
astrodatapy Documentation

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CONTENTS

I	AstroDataPy Documentation	3
1	AstroDataPy	7
2	Installation	9
3	Usage	11
4	Documentation	15
5	Features	17
6	License	19
7	Contributors	21
8	Examples	23

This is the documentation for astrodatapy. A collective framework of astronomical data.

Part I

AstroDataPy Documentation

This is the documentation for astrodatapy.

ASTRODATAPY

Python tools to collect astronomical data.

This is a python package dedicated to collect up-to-date astronomical data from both observational and modelling campaigns, with a focus on galaxy properties. Current package includes 1) statistical properties such as the number densities of galaxies (as functions of stellar mass, UV magnitude, star formation rate) and AGN (as functions of black hole mass, quasar UV/optical/bolometric luminosities); 2) correlations between galaxies properties such as the Magorrian relation, Tully Fisher relation, Disk size - stellar mass relation, and halo - stellar mass relation, etc; and 3) clustering of quasars such as the two point correlation function.

Current modelling results include DRAGONS (Meraxes).

INSTALLATION

```
$ pip install git+https://github.com/qyx268/astrodatapy
```


3.1 Example 1

read quasar two point correlation function at $z = 4$ with a redshift range of [3.5, 4.5]

```
>>> from astrodatapy.clustering import clustering
>>> obs = clustering(feature = 'QC_2PTCF', z_target = 4.0, z_tol = 0.5)
You are requesting QC_2PTCF at z_target=4.00 with a tolerance of z_tol=0.50 and h=1.000
quiet=True to silent
available data of QC_2PTCF includes:
Shen2007 Shen2009 He2018 Eftekharzadeh2015 Chehade2016 Retana-Montenegro2016

Loading observational data from He2018...
Filename /home/yqin/.local/lib/python3.6/site-packages/astrodatapy-0.0.dev29-py3.6.egg/
↪ astrodatapy/data//QC_2PTCF/z3pt8.dat
..done
>>> # show all available data of QC_2PTCF
>>> print(obs.available_observation)
['Shen2007' 'Shen2009' 'He2018' 'Eftekharzadeh2015' 'Chehade2016'
'Retana-Montenegro2016']
>>> # show redshifts of all available data of QC_2PTCF
>>> print(obs.z_available_observation)
[0.6 1.5 3.8 2.5 3.2 4.5]
>>> # show the target data of QC_2PTCF at z = 4
>>> print(obs.target_observation)
          DataType  FileName
↪Data
  Name
He2018 PowerLaw_2COMPONENTS z3pt8.dat [[0.10115794542598985, 6345.99167885821, 12459..
↪ .
```

3.2 Example 2

read Magorrian Relation at redshift 0, output with $h=0.678$, and do not show information

```
>>> from astrodatapy.correlation import correlation
>>> obs = correlation(feature = 'Magorrian', z_target = 0, quiet = 1, h = 0.678)
```

3.3 Example 3

plot galaxy stellar mass function at redshift 5 and show labels

```
>>> import matplotlib.pyplot as plt
>>> from astrodatapy.number_density import number_density
>>> colors      = ['#e41a1c', '#377eb8', '#4daf4a', '#984ea3', '#ff7f00', '#a65628', '#f781bf', '#999999'] * 4
>>> markers     = ['o', 's', 'v', '^', '<', '>', 'p', '*', 'D', '.', '8'] * 4
>>> linestyle   = ['-', '--', '-.', ':']
>>>
>>> z           = 5.0
>>> obs = number_density(feature = 'GSMF', z_target = 5.0, quiet = 1, h=0.678)
>>>
>>> j_data = 0
>>> k_func = 0
>>> fig, ax = plt.subplots(1, 1)
>>> for ii in range(obs.n_target_observation):
>>>     data      = obs.target_observation['Data'][ii]
>>>     label     = obs.target_observation.index[ii]
>>>     datatype  = obs.target_observation['DataType'][ii]
>>>     color     = colors[ii]
>>>     marker    = markers[j_data]
>>>     linestyle = linestyle[k_func]
>>>     data[:,1:] = np.log10(data[:,1:])
>>>     if datatype == 'data':
>>>         ax.errorbar(data[:,0], data[:,1], yerr = [data[:,1]-data[:,3], data[:,2]-data[:,1]],\
>>>                    label=label, color=color, fmt=marker)
>>>         j_data += 1
>>>     elif datatype == 'dataULimit':
>>>         ax.errorbar(data[:,0], data[:,1], yerr = -0.2*data[:,1], uplims=True,\
>>>                    label=label, color=color, fmt=marker)
>>>         j_data += 1
>>>     else:
>>>         ax.plot(data[:,0], data[:,1], label=label, color=color, linestyle=linestyle, lw=3)
>>>         ax.fill_between(data[:,0], data[:,2], data[:,3], color=color, alpha=0.5)
>>>         k_func += 1
>>>
>>> ax.set_xlim(7, 13)
>>> ax.set_ylim(-7, -0.5)
>>> ax.text(0.95, 0.95, "z=%.2f"%z, horizontalalignment='right',\
>>>         verticalalignment='top', transform=ax.transAxes)
>>> leg = ax.legend(loc='lower left')
```

