Applying XID+SED to Extreme Starbursts

In this notebook, we read in the data files and prepare them for fitting with XID+SED, the SED prior model extension to XID+. Here we focus on the source <code>HELP_J104631.170+591036.829</code>. This source is in Rowan-Robinson et al. 2017 (https://arxiv.org/abs/1704.07783) and claimed to have a star formation rate of $> 10^{10} M_{\odot} yr^{-1}$

Import required modules

In [1]:

```
from astropy.io import ascii, fits
from astropy.table import Table
import pylab as plt
%matplotlib inline
from astropy import wcs

import numpy as np
import xidplus
from xidplus import moc_routines
import pickle
```

Set image and catalogue filenames

In [2]:

```
#Folder containing maps

pswfits='/Users/pdh21/Work/Astro/dmu_products/dmu26/data/Lockman-SWIRE/SPIRE/Loc
kman-NEST_image_250_SMAP_v6.0.fits'#SPIRE 250 map
pmwfits='/Users/pdh21/Work/Astro/dmu_products/dmu26/data/Lockman-SWIRE/SPIRE/Loc
kman-NEST_image_350_SMAP_v6.0.fits'#SPIRE 350 map
plwfits='/Users/pdh21/Work/Astro/dmu_products/dmu26/data/Lockman-SWIRE/SPIRE/Loc
kman-NEST_image_500_SMAP_v6.0.fits'#SPIRE 500 map

#output folder
output_folder='./'
```

Load in images, noise maps, header info and WCS information

In [3]:

```
#----250-----
hdulist = fits.open(pswfits)
im250phdu=hdulist[0].header
im250hdu=hdulist[1].header
im250=hdulist[1].data*1.0E3 #convert to mJy
nim250=hdulist[2].data*1.0E3 #convert to mJy
w 250 = wcs.WCS(hdulist[1].header)
pixsize250=3600.0*w 250.wcs.cd[1,1] #pixel size (in arcseconds)
hdulist.close()
#----350-----
hdulist = fits.open(pmwfits)
im350phdu=hdulist[0].header
im350hdu=hdulist[1].header
im350=hdulist[1].data*1.0E3 #convert to mJy
nim350=hdulist[2].data*1.0E3 #convert to mJy
w 350 = wcs.WCS(hdulist[1].header)
pixsize350=3600.0*w 350.wcs.cd[1,1] #pixel size (in arcseconds)
hdulist.close()
#----500-----
hdulist = fits.open(plwfits)
im500phdu=hdulist[0].header
im500hdu=hdulist[1].header
im500=hdulist[1].data*1.0E3 #convert to mJy
nim500=hdulist[2].data*1.0E3 #convert to mJy
w 500 = wcs.WCS(hdulist[1].header)
pixsize500=3600.0*w 500.wcs.cd[1,1] #pixel size (in arcseconds)
hdulist.close()
```

XID+ uses Multi Order Coverage (MOC) maps for cutting down maps and catalogues so they cover the same area. It can also take in MOCs as selection functions to carry out additional cuts. Lets use the python module pymoc.readthedocs.io/en/latest/) to create a MOC, centered on a specific position we are interested in. We will use a HEALPix order of 15 (the resolution: higher order means higher resolution)

Read in the source we are interested in from Rowan-Robinsons's catalogue.

```
In [4]:
```

```
ysb=Table.read('./data/MRRfiles/fromPaper.txt', format='ascii')
```

```
In [6]:
```

```
from astropy.coordinates import SkyCoord
from astropy import units as u
import os

c = SkyCoord(ra=[ysb['RA'][32]]*u.degree, dec=[ysb['dec'][32]]*u.degree)
import pymoc
moc=pymoc.util.catalog.catalog_to_moc(c,70,15)
```

Load in catalogue you want to fit (and make any cuts). Here we use HELP's VO database and directly call it using PyVO

In [7]:

```
import pyvo as vo
service = vo.dal.TAPService("http://vohedamtest.lam.fr/__system__/tap/run/tap")
```

