

Definition and Characterization of Local Analogs to High-z Galaxies

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Motivation

High Redshift (z) Universe:

- Distant and Young Galaxies.
- Small (~ 1 kpc).
- Small angular size.
- Blue intrinsic colors.
- Irregular morphologies.

Study the physical processes in these galaxies in detail is extremely difficult.

- One possible solution to these difficulties is to identify low-z analogs to high-z galaxies.

Local Analogs

(Low Redshift):

- Irregular, Small, High Star Formation.
- Main features observable in the UV – Optical – Infrared

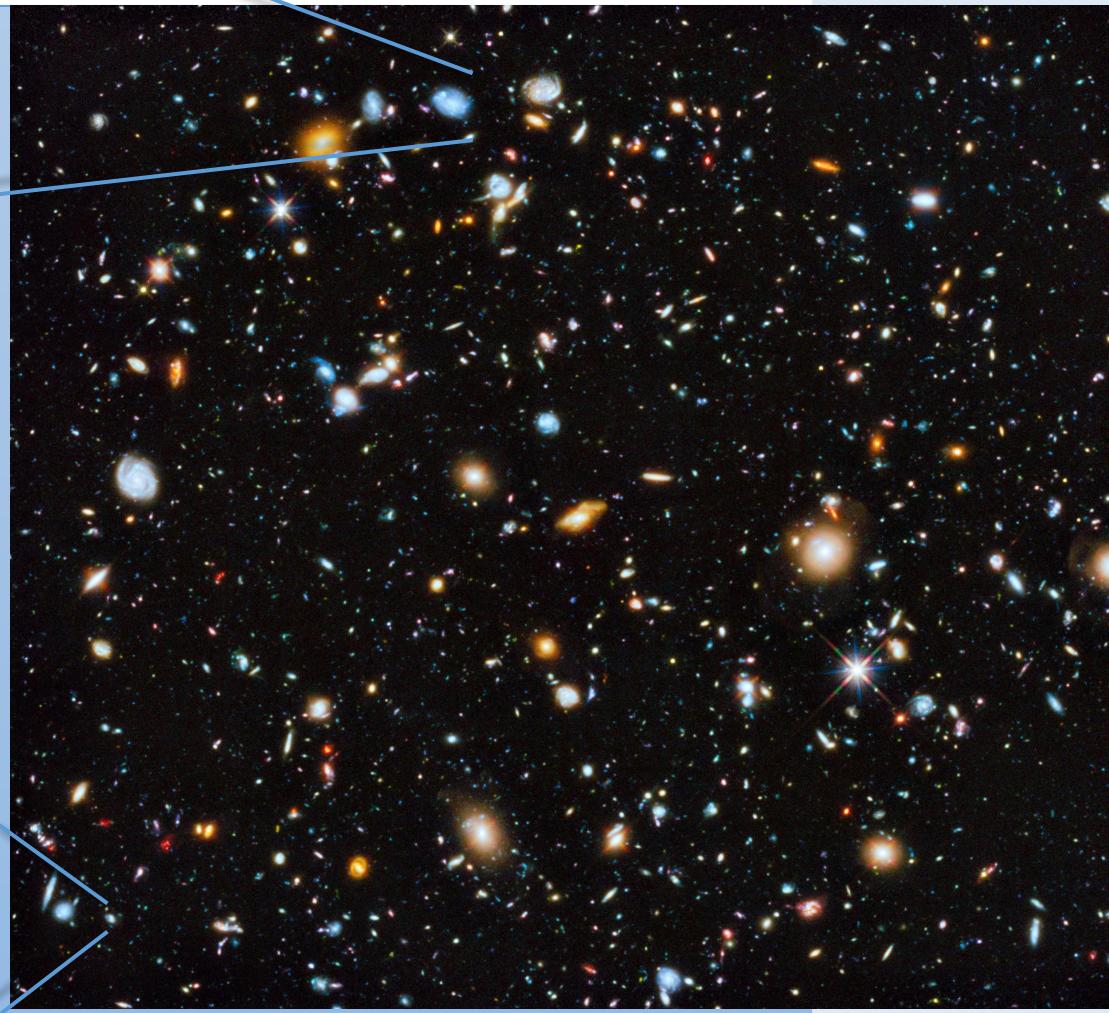
Early Galaxies

(High Redshift):

- Irregular, Small, High Star Formation.
- Main features (UV-optical) **redshifted** to the Infrared.



The Deep Field

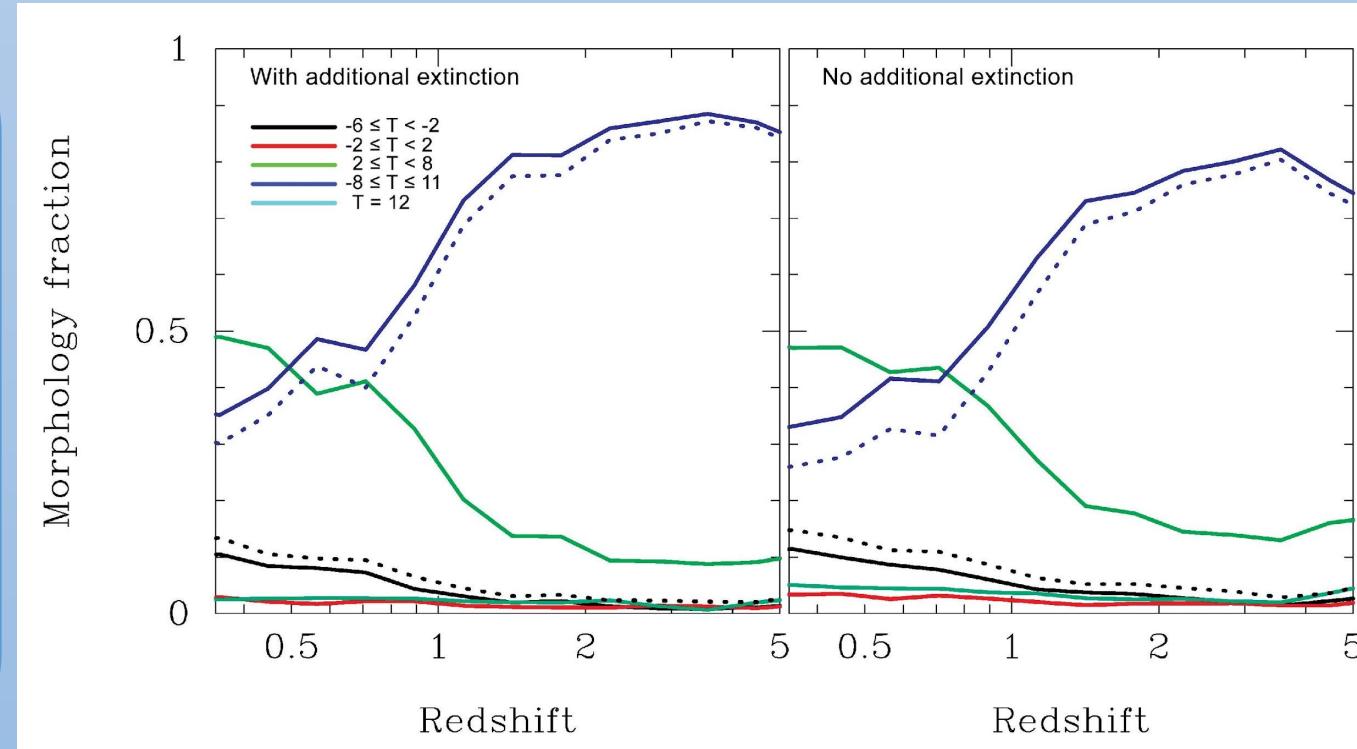


Ultraviolet Coverage of the Hubble Ultra Deep Field (UVUDF) project.

Credit: E. Soto, D. De Mello (CUA), H. Teplitz and M. Rafelski (IPAC/Caltech), A. Koekemoer (STScI), R. Windhorst (Arizona State University), and Z. Levay (STScI) [NASA](#), [ESA](#).