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```
>>> leg.get_frame().set_alpha(0.5)
>>> ax.set_xlabel(r"$\log_{10}[M_*/{\rm M_{\odot}}]$" )
>>> ax.set_ylabel(r"$\log_{10}[{\rm \phi/Mpc^{-3} dex^{-1}}]$" )
>>> plt.savefig('./GSMF.png',bbox_inches='tight')
```



astrodatapy/docs/astrodatapy/GSMF.png

More examples can be found in [this jupyter notebook](#).

DOCUMENTATION

<http://astrodatapy.readthedocs.io>

FEATURES

5.1 Number density

Features	Descriptions
BHM	Black Hole Mass
BHMF	Black Hole Mass Function
GLF_UV	Galaxy Luminosity Function – UV
GSMF	Galaxy Stellar Mass Function – all
GSMF_Blue	Galaxy Stellar Mass Function – blue
GSMF_Bulge	Galaxy Stellar Mass Function – bulge
GSMF_Disk	Galaxy Stellar Mass Function – disk
GSMF_Quiescent	Galaxy Stellar Mass Function – quiescent
GSMF_Red	Galaxy Stellar Mass Function – red
QLF_bolometric	Quasar Luminosity Function – bolometric
QLF_optical	Quasar Luminosity Function – optical
QLF_UV	Quasar Luminosity Function – UV
SFRF	Star Formation Rate Function

5.2 Correlation

Features	Descriptions
BHM	Black Hole Mass
Magorrian	Black Hole - Galaxy Bulge Mass Scaling Relation
Tully_Fisher	Mass - Velocity of Spiral Galaxies
DiskSize_StellarMass	DiskSize - StellarMass
GasFraction_StellarMass	GasFraction - StellarMass
sSFR_StellarMass_Blue	sSFR - StellarMass – blue
HaloMass_StellarMass	HaloMass - StellarMass
HaloMass_StellarMass_Blue	HaloMass - StellarMass – blue
HaloMass_StellarMass_Red	HaloMass - StellarMass – red

5.3 Clustering

Features	Descriptions
QC_2PTCF	Quasar Clustering – 2 point correlation function

LICENSE

- Free software: BSD license
- This project is Copyright (c) Yuxiang Qin and licensed under the terms of the BSD 3-Clause license. See the licenses folder for more information.

CONTRIBUTORS

- Yuxiang Qin (The University of Melbourne)

EXAMPLES

Table of Contents

1 GSMF

1.1 example

1.2 all

1.3 Blue & Red

1.4 Disk & Bulge

1.5 Quiescent

2 SFRF

3 GLF

3.1 UV

4 BHMF

4.1 local

4.2 Shen et al. 2012

4.3 DRAGONS

5 QLF

5.1 UV

5.2 optical B

5.3 Bolometric

6 Magorrian Relation

7 Tully_Fisher Relation

8 DiskSize_StellarMass

9 GasFraction_StellarMass

10 sSFR_StellarMass

10.1 Blue

11 HaloMass_StellarMass

11.1 all & Blue & Red

12 QC_2PTCF

```
[1]: import matplotlib
      %matplotlib inline
      import matplotlib.pyplot as plt
      from matplotlib.colors import LogNorm
      from astrodatapy.number_density import number_density
      from astrodatapy.correlation import correlation
      from astrodatapy.clustering import clustering

      cosmo = {'omega_M_0' : 0.308,
               'omega_lambda_0' : 0.692,
               'omega_b_0' : 0.04839912,
               'omega_n_0' : 0.0,
               'N_nu' : 0,
               'h' : 0.678,
               'n' : 0.968,
               'sigma_8' : 0.815
              }

      plt.rc('font', size=15)           # controls default text sizes
      plt.rc('axes', titlesize=15)      # fontsize of the axes title
      plt.rc('axes', labelsiz=15)       # fontsize of the x and y labels
      plt.rc('xtick', labelsiz=12)      # fontsize of the tick labels
      plt.rc('ytick', labelsiz=12)      # fontsize of the tick labels
      plt.rc('legend', fontsize=12)     # legend fontsize

      colors = ['#e41a1c', '#377eb8', '#4daf4a', '#984ea3', \
               '#ff7f00', '#a65628', '#f781bf', '#999999']*4
      color_maps = ['Reds', 'Blues', 'Greens'] *4
      markers = ['o', 's', 'v', '^', '<', '>', 'p', '*', 'D', '.', '8']*4
      linestyle = ['-', '--', '-.', ':']*4
```

8.1 GSMF

Galaxy Stellar Mass Function

8.1.1 example

```
[2]: obs = number_density(feature='GSMF', z_target=5.0, h=cosmo['h'])
      print("Available Observations:")
      obs.info

      You are requesting GSMF at z_target=5.00 with a tolerance of z_tol=0.25 and h=0.678
      quiet=True to silent
      available data of GSMF includes:
      Bell2003 Cole2001 Drory2009 Marchesini2009 Mortlock2011 Stefanon2017 Thanjavur2016_
      ↪Grazian2015 Gonzalez2011 Duncan2014 Katsianis2015 Song2016 Davidzon2017 Santini2012_
      ↪Ilbert2013 Muzzin2013 Huertas-Company2016 Tomczak2014 Pozzetti2007 Baldry2012 Caputi2011_
      ↪Kajisawa2009 Perez-Gonzalez2008 Pozzetti2010 Yang2009 Qin2017_Tiamat Qin2017_Tiamat125_HR

      Loading observational data from Stefanon2017...
```

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```

Filename /home/yqin/3rd_party/lib/python3.6/site-packages/astrodatapy-0.0.dev23-py3.6.egg/
↳astrodatapy/data//GSMF/z5pt0.dat
Converting IMF from Chabrier to Salpeter
WARNING! No Infomation about MAG, dafault is Salpeter
Converting the Errors from ULDeltas to Upper Lower Limits
Converting the Normalization of Phi from 1.00e-05 to 1
Converting x axis from h=0.700 to h=0.678 with a power of -2 because it is GSMF
Converting y axis from h=0.700 to h=0.678 with a power of 3
..done

```

```

Loading observational data from Grazian2015. . .
Filename /home/yqin/3rd_party/lib/python3.6/site-packages/astrodatapy-0.0.dev23-py3.6.egg/
↳astrodatapy/data//GSMF/z5pt0.dat
WARNING! No Infomation about MAG, dafault is Salpeter
Converting x axis from h=0.700 to h=0.678 with a power of -2 because it is GSMF
Converting y axis from h=0.700 to h=0.678 with a power of 3
..done

```

```

Loading observational data from Gonzalez2011. . .
Filename /home/yqin/3rd_party/lib/python3.6/site-packages/astrodatapy-0.0.dev23-py3.6.egg/
↳astrodatapy/data//GSMF/z5pt0.dat
WARNING! No Infomation about MAG, dafault is Salpeter
Converting the Errors from LUDeltas to Upper Lower Limits
Converting Phi from logarithm to linear
Converting x axis from h=1.000 to h=0.678 with a power of -2 because it is GSMF
Converting y axis from h=1.000 to h=0.678 with a power of 3
..done

```

```

Loading observational data from Duncan2014. . .
Filename /home/yqin/3rd_party/lib/python3.6/site-packages/astrodatapy-0.0.dev23-py3.6.egg/
↳astrodatapy/data//GSMF/z5pt0.dat
Converting IMF from Chabrier to Salpeter
WARNING! No Infomation about MAG, dafault is Salpeter
Converting the Errors from LUDeltas to Upper Lower Limits
Converting x axis from h=0.700 to h=0.678 with a power of -2 because it is GSMF
Converting y axis from h=0.700 to h=0.678 with a power of 3
..done