In [8]:

resultset = service.search("SELECT TOP 10000 * FROM herschelhelp.main WHERE 1=CO
NTAINS(POINT('ICRS', ra, dec),CIRCLE('ICRS',"+str(c.ra.deg[0])+", "+str(c.dec.de
g[0])+", 0.025))")

```
WARNING: W27: None:2:48070: W27: COOSYS deprecated in VOTable 1.2 [a
stropy.io.votable.tree]
WARNING: W06: None:38:1318: W06: Invalid UCD 'src.redsfhit': Unknown
word 'src.redsfhit' [astropy.io.votable.tree]
WARNING: W06: None:38:132517: W06: Invalid UCD 'phot.flux;em.opt.100
-200nm': Unknown word 'em.opt.100-200nm' [astropy.io.votable.tree]
WARNING: W06: None:38:132803: W06: Invalid UCD 'stat.error; phot.flu
x;em.opt.100-200nm': Unknown word 'em.opt.100-200nm' [astropy.io.vot
able.tree]
WARNING: W06: None:38:132996: W06: Invalid UCD 'phot.flux; em. opt.100
-200nm': Unknown word 'em.opt.100-200nm' [astropy.io.votable.tree]
WARNING: W06: None:38:133351: W06: Invalid UCD 'stat.error; phot.flu
x;em.opt.100-200nm': Unknown word 'em.opt.100-200nm' [astropy.io.vot
able.tree]
WARNING: W06: None:38:133553: W06: Invalid UCD 'phot.mag;em.opt.100-
200nm': Unknown word 'em.opt.100-200nm' [astropy.io.votable.tree]
WARNING: W06: None:38:133838: W06: Invalid UCD 'stat.error; phot.mag;
em.opt.100-200nm': Unknown word 'em.opt.100-200nm' [astropy.io.votab
le.tree]
WARNING: W06: None:38:134029: W06: Invalid UCD 'phot.mag;em.opt.100-
200nm': Unknown word 'em.opt.100-200nm' [astropy.io.votable.tree]
WARNING: W06: None:38:134383: W06: Invalid UCD 'stat.error; phot.mag;
em.opt.100-200nm': Unknown word 'em.opt.100-200nm' [astropy.io.votab
le.tree]
WARNING: W06: None:38:134582: W06: Invalid UCD 'meta.code.qual;em.op
t.100-200nm': Unknown word 'em.opt.100-200nm' (suppressing further w
arnings of this type...) [astropy.io.votable.tree]
```

In [9]:

masterlist=resultset.table

In [10]:

masterlist

Out[10]:

<Table masked=True length=612>

| field | help_id | ra | dec |
|------------------|-----------------------------|--------------------|--------------------|
| | | deg | deg |
| object | object | float64 | float64 |
| Lockman SWIRE | HELP_J104638.221+591148.656 | 161.65925293770201 | 59.196848862853301 |
| Lockman SWIRE | HELP_J104635.749+591159.797 | 161.64895354004301 | 59.199943686663303 |
| Lockman SWIRE | HELP_J104635.673+591151.488 | 161.64863897318801 | 59.197635549980497 |
| Lockman SWIRE | HELP_J104636.716+591153.499 | 161.65298183626501 | 59.1981942725632 |
| Lockman SWIRE | HELP_J104636.549+591152.862 | 161.65228846237 | 59.198017308322697 |
| Lockman SWIRE | HELP_J104636.329+591150.217 | 161.65136947320499 | 59.197282393400002 |
| Lockman SWIRE | HELP_J104637.753+591146.805 | 161.65730338938499 | 59.196334773275403 |
| Lockman SWIRE | HELP_J104636.653+591148.348 | 161.65272231304399 | 59.196763373943398 |
| Lockman SWIRE | HELP_J104636.590+591146.670 | 161.65245722956101 | 59.196297147097198 |
| | | | |
| Lockman SWIRE | HELP_J104626.750+590919.397 | 161.61145906657001 | 59.155388006727698 |
| Lockman SWIRE | HELP_J104629.666+590909.147 | 161.623606773419 | 59.152540885587101 |
| Lockman SWIRE | HELP_J104630.125+590908.544 | 161.625521722077 | 59.152373370401598 |
| Lockman SWIRE | HELP_J104623.180+590943.550 | 161.59658256820299 | 59.162097269620702 |
| Lockman SWIRE | HELP_J104622.434+590944.268 | 161.59347306076501 | 59.162296694316701 |
| Lockman SWIRE | HELP_J104623.154+590939.857 | 161.59647342365699 | 59.1610713127777 |
| Lockman SWIRE | HELP_J104623.619+590935.614 | 161.59841323013299 | 59.159892872450797 |
| Lockman SWIRE | HELP_J104623.136+590934.412 | 161.59639803626499 | 59.159558822563199 |

