshold></sigmas> |
| ANALYSIS_THRESH | 1.5 | <pre># <sigmas> or <threshold>,<zp> in mag.arcsec-2</zp></threshold></sigmas></pre> |
| FILTER | Υ | # apply filter for detection (Y or N)? |
| FILTER_NAME | default.conv | # name of the file containing the filter |
| DEDIEND NTHECH | 32 | # Number of Johlandian sub shoreholds |
| DEBLEND_NTHRESH DEBLEND_MINCONT | 0.005 | # Number of deblending sub-thresholds |
| DEBLEND_MINCONI | 0.005 | # Minimum contrast parameter for deblending |
| CLEAN | Y | # Clean spurious detections? (Y or N)? |
| CLEAN_PARAM | 1.0 | # Cleaning efficiency |
| | | |
| MASK_TYPE | CORRECT | # type of detection MASKing: can be one of |
| | | # NONE, BLANK or CORRECT |
| # | | Photometry |

```
PHOT_APERTURES 5
                         # MAG_APER aperture diameter(s) in pixels
PHOT_AUTOPARAMS 2.5, 3.5
                      # MAG_AUTO parameters: <Kron_fact>,<min_radius>
PHOT_PETROPARAMS 2.0, 3.5
                         # MAG_PETRO parameters: <Petrosian_fact>,
                         # <min_radius>
PHOT_FLUXFRAC 0.5
                         # flux fraction[s] used for FLUX_RADIUS
SATUR_LEVEL
             100000.0
                         # level (in ADUs) at which arises saturation
MAG_ZEROPOINT 25.256
                            # magnitude zero-point
MAG_GAMMA
             4.0
                        # gamma of emulsion (for photographic scans)
GATN
             1.0
                         # detector gain in e-/ADU
PIXEL_SCALE
             0
                        # size of pixel in arcsec (0=use FITS WCS info)
#----- #----- Star/Galaxy Separation -------
SEEING_FWHM
             0.11
                          # stellar FWHM in arcsec
STARNNW_NAME
              default.nnw # Neural-Network_Weight table filename
             ----- Background -----
BACK_SIZE
                          # Background mesh: <size> or <width>,<height>
BACK_FILTERSIZE 3
                          # Background filter: <size> or <width>,<height>
BACKPHOTO_TYPE GLOBAL
                         # can be GLOBAL or LOCAL
MEMORY_OBJSTACK 3000
                          # number of objects in stack
MEMORY_PIXSTACK 300000
                         # number of pixels in stack
MEMORY_BUFSIZE 1024
                        # number of lines in buffer
#----- Miscellaneous ------
VERBOSE_TYPE
             NORMAL # can be QUIET, NORMAL or
N # Write XML file (Y/N)?
sex.xml # Filename for XML output
             NORMAL
                         # can be QUIET, NORMAL or FULL
WRITE_XML
XML_NAME
#----- Check Image -----
CHECKIMAGE_TYPE APERTURES
                              # can be NONE, BACKGROUND, BACKGROUND_RMS,
                          # MINIBACKGROUND, MINIBACK_RMS, -BACKGROUND,
                          # FILTERED, OBJECTS, -OBJECTS, SEGMENTATION,
                          # or APERTURES
CHECKIMAGE_NAME check.fits
                         # Filename for the check-image
#----- WEIGHTing ------
WEIGHT_TYPE
              MAP_RMS
                            # type of WEIGHTing: NONE, BACKGROUND,
                         # MAP_RMS, MAP_VAR or MAP_WEIGHT
              j8f631_drz_rms.fits  # weight-map filename
WEIGHT_IMAGE
                         # modulate gain (E/ADU) with weights? (Y/N)
WEIGHT GAIN
```

4.2 SExtractor Output Parameters

NUMBER
X_IMAGE
Y_IMAGE
ALPHA_SKY
DELTA_SKY
FLUX_ISO
FLUXERR_ISO
MAG_ISO
MAGERR_ISO
FLUX_RADIUS
BACKGROUND
THETA_IMAGE
ELONGATION
ISOO
A_IMAGE

FLAGS

4.3 SExtractor Convolution Kernel

By default PyMorph uses 5x5 convolution mask of a Gaussian PSF with FWHM = 2.5 pixels.

4.4 SExtractor Neural Netwrok File

PyMorph uses the default.nnw file coming with SExtractor

4.5 PyMorph Flags

The flags used in PyMorph are the following

| Flag | Explanation |
|---------|--|
| 1 | Repeat Mode |
| 2 | Fit bulge center |
| 4 | Fit disk center |
| 8 | Fit sky |
| 16 | The cutimage extend goes outside the image |
| 32 | Galaxy ellipse failed |
| 64 | CASGM module failed |
| 128 | Galfit failed |
| 256 | Plotting failed |
| 512 | Fitting bulge |
| 1024 | Fitting disk |
| 2048 | Fitting point |
| 4096 | Neighbour fit |
| 8192 | Large chisq |
| 16384 | Low goodness |
| 32768 | Fake center |
| 65536 | Sersic parameter hit the limit |
| 131072 | Disk parameter hit the limit |
| 262144 | Asymmetry is not Converged |
| 524288 | Asymmetry calculation goes outside frame |
| 1048576 | Background region determination is poor |

4.6 How to run PyMorph?

- ullet tar xzvf PyMorph.tar.gz
- \bullet cp config.py /your/data/area/where/you/want/to/run/pymorph
- Edit .cshrc file and give

```
setenv PYTHONPATH /path/to/PyMorph/pymorph
alias pymorph '/path/to/PyMorph/pymorph.py'
```

- cd /your/data/area/where/you/want/to/run/pymorph
- Edit config.py and add path to your GALFIT and SExtractor binaries.
- pymorph [options]