```

```

Loading observational data from Katsianis2015. . .
Filename /home/yqin/3rd_party/lib/python3.6/site-packages/astrodatapy-0.0.dev23-py3.6.egg/
↳astrodatapy/data//GSMF/z5pt0.dat
WARNING! No Infomation about MAG, dafault is Salpeter
Converting the Errors from Delta to Upper Lower Limits
Converting Phi from logarithm to linear
Converting x axis from h=0.702 to h=0.678 with a power of -2 because it is GSMF
Converting y axis from h=0.702 to h=0.678 with a power of 3
..done

```

```

Loading observational data from Song2016. . .
Filename /home/yqin/3rd_party/lib/python3.6/site-packages/astrodatapy-0.0.dev23-py3.6.egg/
↳astrodatapy/data//GSMF/z5pt0.dat
WARNING! No Infomation about MAG, dafault is Salpeter

```

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```

Converting the Errors from ULDeltas to Upper Lower Limits
Converting Phi from logarithm to linear
Converting x axis from h=0.700 to h=0.678 with a power of -2 because it is GSMF
Converting y axis from h=0.700 to h=0.678 with a power of 3
..done

Loading observational data from Davidzon2017. . .
Filename /home/yqin/3rd_party/lib/python3.6/site-packages/astrodatapy-0.0.dev23-py3.6.egg/
↳astrodatapy/data//GSMF/z5pt0.dat
Using Schechter Function for Mass
Converting IMF from Chabrier to Salpeter
WARNING! No Infomation about MAG, dafault is Salpeter
Converting x axis from h=0.700 to h=0.678 with a power of -2 because it is GSMF
Converting y axis from h=0.700 to h=0.678 with a power of 3
..done

Loading observational data from Qin2017_Tiamat. . .
Filename /home/yqin/3rd_party/lib/python3.6/site-packages/astrodatapy-0.0.dev23-py3.6.egg/
↳astrodatapy/data//GSMF/z5pt00.dat
WARNING! No Infomation about MAG, dafault is Salpeter
Converting the Errors from Delta to Upper Lower Limits
Converting x axis from h=0.678 to h=0.678 with a power of -2 because it is GSMF
Converting y axis from h=0.678 to h=0.678 with a power of 3
..done

Loading observational data from Qin2017_Tiamat125_HR. . .
Filename /home/yqin/3rd_party/lib/python3.6/site-packages/astrodatapy-0.0.dev23-py3.6.egg/
↳astrodatapy/data//GSMF/z5pt00.dat
WARNING! No Infomation about MAG, dafault is Salpeter
Converting the Errors from Delta to Upper Lower Limits
Converting x axis from h=0.678 to h=0.678 with a power of -2 because it is GSMF
Converting y axis from h=0.678 to h=0.678 with a power of 3
..done
Available Observations:

```

[2]:

	IMF	h	NormalizationOfPhi	Errors	Log	\
#Name						
Bell2003	DietSalpeter	1.000	1.00000	LULimits	0	
Cole2001	Salpeter	1.000	1.00000	Delta	0	
Drory2009	Chabrier	0.700	1.00000	Delta	1	
Marchesini2009	Kroupa	0.700	1.00000	ULDeltas	1	
Mortlock2011	Salpeter	0.700	1.00000	Delta	1	
Stefanon2017	Chabrier	0.700	0.00001	ULDeltas	0	
Thanjavur2016	Chabrier	0.700	1.00000	ULDeltas	1	
Grazian2015	Salpeter	0.700	1.00000	ULLimits	0	
Gonzalez2011	Salpeter	1.000	1.00000	LUDeltas	1	
Duncan2014	Chabrier	0.700	1.00000	LUDeltas	0	
Katsianis2015	Salpeter	0.702	1.00000	Delta	1	
Song2016	Salpeter	0.700	1.00000	ULDeltas	1	
Davidzon2017	Chabrier	0.700	1.00000	None	0	
Santini2012	Salpeter	0.700	1.00000	None	0	
Ilbert2013	Chabrier	0.700	1.00000	None	0	

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Muzzin2013	Kroupa	0.700	1.00000	None	0
Huertas-Company2016	Chabrier	0.700	1.00000	None	0
Tomczak2014	Chabrier	0.700	1.00000	ULDeltas	1
Pozzetti2007	Chabrier	0.700	1.00000	None	0
Baldry2012	Chabrier	0.678	1.00000	ULDeltas	1
Caputi2011	Chabrier	0.678	1.00000	ULDeltas	1
Kajisawa2009	Chabrier	0.678	1.00000	ULDeltas	1
Perez-Gonzalez2008	Chabrier	0.678	1.00000	ULDeltas	1
Pozzetti2010	Chabrier	0.678	1.00000	ULDeltas	1
Yang2009	Chabrier	0.678	1.00000	ULDeltas	1
Qin2017_Tiamat	Salpeter	0.678	1.00000	Delta	0
Qin2017_Tiamat125_HR	Salpeter	0.678	1.00000	Delta	0

	HinPhi	Type	Bibliographic
#Name			
Bell2003	0	data	2012MNRAS.421..621B
Cole2001	0	data	2001MNRAS.326..255C
Drory2009	0	data	2009ApJ...707.1595D
Marchesini2009	0	data	2009ApJ...701.1765M
Mortlock2011	0	data	2011MNRAS.413.2845M
Stefanon2017	0	data	2017ApJ...843...36S
Thanjavur2016	0	data	2016MNRAS.459...44T
Grazian2015	0	data	2015A&A...575A..96G
Gonzalez2011	0	data	2011ApJ...735L..34G
Duncan2014	0	data	2014MNRAS.444.2960D
Katsianis2015	0	data_sim	2015MNRAS.448.3001K
Song2016	0	data	2016ApJ...825...5S
Davidzon2017	0	Schechter	2017A&A...605A..70D
Santini2012	0	Schechter	2012A&A...538A..33S
Ilbert2013	0	Schechter	2013A&A...556A..55I
Muzzin2013	0	Schechter	2013ApJ...777...18M
Huertas-Company2016	0	Schechter	2016MNRAS.462.4495H
Tomczak2014	0	data	2014ApJ...783...85T
Pozzetti2007	0	Schechter	2007A&A...474..443P
Baldry2012	0	data	2012MNRAS.421..621B
Caputi2011	0	data	2011MNRAS.413..162C
Kajisawa2009	0	data	2009ApJ...702.1393K
Perez-Gonzalez2008	0	data	2008ApJ...675..234P
Pozzetti2010	0	data	2010A&A...523A..13P
Yang2009	0	data	2009ApJ...695..900Y
Qin2017_Tiamat	0	data_sim	2017MNRAS.472.2009Q
Qin2017_Tiamat125_HR	0	data_sim	2017MNRAS.472.2009Q