| field | help_id | ra | dec |
|------------------|-----------------------------|--------------------|--------------------|
| Lockman SWIRE | HELP_J104623.326+590931.630 | 161.59719156002399 | 59.158786015749797 |
| Lockman SWIRE | HELP_J104623.554+590930.911 | 161.59814096002401 | 59.158586515749803 |

```
In [11]:
```

```
for i in range(0,len(masterlist)):
    masterlist['help_id'][i]=masterlist['help_id'][i].decode('UTF-8')
masterlist['help_id']=masterlist['help_id'].astype(str)
```

Filter table

We will only use objects that are not stars (i.e. have flag_gaia = 3)

```
In [12]:
```

```
prior_list=masterlist[(masterlist['flag_gaia']!=3)]
```

Get Redshift and Uncertianty

As there is an issue with help ids lets add a new column and fill

```
In [13]:
```

```
from astropy.table import Column, MaskedColumn

t = Table([[1, 2]], names=['a'])
b = MaskedColumn([3, 4], mask=[True, False])
t['b'] = b
```

INFO: Upgrading Table to masked Table. Use Table.filled() to convert to unmasked table. [astropy.table.table]

```
In [15]:
```

```
from astropy.table import Column
prior_list['redshift']=MaskedColumn(np.full((len(prior_list)),fill_value=3.0),ma
sk=[True]*len(prior_list))
prior_list.add_column(MaskedColumn(np.full((len(prior_list)),fill_value=3.0),mas
k=[True]*len(prior_list),name='redshift_unc'))
```

Ken Duncan defines a median and a hierarchical bayes combination redshift. We need uncertianty so lets match via help id

In [16]:

photoz=Table.read("/Users/pdh21/Work/Astro/dmu_products/dmu24_Lockman-SWIR
E/data/master_catalogue_Lockman-SWIRE_20170710_photoz_20170802_r_and_irac1_optim
ised_UPDATED_IDs_20180219.fits")

In [17]:

```
help_id=np.empty((len(photoz)),dtype=np.dtype('U27'))
for i in range(0,len(photoz)):
   help_id[i]=photoz['help_id'][i].strip()
photoz['help_id']=help_id
```

In [18]:

```
from astropy.table import Column
ii=0
for i in range(0,len(prior_list)):
    ind=photoz['help_id'] == prior_list['help_id'][i]
    try:
        prior_list['redshift'][i]=photoz['z1_median'][ind]
        prior_list['redshift_unc'][i]=np.max(np.array([np.abs(photoz['z1_median'][ind]-photoz['z1_min'][ind]),np.abs(photoz['z1_max'][ind]-photoz['z1_median'][ind])]))
        prior_list['redshift_unc'].mask[i]=False
        prior_list['redshift'].mask[i]=False
except ValueError:
```

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In [19]:

prior_list[prior_list['redshift'].mask == False]

Out[19]:

<Table masked=True length=212>

| field | help_id | ra | dec |
|------------------|-----------------------------|--------------------|--------------------|
| | | deg | deg |
| object | str27 | float64 | float64 |
| Lockman SWIRE | HELP_J104638.221+591148.656 | 161.65925293770201 | 59.196848862853301 |
| Lockman SWIRE | HELP_J104633.388+591159.665 | 161.63911810007801 | 59.199906823277999 |
| Lockman SWIRE | HELP_J104630.543+591203.244 | 161.62726356002401 | 59.200901215749802 |
| Lockman SWIRE | HELP_J104631.224+591152.487 | 161.63009821670201 | 59.1979130228532 |
| Lockman SWIRE | HELP_J104629.196+591154.383 | 161.621651153702 | 59.198439621853197 |
| Lockman SWIRE | HELP_J104628.970+591150.623 | 161.62070706002501 | 59.1973952157498 |
| Lockman SWIRE | HELP_J104633.756+591145.612 | 161.64065098326699 | 59.196003338779803 |
| Lockman SWIRE | HELP_J104634.716+591142.000 | 161.64465066002401 | 59.1950001157497 |
| Lockman SWIRE | HELP_J104632.701+591143.101 | 161.63625211049899 | 59.195305701881203 |
| | | | |
| Lockman SWIRE | HELP_J104631.265+590915.262 | 161.63027066002499 | 59.1542394157497 |
| Lockman SWIRE | HELP_J104635.251+590913.191 | 161.64688034249599 | 59.153664048738101 |
| Lockman SWIRE | HELP_J104628.984+590922.830 | 161.62076751470201 | 59.1563415608532 |
| Lockman SWIRE | HELP_J104628.783+590920.883 | 161.619931050703 | 59.155800854853197 |
| Lockman SWIRE | HELP_J104628.294+590913.733 | 161.61789288070301 | 59.153814649853302 |
| Lockman SWIRE | HELP_J104626.672+590923.765 | 161.61113516002499 | 59.156601515749699 |
| Lockman SWIRE | HELP_J104626.064+590921.433 | 161.608600060024 | 59.1559535157498 |
| Lockman SWIRE | HELP_J104626.000+590920.911 | 161.608333960024 | 59.155808515749797 |

| field | help_id | ra | dec |
|------------------|-----------------------------|--------------------|--------------------|
| Lockman SWIRE | HELP_J104623.326+590931.630 | 161.59719156002399 | 59.158786015749797 |
| Lockman SWIRE | HELP_J104623.554+590930.911 | 161.59814096002401 | 59.158586515749803 |

Add additional source

The fit appears bad and requires another source. There appears to be a suitable one in masterlist so lets add it with redshift 3 and uncertianty 3.

```
In [20]:
```

```
z_sig_new=3
prior_list['redshift'].mask[prior_list['help_id']=='HELP_J104631.170+591036.829'
]=False
prior_list['redshift_unc'].mask[prior_list['help_id']=='HELP_J104631.170+591036.
829']=False
prior_list=prior_list[prior_list['redshift'].mask == False]
```

Remove HELP J104631.082+591021.253

As a comparison model, lets remove HELP_J104631.082+591021.253 such that the flux is only going to HELP_J104631.170+591036.829. This will indicate if this is feasible, given the data.

```
In [21]:
```

```
prior_list['redshift'].mask[prior_list['help_id']=='HELP_J104631.082+591021.253'
]=True
prior_list=prior_list[prior_list['redshift'].mask == False]
```

XID+ is built around two python classes. A prior and posterior class. There should be a prior class for each map being fitted. It is initiated with a map, noise map, primary header and map header and can be set with a MOC. It also requires an input prior catalogue and point spread function.

In [22]:

```
#---prior250-----
prior250=xidplus.prior(im250,nim250,im250phdu,im250hdu, moc=moc)#Initialise with
map, uncertianty map, wcs info and primary header
prior250.prior cat(prior list['ra'],prior list['dec'],'photoz', z median=prior l
ist['redshift']. get data(), z sig=prior list['redshift unc']. get data(),ID=pri
or list['help id']) #Set input catalogue
prior250.prior bkg(-5.0,5)#Set prior on background (assumes Gaussian pdf with mu
 and sigma)
#---prior350-----
prior350=xidplus.prior(im350,nim350,im350phdu,im350hdu, moc=moc)
prior350.prior cat(prior list['ra'],prior list['dec'],'photoz', z median=prior l
ist['redshift']. get data(), z sig=prior list['redshift unc']. get data(),ID=pri
or list['help id'])
prior350.prior bkg(-5.0,5)
#---prior500-----
prior500=xidplus.prior(im500,nim500,im500phdu,im500hdu, moc=moc)
prior500.prior cat(prior list['ra'],prior list['dec'],'photoz', z median=prior l
ist['redshift']._get_data(), z_sig=prior_list['redshift_unc']._get_data(),ID=pri
or list['help id'])
prior500.prior bkg(-5.0,5)
```

Set PSF. For SPIRE, the PSF can be assumed to be Gaussian with a FWHM of 18.15, 25.15, 36.3 $^{\prime\prime}$ for 250, 350 and 500 μm respectively. Lets use the astropy module to construct a Gaussian PSF and assign it to the three XID+ prior classes.