Sample selection

- Previous works: FUV luminosity, $W(\text{H}\alpha)$,
i.e. Ostlin 2014, Hoopes 2007, Overzier 2014.
- Novel Technique.
- Based on the success rate of 129 local galaxy templates (from **Brown et al. 2014**) in fitting observe SED of 159,645 high-z galaxies (**CANDELS**¹).
- High-z Galaxies with $z > 2$.



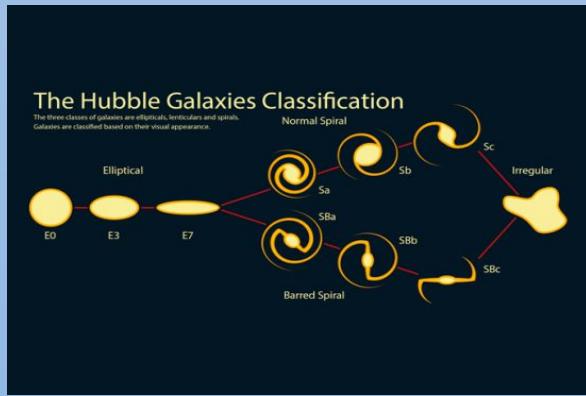
- For galaxies at $z > 2$ just 11 of the local template galaxies provide $> 90\%$ of all the best-fit SEDs.
- Unique sample.

Refs: ¹Cosmic Assembly Near-infrared Deep Extragalactic Legacy Survey (CANDELS). For survey details, see Grogin et al. (2011) and Koekemoer et al. (2011).

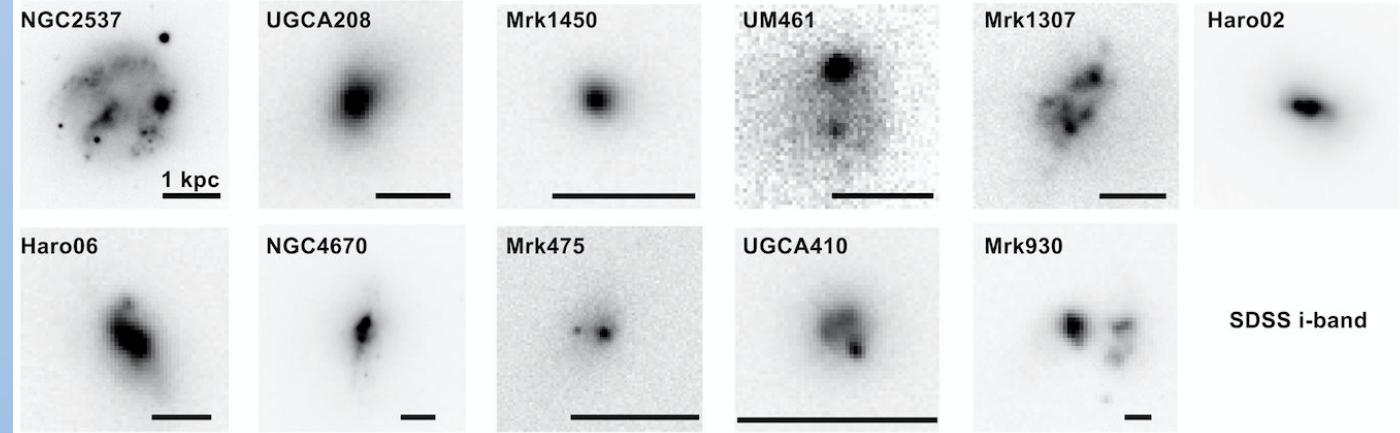
Blue Compact Dwarf Galaxies (BCDGs)

- Local galaxies.
- Compact galaxies.
- Small (optical diameter ~ 1 kpc)
- Low **metallicities** ($1/3$ to $1/41 Z_{\text{sun}}$)
- Blue optical colors (actively star forming).
- ---> Are this young system?

BCDGs do not fit in the Hubble sequence classification.



- The Sample of Local Analogs



| Name | RA J2000.0 | Dec | D Mpc | $\log M_*$ M_{\odot} | $\log M_{HI}^{(a)}$ M_{\odot} | $f_{\text{gas}}^{(b)}$ M_{\odot} | Metallicity $12 + \log(O/H)$ | Alternative Name |
|----------|---------------|-----------|----------|---------------------------|------------------------------------|---------------------------------------|---------------------------------|-------------------|
| NGC 2537 | 08:13:14.4 | +45:59:13 | 8.6 | 9.107 | 8.428 | 0.17 | 8.19 | Arp 6; 'Bear Paw' |
| Mrk 140 | 10:16:28.3 | +45:19:18 | 27.6 | 8.271 | 8.897 | 0.56 | 8.30 | Mrk140 |
| Haro 02 | 10:32:31.9 | +54:24:02 | 23.7 | 9.790 | | | 8.45 | Mrk 033 |
| Mrk 1450 | 11:38:35.6 | +57:52:27 | 14.7 | 7.272 | 7.351 | 0.54 | 7.96 | |
| UM 461 | 11:51:33.1 | -02:22:22 | 20.7 | 7.045 | 8.467 | 0.96 | 7.78 | |
| Mrk 1307 | 11:52:37.4 | -02:28:09 | 21.0 | 8.107 | 8.727 | 0.81 | 7.96 | UM462 |
| Haro 06 | 12:15:18.4 | +05:45:39 | 35.1 | 8.473 | 8.830 | 0.69 | 8.18 | |
| NGC 4670 | 12:45:17.1 | +27:07:31 | 20.0 | 9.246 | 9.017 | 0.37 | 8.30 | Arp163 |
| Mrk 475 | 14:39:05.5 | +36:48:21 | 10.9 | 8.100 | 6.624 | 0.56 | 7.93 | |
| Mrk 487 | 15:37:04.2 | +55:15:48 | 10.5 | 7.455 | 7.585 | 0.57 | 8.10 | |
| Mrk 930 | 23:31:58.6 | +28:56:50 | 77.5 | 9.053 | 9.506 | 0.74 | 8.08 | |

The SOFIA telescope

Stratospheric Observatory for Infrared Astronomy.

- 106 inches (2.7-meter) reflecting telescope, is a 17 ton telescope!

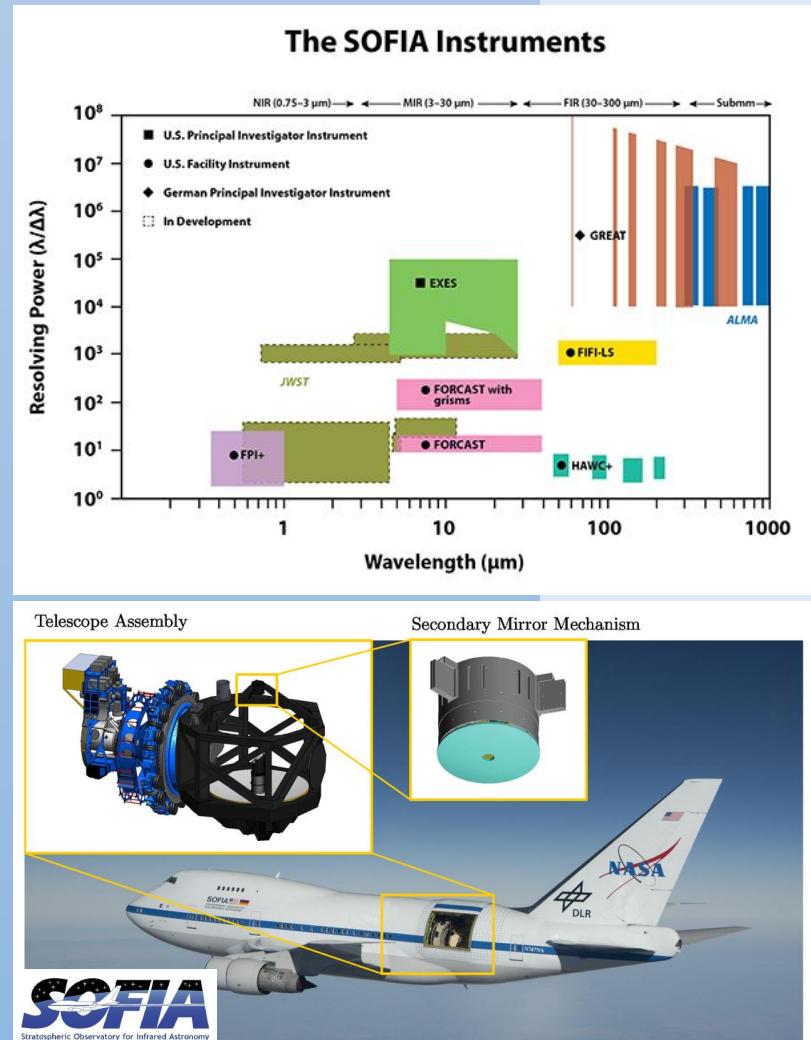
- **HAWC+**

High-resolution Airborne Wideband Camera. [50 – 240 μm]