```
[3]: print("Target Observations:")
obs.target_observation
```

Target Observations:

```
[3]:
```

	DataType	FileName	\
Name			
Stefanon2017	data	z5pt0.dat	
Grazian2015	data	z5pt0.dat	
Gonzalez2011	data	z5pt0.dat	

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Duncan2014	data	z5pt0.dat
Katsianis2015	data_sim	z5pt0.dat
Song2016	data	z5pt0.dat
Davidzon2017	Schechter	z5pt0.dat
Qin2017_Tiamat	data_sim	z5pt00.dat
Qin2017_Tiamat125_HR	data_sim	z5pt00.dat

Name	Data
Stefanon2017	[[10.963009197397692, 8.632141819241988e-06, 2. . .
Grazian2015	[[9.097736692294387, 0.005088420440816329, 0.0. . .
Gonzalez2011	[[7.870060612265873, 0.001921715449346003, 0.0. . .
Duncan2014	[[9.002009197397692, 0.009041032747521872, 0.0. . .
Katsianis2015	[[7.825874836525483, 0.015909910816851603, 0.0. . .
Song2016	[[7.277736692294387, 0.03078895589910497, 0.05. . .
Davidzon2017	[[9.283009197397693, 0.0022312861848298765, 0. . .
Qin2017_Tiamat	[[7.05, 0.44436000000000025, 0.446467980000000. . .
Qin2017_Tiamat125_HR	[[7.05, 0.042807000000000026, 0.04306835900000. . .

8.1.2 all

```
[4]: feature = 'GSMF'
xlim    = (7, 13)
ylim    = (-7, -0.5)
xlabel   = r"$\log_{10}[M_{\odot}]$"
ylabel   = r"$\log_{10}[\phi/\text{Mpc}^{-3} \text{ dex}^{-1}]$"
zs       = [7, 5, 4, 2, 1.75, 1.3, 1.0, 0.6, 0.0]

for z in zs:
    fig, ax = plt.subplots(1, 1)
    obs = number_density(feature=feature, z_target=z, quiet=1, h=cosmo['h'])
    j_data = 0
    k_func = 0
    for ii in range(obs.n_target_observation):
        data = obs.target_observation['Data'][ii]
        label = obs.target_observation.index[ii]
        datatype = obs.target_observation['DataType'][ii]
        color = colors[ii]
        marker = markers[j_data]
        linestyle = linestyles[k_func]
        data[:, 1:] = np.log10(data[:, 1:])
        if datatype == 'data':
            ax.errorbar(data[:, 0], data[:, 1], yerr = [data[:, 1]-data[:, 3], data[:, 2]-data[:,
→ 1]], \
                        label=label, color=color, fmt=marker)
            j_data += 1
        elif datatype == 'dataULimit':
            ax.errorbar(data[:, 0], data[:, 1], yerr = -0.2*data[:, 1], uplims=True, \
                        label=label, color=color, fmt=marker)
            j_data += 1
```

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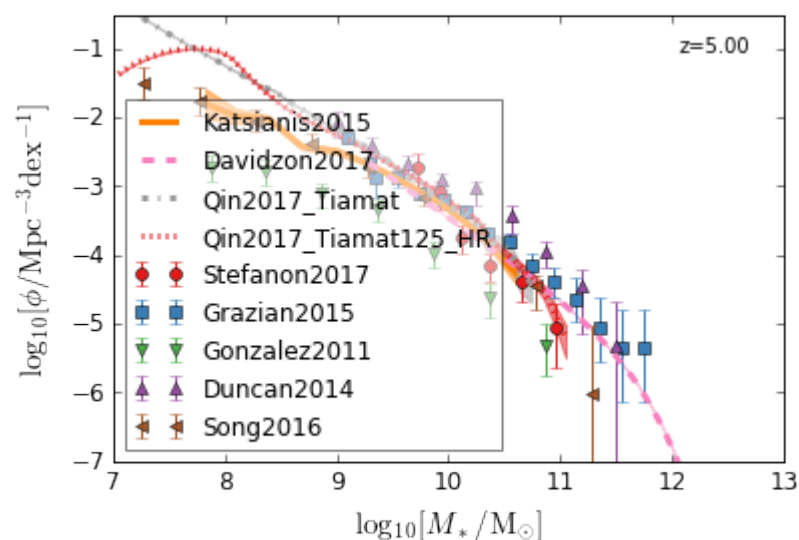
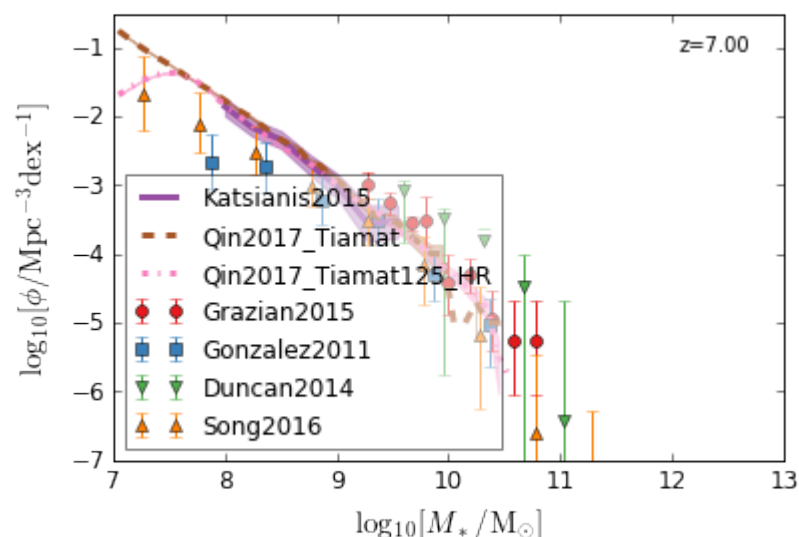
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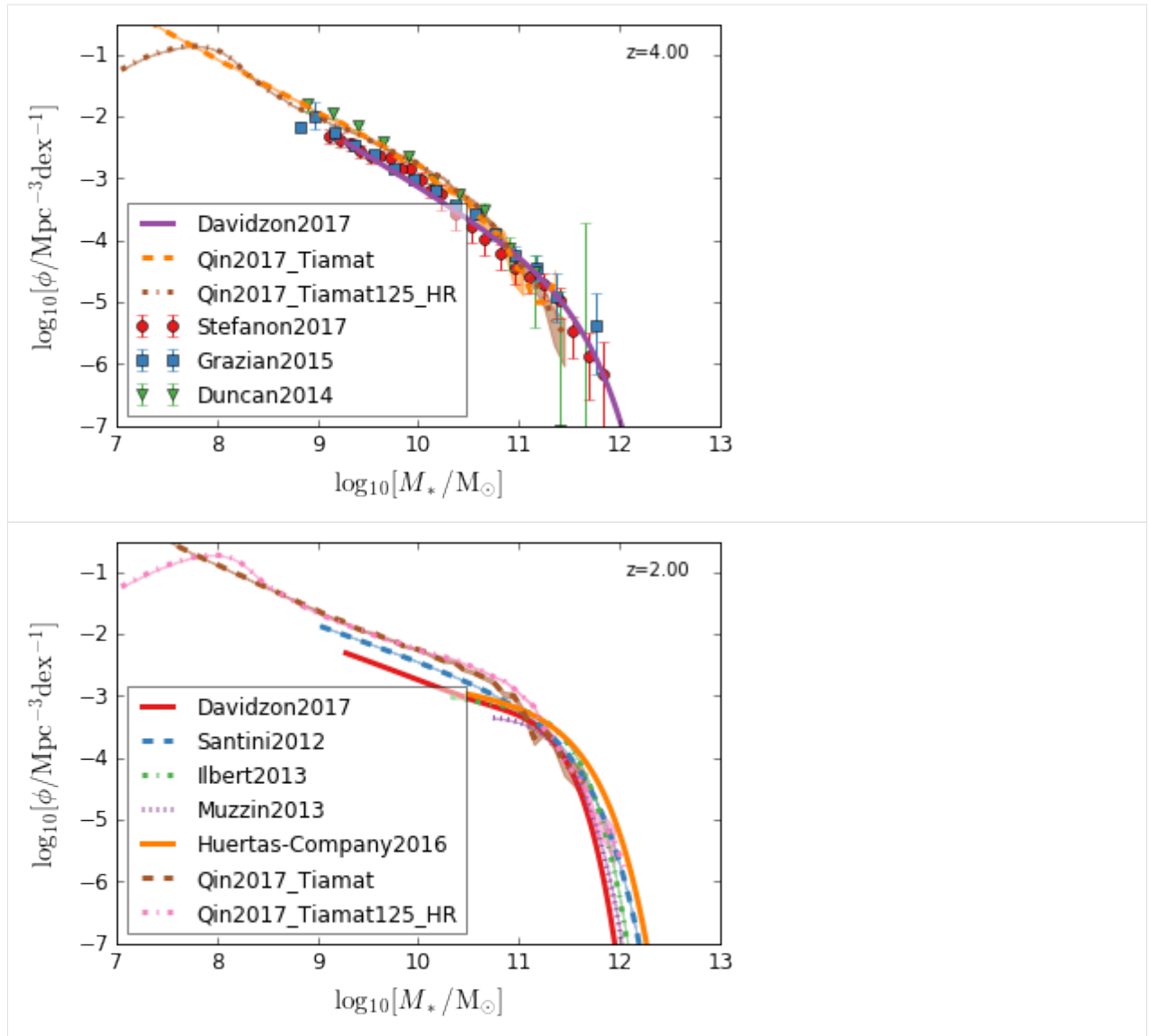
```