In [23]:

```
#pixsize array (size of pixels in arcseconds)
pixsize=np.array([pixsize250,pixsize350,pixsize500])
#point response function for the three bands
prfsize=np.array([18.15,25.15,36.3])
#use Gaussian2DKernel to create prf (requires stddev rather than fwhm hence pfwh
m/2.355)
from astropy.convolution import Gaussian2DKernel
##-----fit using Gaussian beam-----
prf250=Gaussian2DKernel(prfsize[0]/2.355,x_size=101,y_size=101)
prf250.normalize(mode='peak')
prf350=Gaussian2DKernel(prfsize[1]/2.355,x size=101,y size=101)
prf350.normalize(mode='peak')
prf500=Gaussian2DKernel(prfsize[2]/2.355,x_size=101,y_size=101)
prf500.normalize(mode='peak')
pind250=np.arange(0,101,1)*1.0/pixsize[0] #get 250 scale in terms of pixel scale
of map
pind350=np.arange(0,101,1)*1.0/pixsize[1] #get 350 scale in terms of pixel scale
pind500=np.arange(0,101,1)*1.0/pixsize[2] #get 500 scale in terms of pixel scale
 of map
prior250.set prf(prf250.array,pind250,pind250)#requires psf as 2d grid, and x an
d y bins for grid (in pixel scale)
prior350.set_prf(prf350.array,pind350,pind350)
prior500.set prf(prf500.array,pind500,pind500)
```

In [24]:

```
print('fitting '+ str(prior250.nsrc)+' sources \n')
print('using ' + str(prior250.snpix)+', '+ str(prior350.snpix)+' and '+ str(pri
or500.snpix)+' pixels')
```

```
fitting 122 sources using 427, 219 and 108 pixels
```

Before fitting, the prior classes need to take the PSF and calculate how muich each source contributes to each pixel. This process provides what we call a pointing matrix. Lets calculate the pointing matrix for each prior class

```
In [25]:
```

```
prior250.get_pointing_matrix()
prior350.get_pointing_matrix()
prior500.get_pointing_matrix()
```

Default prior on flux is a uniform distribution, with a minimum and maximum of 0.00 and 1000.0 mJy respectively for each source. running the function upper_lim _map resets the upper limit to the maximum flux value (plus a 5 sigma Background value) found in the map in which the source makes a contribution to.

In [26]:

```
pacs100='/Users/pdh21/Work/Astro/dmu_products/dmu18/dmu18_HELP-PACS-maps/data/Lo
ckman-SWIRE_PACS100_v0.9.fits'
#PACS 100 map
pacs160='/Users/pdh21/Work/Astro/dmu_products/dmu18/dmu18_HELP-PACS-maps/data/Lo
ckman-SWIRE_PACS160_v0.9.fits'#PACS 160 map
```

In [27]:

```
#----100-----
hdulist = fits.open(pacs100)
im100phdu=hdulist[1].header
im100hdu=hdulist[1].header
im100=hdulist[1].data
w 100 = wcs.WCS(hdulist[1].header)
pixsize100=3600.0*np.abs(hdulist[1].header['CDELT1']) #pixel size (in arcsecond
nim100=hdulist[2].data
hdulist.close()
#----160-----
hdulist = fits.open(pacs160)
im160phdu=hdulist[1].header
im160hdu=hdulist[1].header
im160=hdulist[1].data #convert to mJy
w 160 = wcs.WCS(hdulist[1].header)
pixsize160=3600.0*np.abs(hdulist[1].header['CDELT1']) #pixel size (in arcsecond
nim160=hdulist[2].data
hdulist.close()
```

In [28]:

```
#---prior100------
prior100=xidplus.prior(im100,nim100,im100phdu,im100hdu,moc=moc)#Initialise with
map, uncertianty map, wcs info and primary header
#prior100.prior_cat(mips24['INRA'],mips24['INDEC'],'photoz')#Set input catalogue
prior100.prior_cat(prior_list['ra'],prior_list['dec'],'photoz', z_median=prior_l
ist['redshift']._get_data(), z_sig=prior_list['redshift_unc']._get_data(),ID=pri
or_list['help_id'])#Set input catalogue
prior100.prior_bkg(0,1)#Set prior on background

#---prior160-------
prior160-prior_cat(prior_list['ra'],prior_list['dec'],'photoz', z_median=prior_l
ist['redshift']._get_data(), z_sig=prior_list['redshift_unc']._get_data(),ID=pri
or_list['help_id'])
#prior160.prior_cat(mips24['INRA'],mips24['INDEC'],'photoz')
prior160.prior_bkg(0,1)
```