- **HAWC+ Documentation:**

https://www.sofia.usra.edu/sites/default/files/Instruments/HAWC_PLUS/Documents/hawc_data_handbook.pdf

- We also use **ancillary data** from:
 - Spitzer
 - Herschel
 - WISE
 - AKARI



Mrk 1450

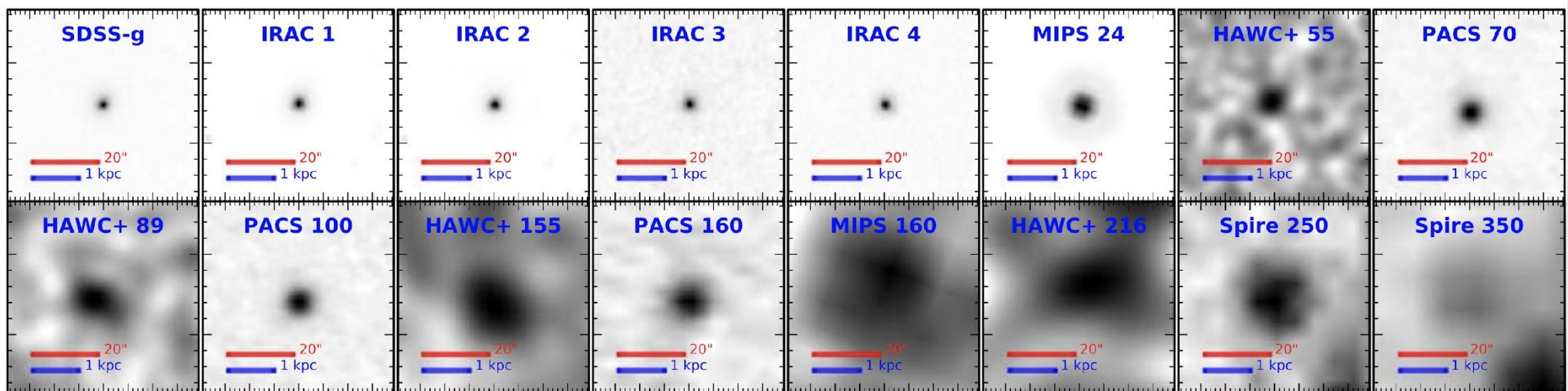


Figure 4. Optical to FIR images of Mrk 1450. The red bar corresponds to $20''$, and the blue bar indicates 1 kpc.

Photometry:

- Herschel Interactive Processing Enviroment (HIPE):