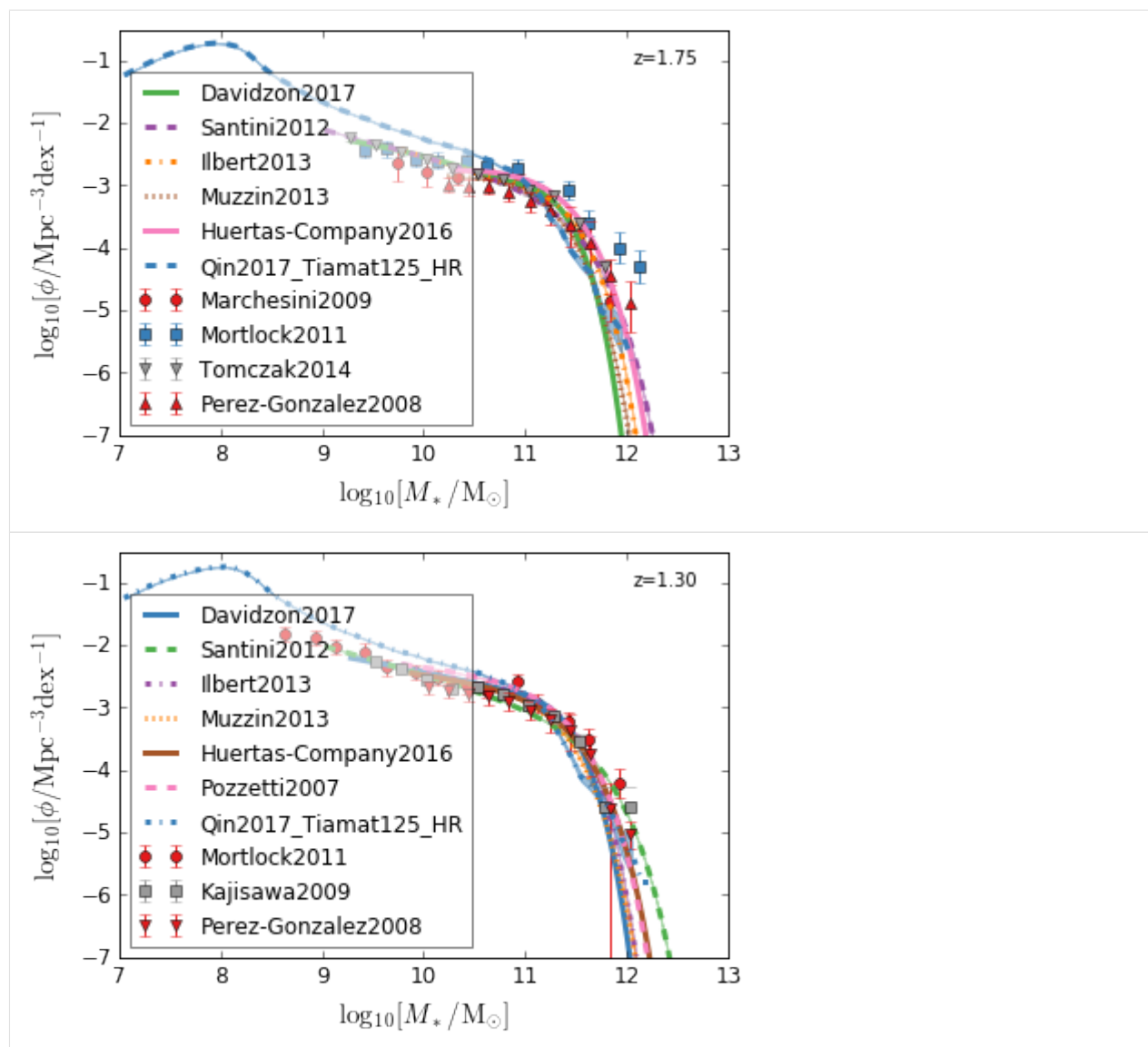
else:
    ax.plot(data[:,0],data[:,1],label=label,color=color,linestyle=linestyle,lw=3)
    ax.fill_between(data[:,0], data[:,2],data[:,3],color=color,alpha=0.5)
    k_func +=1