In [29]:

```
pacs100 psf=fits.open('/Users/pdh21/Work/Astro/dmu products/dmu18/dmu18 Lockman-
SWIRE/dmu18 PACS 100 PSF Lockman-SWIRE 20171214.fits')
pacs160 psf=fits.open('/Users/pdh21/Work/Astro/dmu products/dmu18/dmu18 Lockman-
SWIRE/dmu18 PACS 160 PSF Lockman-SWIRE 20171214.fits')
centre100=np.long((pacs100 psf[1].header['NAXIS1']-1)/2)
radius100=15
centre160=np.long((pacs160 psf[1].header['NAXIS1']-1)/2)
radius160=25
pind100=np.arange(0,radius100+1+radius100,1)*3600*np.abs(pacs100 psf[1].header[
'CDELT1'])/pixsize100 #get 100 scale in terms of pixel scale of map
pind160=np.arange(0,radius160+1+radius160,1)*3600*np.abs(pacs160 psf[1].header[
'CDELT1'])/pixsize160 #qet 160 scale in terms of pixel scale of map
# Divide by 1000 so that units are mJy
prior100.set_prf(pacs100_psf[1].data[centre100-radius100:centre100+radius100+1,c
entre100-radius100:centre100+radius100+1]/1000.0,
                pind100,pind100)
prior160.set prf(pacs160 psf[1].data[centre160-radius160:centre160+radius160+1,c
entre160-radius160:centre160+radius160+1]/1000.0,
                pind160,pind160)
```

In [30]:

```
mipsfits='/Users/pdh21/Work/Astro/dmu products/dmu26/data/Lockman-SWIRE/MIPS/wp4
lockman-swire mips24 map v1.0.fits.gz'
#----24-----
hdulist = fits.open(mipsfits)
im24phdu=hdulist[0].header
im24hdu=hdulist[1].header
im24=hdulist[1].data
nim24=hdulist[2].data
w 24 = wcs.WCS(hdulist[1].header)
pixsize24=3600.0*w 24.wcs.cdelt[1] #pixel size (in arcseconds)
hdulist.close()
# Point response information, at the moment its 2D Gaussian,
#pixsize array (size of pixels in arcseconds)
pixsize=np.array([pixsize24])
#point response function for the three bands
#Set prior classes
#---prior24-----
prior24=xidplus.prior(im24,nim24,im24phdu,im24hdu,moc=moc)#Initialise with map,
 uncertianty map, wcs info and primary header
prior24.prior cat(prior list['ra'],prior list['dec'],'photoz', z median=prior li
st['redshift']._get_data(), z_sig=prior_list['redshift_unc']._get_data(),ID=prio
r list['help id']) #Set input catalogue
prior24.prior bkg(0,2)#Set prior on background
```

In [31]:

```
##-----fit using seb's empiricall beam------
#----24------
hdulist = fits.open('/Users/pdh21/Work/Astro/dmu_products/dmu17/dmu17_Lockman-SW
IRE/data/dmu17_MIPS_Lockman-SWIRE_20171122.fits')
prf24=hdulist[1].data
centre=np.long((hdulist[1].header['NAXIS1']-1)/2)
radius=20
hdulist.close()

import scipy.ndimage
prior24.set_prf(prf24[centre-radius:centre+radius+1,centre-radius:centre+radius+1]/1.0E3,np.arange(0,41/2.0,0.5),np.arange(0,41/2.0,0.5))
```

In [32]:

```
prior100.get_pointing_matrix()
prior160.get_pointing_matrix()
prior24.get_pointing_matrix()
```

In [33]:

```
priors=[prior24,prior100,prior160,prior250,prior350,prior500]
```

In [34]:

xidplus.save([prior24,prior100,prior160,prior250,prior350,prior500],'None','./da
ta/priors/prior_XID+IR_SED_ESB_32_added_source_flag_gaia_removed_source')