<https://www.cosmos.esa.int/web/herschel/hipe-download>

- Jython

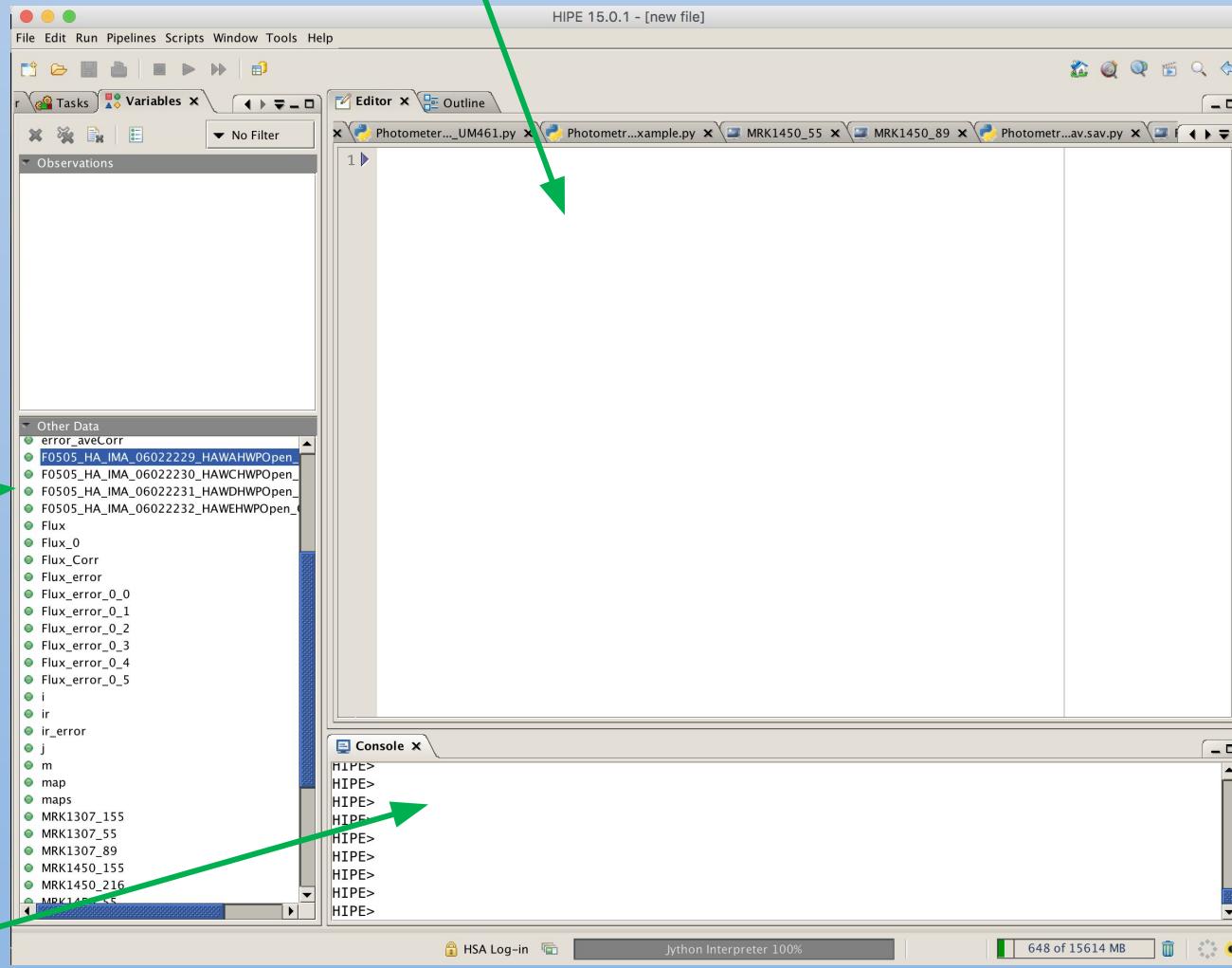
<https://www.jython.org/>

- Predefined Task:
 - Annular Sky Aperture Photometry

Data/Variables

Console

Scripts



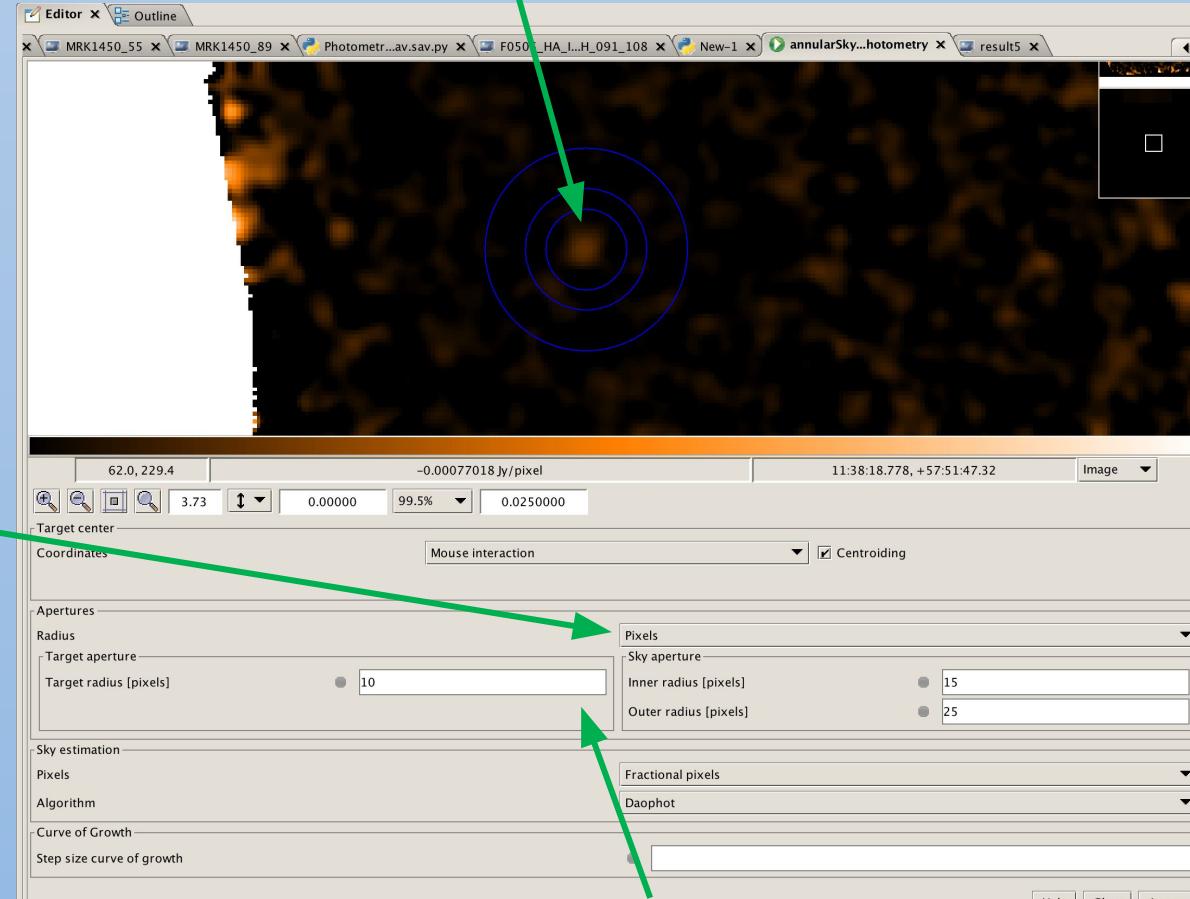
Photometry:

Galaxy!

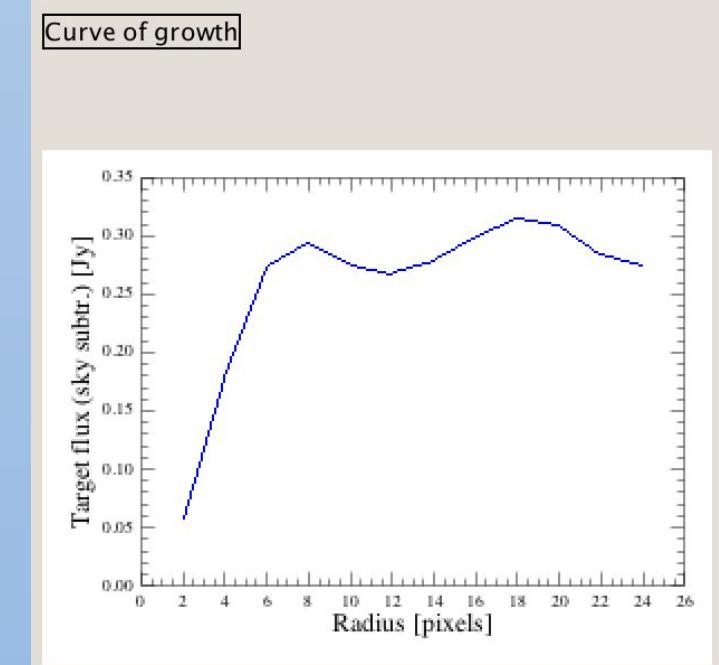
Annular Sky
Aperture
Photometry:

- Image Units: Jy/Pixel

Aperures
(pixels or arcsec)



Source and Sky radius



```
HIP> Result = annularSkyAperturePhotometry(image=MRK1450_55, centerX=94.98058210987237,  
centerY=103.56310730363946, radiusPixels=10.0, innerPixels=15.0, outerPixels=25.0, fractional=1, centroid=True)
```

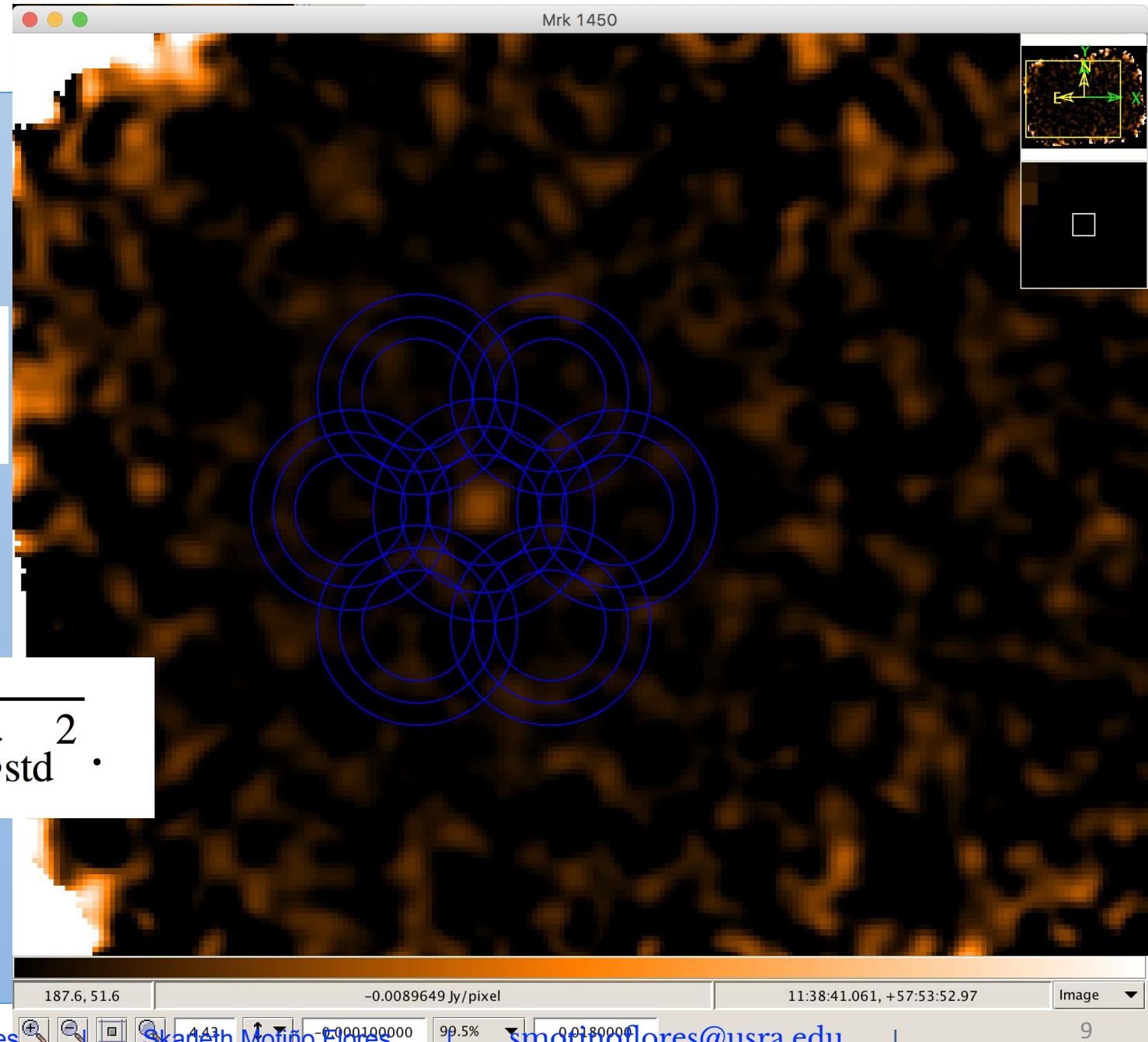
Source Flux:

$$F_{\text{source}} = (f_{\text{tot}}) - \mathbf{B}g_{\text{ave}}.$$

Uncertainties:

$$F_{\text{unc}} = \sqrt{(F_{\text{source}}^* \text{Abs}_{\text{cal}})^2 + \mathbf{B}g_{\text{std}}^2}.$$

$\text{Abs}_{\text{cal}} = 10\%-15\%$



• Example of Script to perform photometry

```
1 # 'Mrk 1307'  SOFIA      'HAWC+ Bands A, C, D'
2 # 155 um      F0483_HA_IMA_06022239_HAWDHWP0pen_CRH_091_093.fits
3 # 89 um       F0483_HA_IMA_06022239_HAWDHWP0pen_CRH_067_074.fits
4 # 55 um       F0483_HA_IMA_06022239_HAWDHWP0pen_CRH_077_088.fits
5
6 from math import *
7 from java.lang.Math import PI
8
9 wl = ['55','89','155']
10
11 maps = [ F0483_HA_IMA_06022237_HAWAHWP0pen_CRH_077_088 , \
12 F0483_HA_IMA_06022238_HAWCHWP0pen_CRH_067_074, F0483_HA_IMA_06022239_HAWDHWP0pen_CRH_091_093]
13
14 #####
15 ##### SETTING UNITS TO Jy/pixel #####
16
17 for i in range(3):
18     map = maps[i]
19     map.setUnit(herschel.share.unit.Unit.parse("Jy/pixel"))
20
21 # Save maps with units to file
22     simpleFitsWriter(product=map, file='/Users/admin/HIPEScripts/SOFIA/MRK1307_Jy_pixel_wl_'+wl[i]+'_um.fits')
23
24 #####
25 ##### READING MAPS FROM FILE #####
26 MRK1307_55 = fitsReader(file = '/Users/admin/HIPEScripts/fits_images/SOFIA/MRK1307_Jy_pixel_wl_'+wl[0]+'_um.fits')
27 MRK1307_89 = fitsReader(file = '/Users/admin/HIPEScripts/fits_images/SOFIA/MRK1307_Jy_pixel_wl_'+wl[1]+'_um.fits')
28 MRK1307_155 = fitsReader(file = '/Users/admin/HIPEScripts/fits_images/SOFIA/MRK1307_Jy_pixel_wl_'+wl[2]+'_um.fits')
29 maps = [ MRK1307_55 , MRK1307_89, MRK1307_155]
30
31 # Or read the files:
32 for i in range(3):
33     maps[i] = fitsReader(file = '/Users/admin/HIPEScripts/SOFIA/MRK1307_Jy_pixel_wl_'+wl[i]+'_um.fits')
34 #maps[i] = 'MRK1307_Jy_pixel_wl_'+wl[i]+'_um.fits'
35
36 #####
37 ##### Annular Photometry #####
38
39 ### Mrk1307 Source positions in units of pixels not Astronomical Coordinates
40 # To obtain: On the map, Right click on the source and select Get coordinates
41
42 coordY = [108.43, 109.44, 98.0]
43 coordX = [173.47, 179.60, 156.0]
44
45
```

```

46 #####
47 N = 3                                     # Number of Data images. (Bands A, C, E).
48 Flux      = N*[0.0]
49 error_ave = N*[0.0]
50 nabg     = 6                               # Number of apertures to measure the background.
51 Flux_error = N*[[0.0, 0.0, 0.0, 0.0, 0.0, 0.0]] # Array for for errors
52 ir       = [15, 15, 15]                   # Aperture radius in pixels
53 ir_error = [15, 15, 15]                   # Aperture radius in pixels for the errors
54 Flux_Corr = N*[[0.0, 0.0, 0.0]]
55 error_aveCorr = N*[0.0]
56 RADIO    = [30, 30, 30]
57
58 for i in range(N):
59     Flux[i] = annularSkyAperturePhotometry(image=maps[i], radiusPixels=ir[i], fractional=1, centerX=coordX[i],
60                                              centerY=coordY[i], innerPixels=ir[i]+10, outerPixels=ir[i]+20)
61     a     = 0.0
62     b     = 0.0
63     ir_error[i]     = sqrt(0.5)*ir[i]
64     for j in range(nabg):
65         radio = RADIO[i]
66         angle = j*2*PI/(nabg)
67         x = coordX[i]+radio*cos(angle)
68         y = coordY[i]+radio*sin(angle)
69         Flux_error[i][j] = annularSkyAperturePhotometry(image=maps[i], radiusPixels=ir_error[i], fractional=1,
70                                              centerX=x, centerY=y, innerPixels=ir_error[i]+8, outerPixels=ir_error[i]+12, centroid=False)
71         a = a + Flux_error[i][j]["Results table"]["Total flux"].data[2]
72         b = b + Flux_error[i][j]["Results table"]["Total flux"].data[2]
73         print ' i=',i,' j=',j, ' FluxErr[i][j]= ',Flux_error[i][j]["Results table"]["Total flux"].data[2]
74     average = b /nabg
75     sigma   = 0
76     for j in range(nabg):
77         sigma   = sigma + (average - Flux_error[i][j]["Results table"]["Total flux"].data[2])**2
78     std = (sigma)/(nabg-1)
79     Flux_Corr[i] = Flux[i]["Results table"]["Total flux"].data[2]-(average)
80     error_ave[i] = a/nabg
81     error_aveCorr[i] = std
82     print ' i=',i,' Flux      = ',Flux[i]["Results table"]["Total flux"].data[2],' Error Average = ',error_ave[i]
83     print (' Background Average: ',average,' STD: ',std)
84     print ' i=',i,' Flux_Corr = ',Flux_Corr[i],'+- Sigma_Corr:',error_aveCorr[i]
85     print '\n'
86     m = i
87     Flux_0 = Flux[m]
88     disp = Display(maps[m])
89     disp.addAnnularSkyPhotometryProduct(Flux_0, java.awt.Color(200,120,0))
90     for j in range(nabg):
91         Flux_error_0_0 = Flux_error[m][j]
92         disp.addAnnularSkyPhotometryProduct(Flux_error_0_0, java.awt.Color(50,055,055))
93
print 'done'