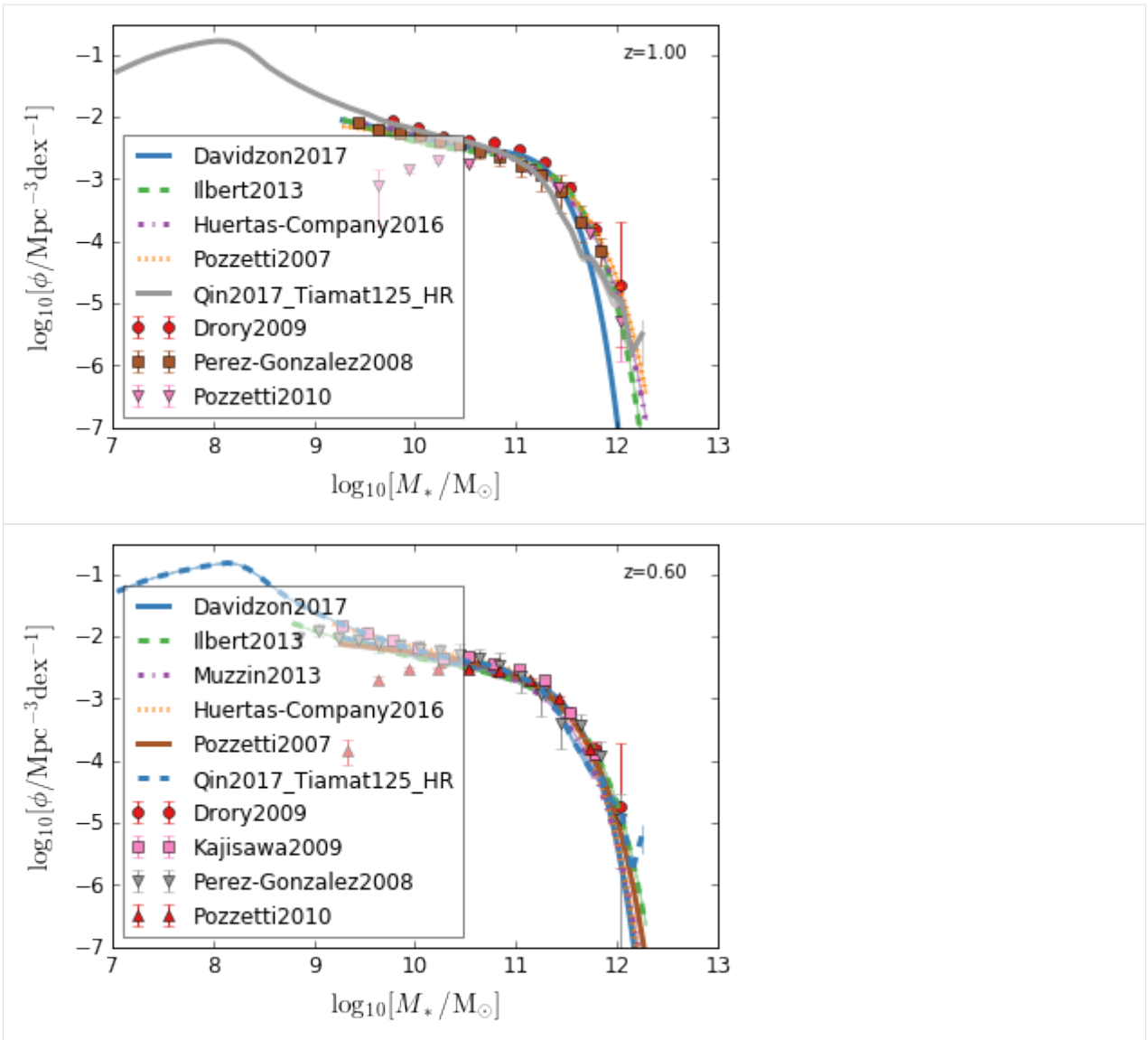
ax.set_xlim(xlim)
ax.set_ylim(ylim)
ax.text(0.95,0.95, "z=%.2f"%z,horizontalalignment='right',\
        verticalalignment='top',transform=ax.transAxes)
leg = ax.legend(loc='lower left')
leg.get_frame().set_alpha(0.5)
ax.set_xlabel(xlabel)
ax.set_ylabel(ylabel)
    