```

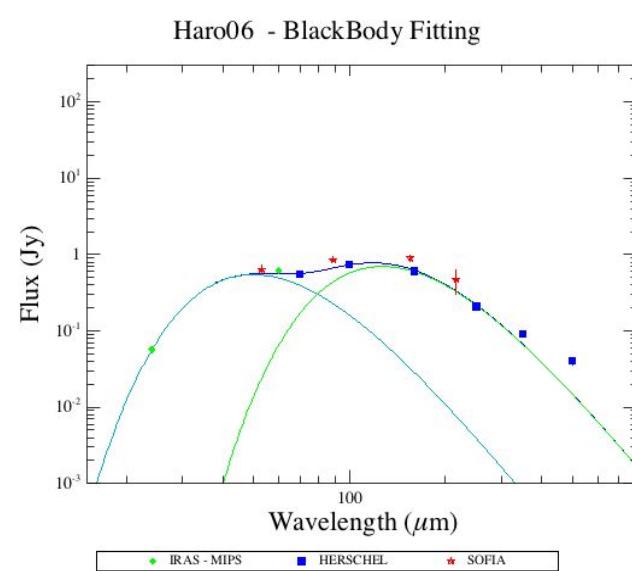
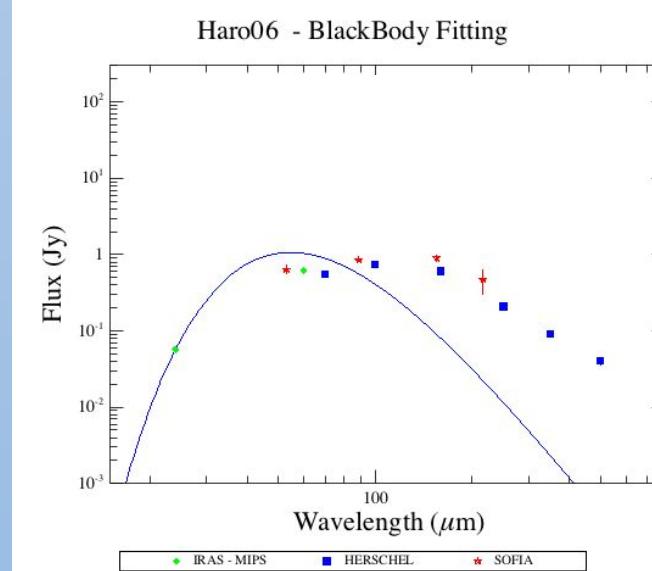
Black Body modeling

- Modified Black Body Function:

$$B_\nu(T) = \frac{2h\nu^3/c^3}{e^{h\nu/kT}-1}$$

$$F_\nu \propto (1 - \exp(-\tau)) B_\nu(T)$$

$$B_{mod}(T) = \Omega B_\nu(T) \left(1 - \exp \left[- \left(\frac{\lambda_0}{\lambda} \right)^\beta \right] \right)$$



$B(\nu, T)$: the Plank function. Parameters:

- T: Dust temperature [k].
- Ω : Normalization constant.
- β : Dust Emissivity Coefficient.

- SOFIA-HAWC+: 55, 89, 155, and 216 μm (in red).
- Herschel: 70, 100, 160, 250, 350, 500 μm (in blue).
- Spitzer- MIPS: 24 μm (in green).

Bayesian Inference of parameters

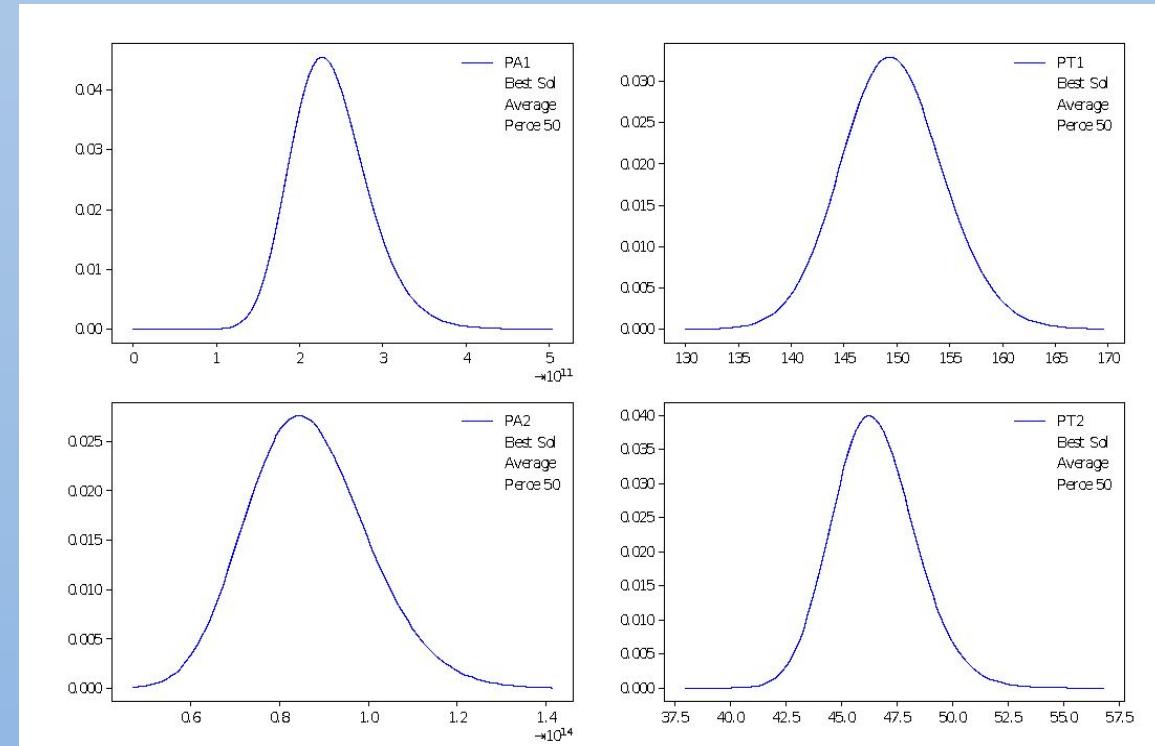
- Parameters:

- T1, T2, A1, A2.
- Beta, Lambda_0 - Const
- Grid 4D **100x100x100x100** over the parameter space.
- **10^8** models.

- Likelihood:

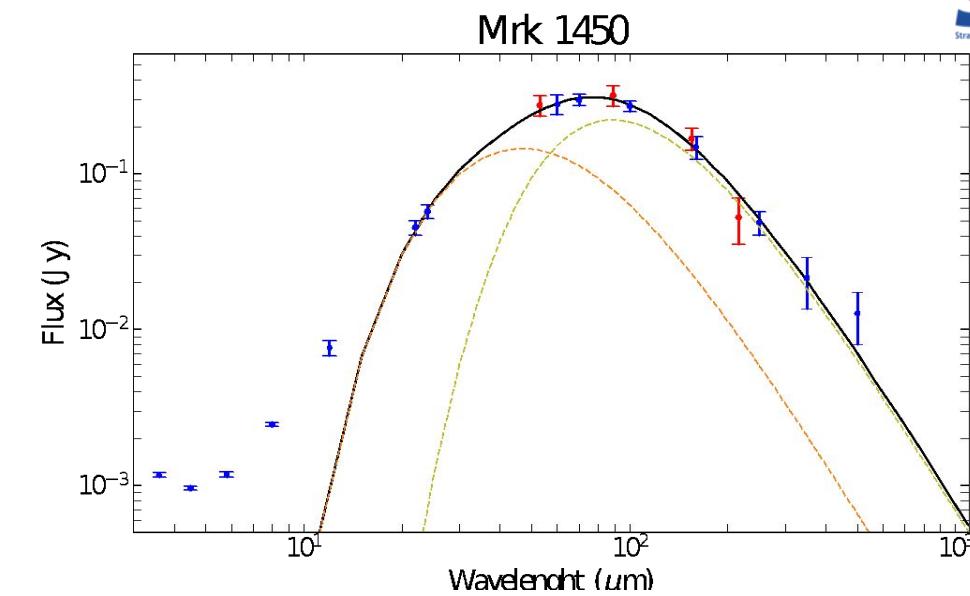
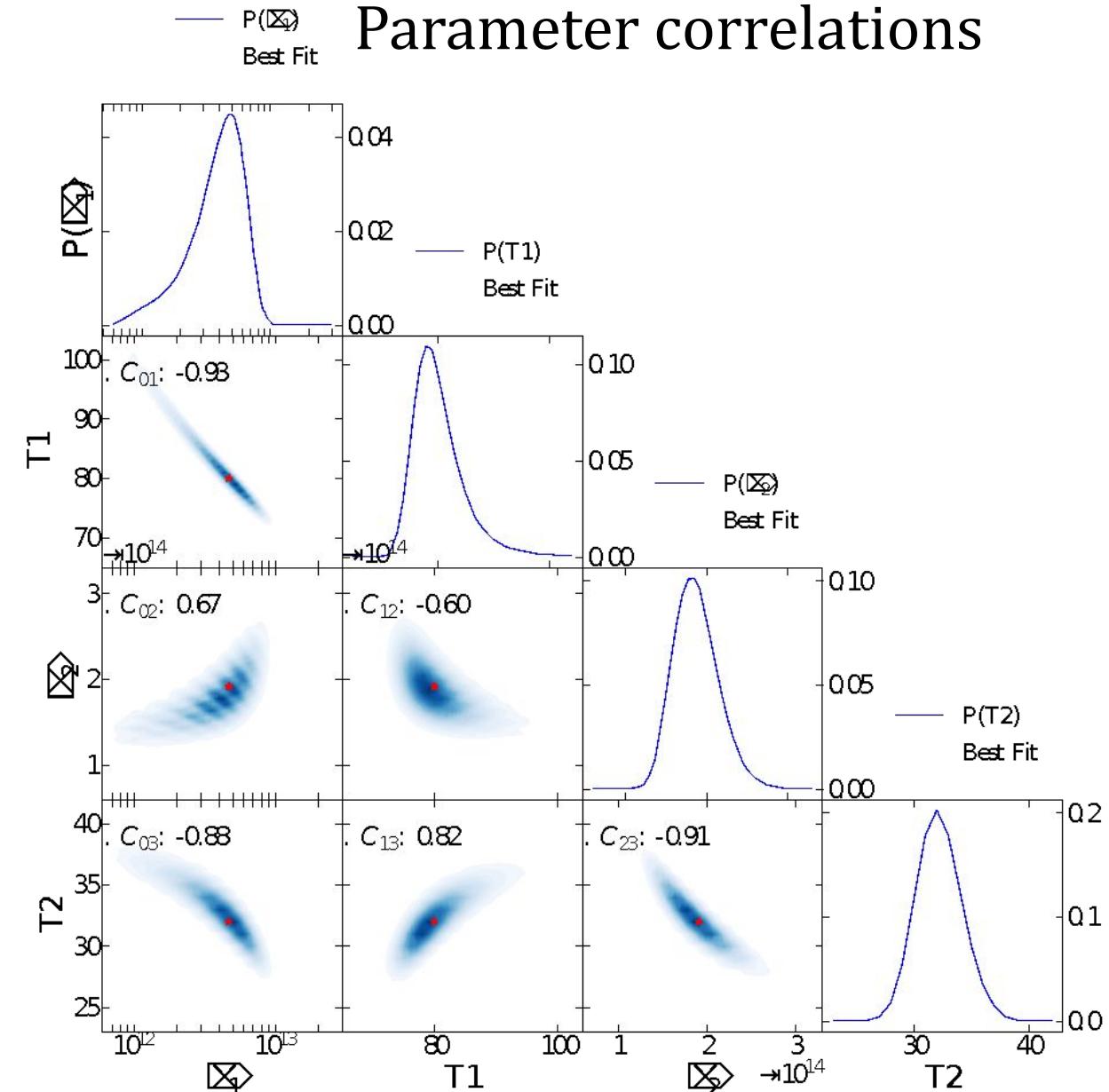
$$P(\theta|priors) = \exp\left(-\chi^2/2.0\right)$$