```

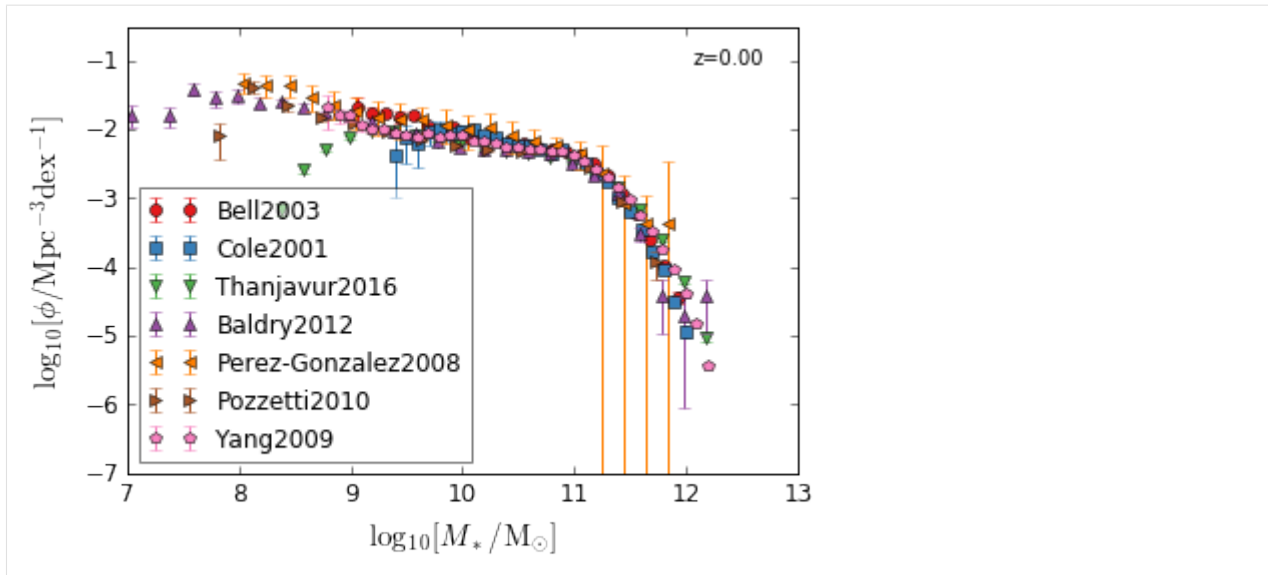
/home/yqin/3rd_party/lib/python3.6/site-packages/ipykernel_launcher.py:20: RuntimeWarning:
 divide by zero encountered in log10











8.1.3 Blue & Red

```
[5]: features = ['GSMF_Blue', 'GSMF_Red']
xlim    = (7, 13)
ylim    = (-7, -0.5)
xlabel   = r"$\log_{10}[M_*/{\rm M_{\odot}}]$"
ylabel   = r"$\log_{10}[\rm \phi/Mpc^{-3} dex^{-1}]$"
zs      = [2.0, 0.0]

for z in [2.0, 0.0]:
    fig, ax = plt.subplots(1, 1)
    for feature, color in zip(features, ['Blue', 'Red']):
        obs = number_density(feature=feature, z_target=z, quiet=1, h=cosmo['h'])
        for ii in range(obs.n_target_observation):
            data      = obs.target_observation['Data'][ii]
            label     = obs.target_observation.index[ii]
            datatype  = obs.target_observation['DataType'][ii]
            marker    = markers[ii]
            data[:, 1:] = np.log10(data[:, 1:])
            ax.errorbar(data[:, 0], data[:, 1], yerr = [data[:, 1]-data[:, 3], data[:, 2]-data[:,
→ 1]], \
                        label=label, color=color, fmt=marker)
```

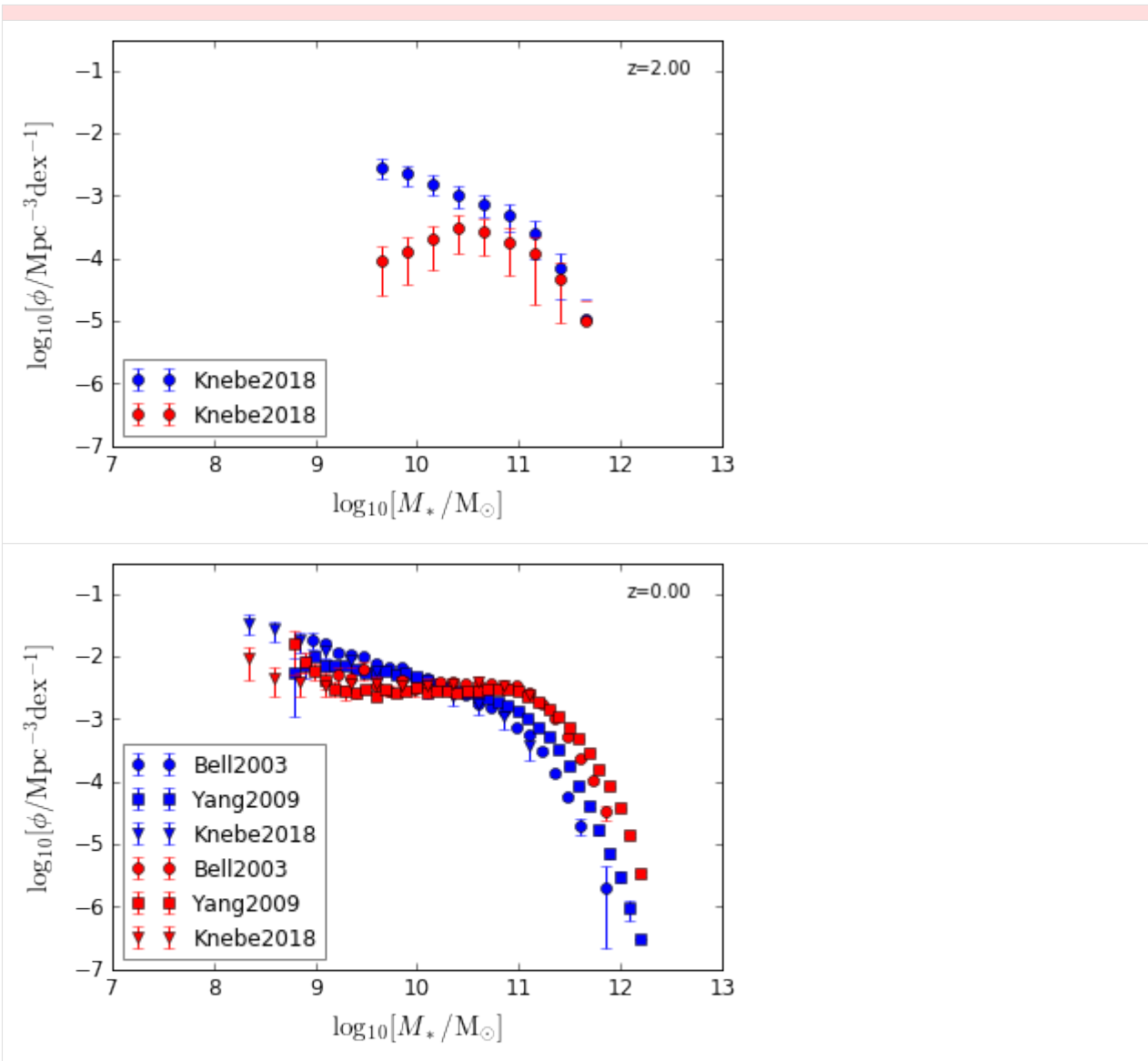
```
ax.set_xlim(xlim)
ax.set_ylim(ylim)
ax.text(0.95, 0.95, "z=%.2f"%z, horizontalalignment='right', \
        verticalalignment='top', transform=ax.transAxes)
leg = ax.legend(loc='lower left')
leg.get_frame().set_alpha(0.5)
ax.set_xlabel(xlabel)
ax.set_ylabel(ylabel)
```

/home/yqin/3rd_party/lib/python3.6/site-packages/ipykernel_launcher.py:17: RuntimeWarning: _

→ divide by zero encountered in log10

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8.1.4 Disk & Bulge