**Posterior:
Marginalized Probability Distributions
Mrk 1307**

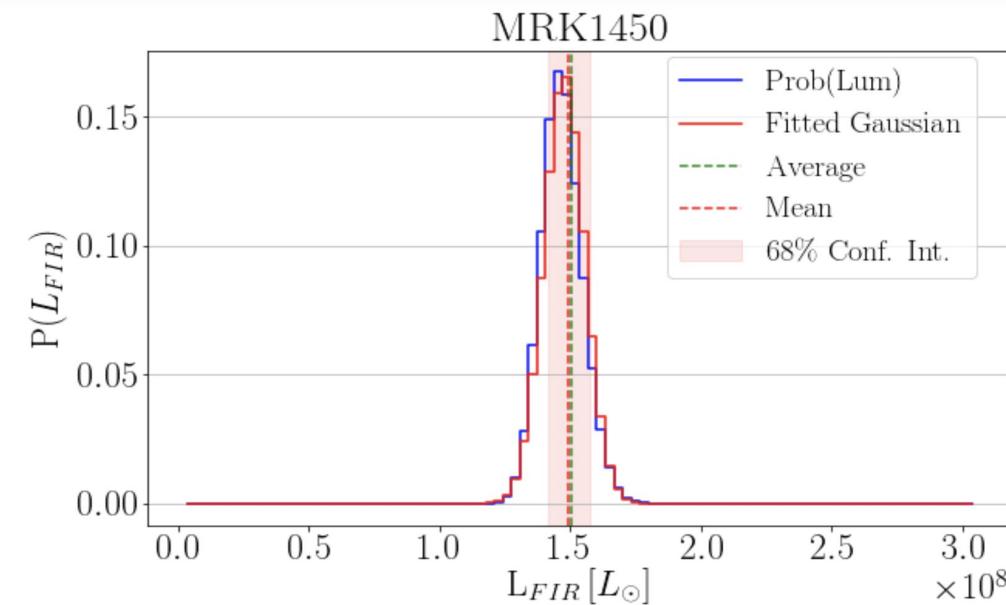


Diagnostic plots for the SED fits

Parameter correlations

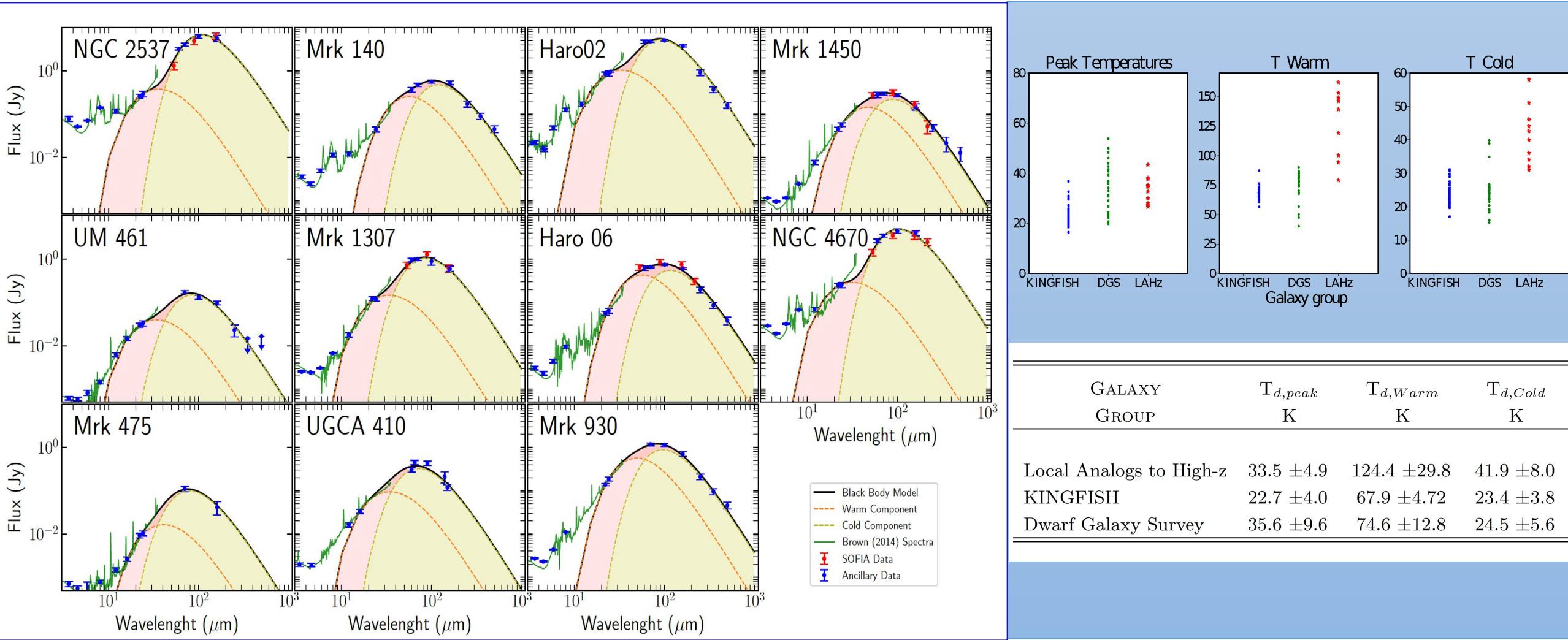


• FIR Luminosity



Results | Black Body Models

2 components

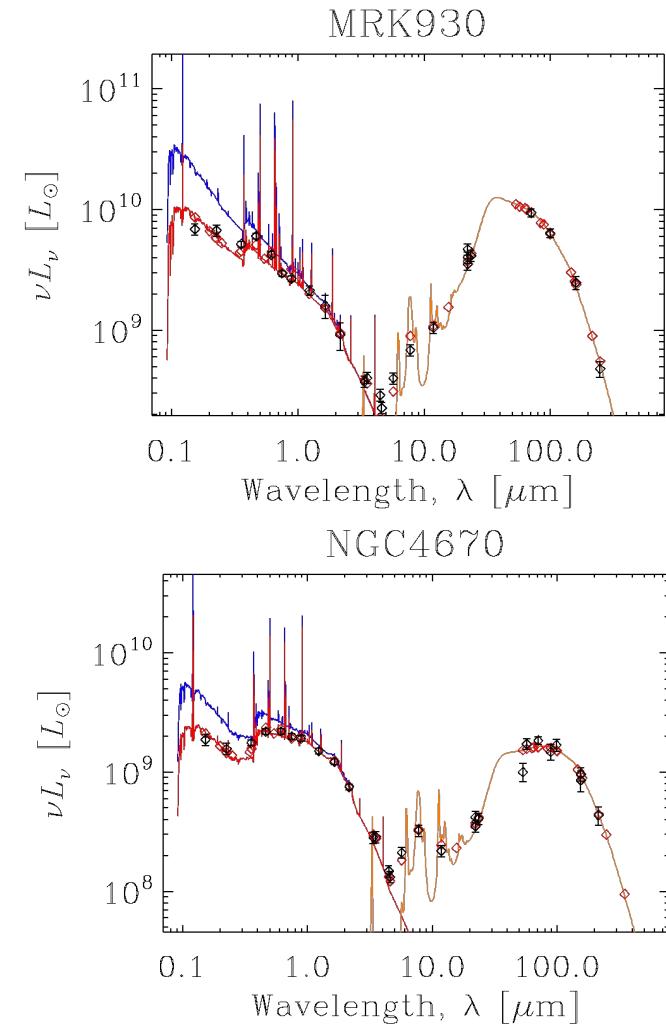


FUV– FIR: Spectral Energy Distribution (SED)

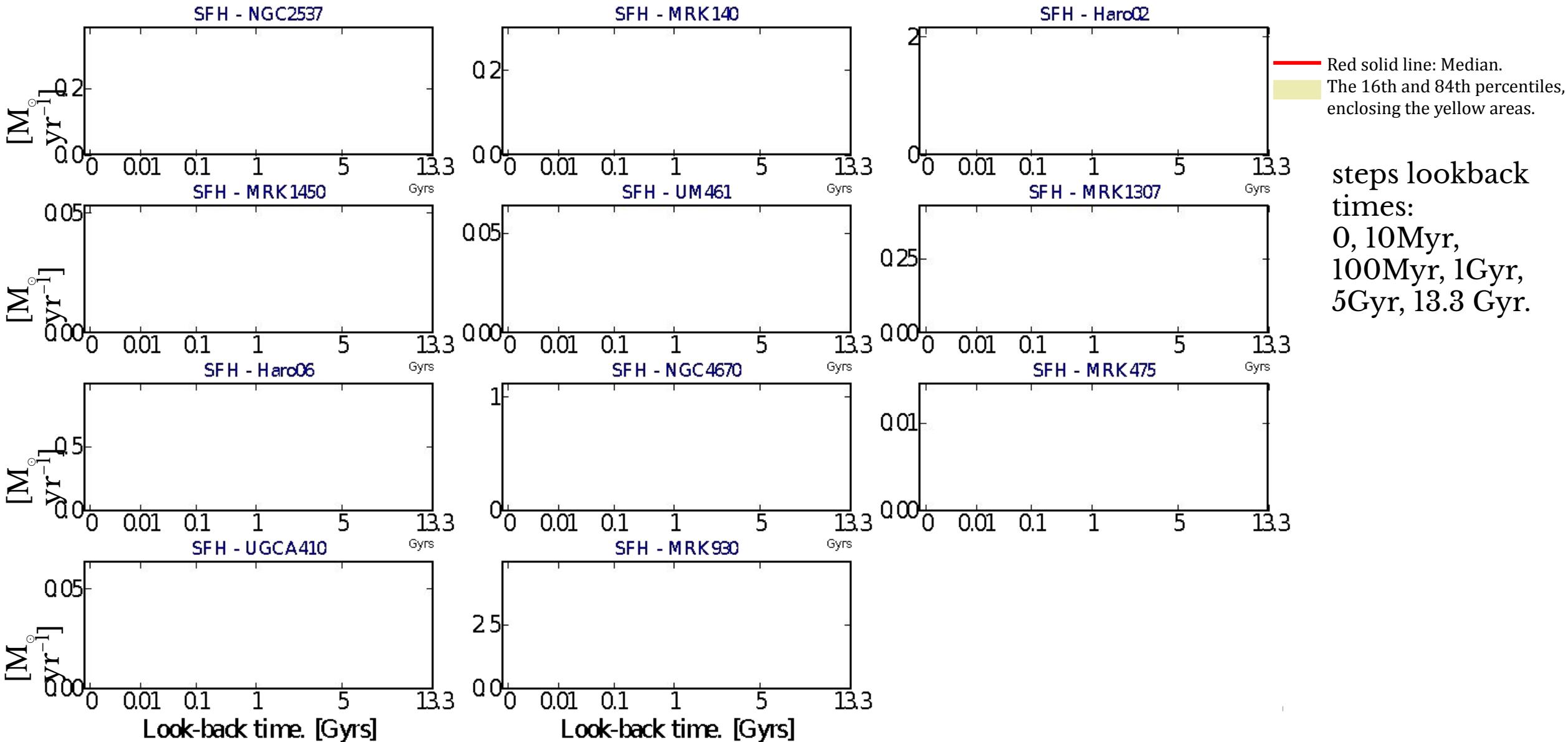
Using Lightning Package (*Eufrasio+17*):

- Fit 45 photometric bands from FUV – FIR.
- Adaptive MCMC procedure.

- Stellar emission:
 - Star Formation Rate (SFR).
 - Star Formation History: 5 look back time bins: 10, 100, 1k, 10k, 50k, 13.3k [Myr]
- IMF: Kroupa
- Dust attenuation
 - Modified Calzetti
- Dust emission
 - Draine & Li, (2007)
- For more information about LIGHTNING Package:
github.com/rafaeleufrasio/lightning



Results | Star Formation History



Article:

- Skarleth M. Motiño Flores *et al.* 2021 *ApJ* 921, 130

<https://iopscience.iop.org/article/10.3847/1538-4357/ac18cc>

LIGHTNING Reference:

- Eufrasio R. et al. 2017 *ApJ* 851, 10.

<https://iopscience.iop.org/article/10.3847/1538-4357/aa9569>

Thanks

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- SOFIA Team, *FIFI-LS and HAWC+ scientific team.*

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Questions?

SOFIA products:

- Observations with SOFIA-HAWC+ (55, 89, and 155 micrometers)

Galaxy: **NGC 2537**

HST Optical + 155 μm Contours