```
[6]: features = ['GSMF_Disk', 'GSMF_Bulge']
xlim      = (7, 13)
ylim      = (-7, -0.5)
xlabel     = r"$\log_{10}[M_*/{\rm M_{\odot}}]$"
ylabel     = r"$\log_{10}[\rm \phi/Mpc^{-3} dex^{-1}]$"
zs        = [2.0, 0.0]

for z in [0.0,]:
    fig, ax = plt.subplots(1, 1)
    for feature, color in zip(features, ['Blue', 'Red']):
        obs = number_density(feature=feature, z_target=z, quiet=1, h=cosmo['h'])
```

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```

for ii in range(obs.n_target_observation):
    data      = obs.target_observation['Data'][ii]
    label     = obs.target_observation.index[ii]
    datatype  = obs.target_observation['DataType'][ii]
    marker    = markers[ii]
    data[:,1:] = np.log10(data[:,1:])
    ax.errorbar(data[:,0], data[:,1], yerr = [data[:,1]-data[:,3],data[:,2]- data[:,
→1]],\
                label=label,color=color,fmt=marker)

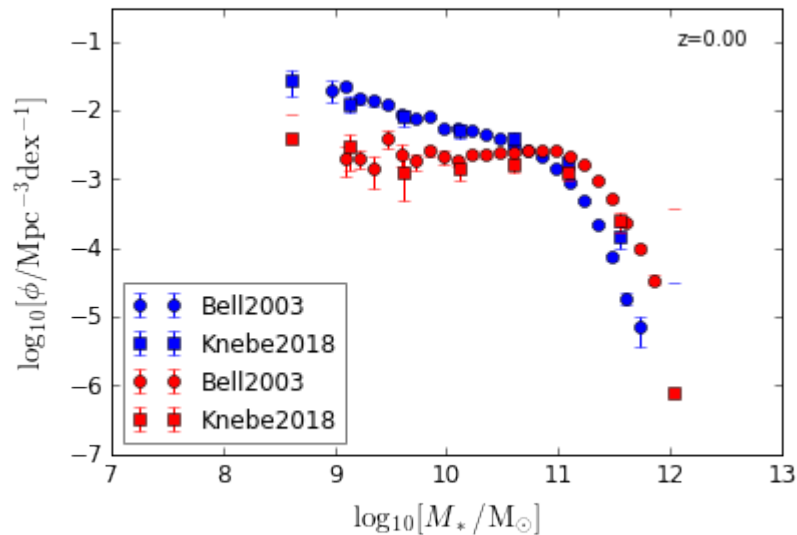
ax.set_xlim(xlim)
ax.set_ylim(ylim)
ax.text(0.95,0.95, "z=%.2f"%z,horizontalalignment='right',\
        verticalalignment='top',transform=ax.transAxes)
leg = ax.legend(loc='lower left')
leg.get_frame().set_alpha(0.5)
ax.set_xlabel(xlabel)
ax.set_ylabel(ylabel)

```

```

/home/yqin/3rd_party/lib/python3.6/site-packages/ipykernel_launcher.py:17: RuntimeWarning:
→divide by zero encountered in log10

```



8.1.5 Quiescent

```

[7]: feature = 'GSMF_Quiescent'
xlim      = (7, 13)
ylim      = (-7, -0.5)
xlabel    = r"$\log_{10}[M_{*}/M_{\odot}]$"
ylabel    = r"$\log_{10}[\phi/\text{Mpc}^{-3} \text{ dex}^{-1}]$"
zs        = [2.75,2.25,1.75]

for z in zs:
    fig,ax = plt.subplots(1,1)

```

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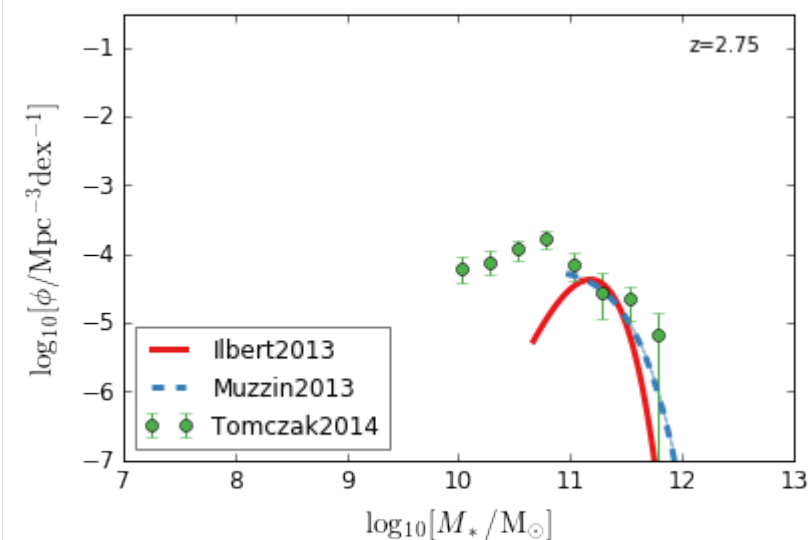
(continued from previous page)

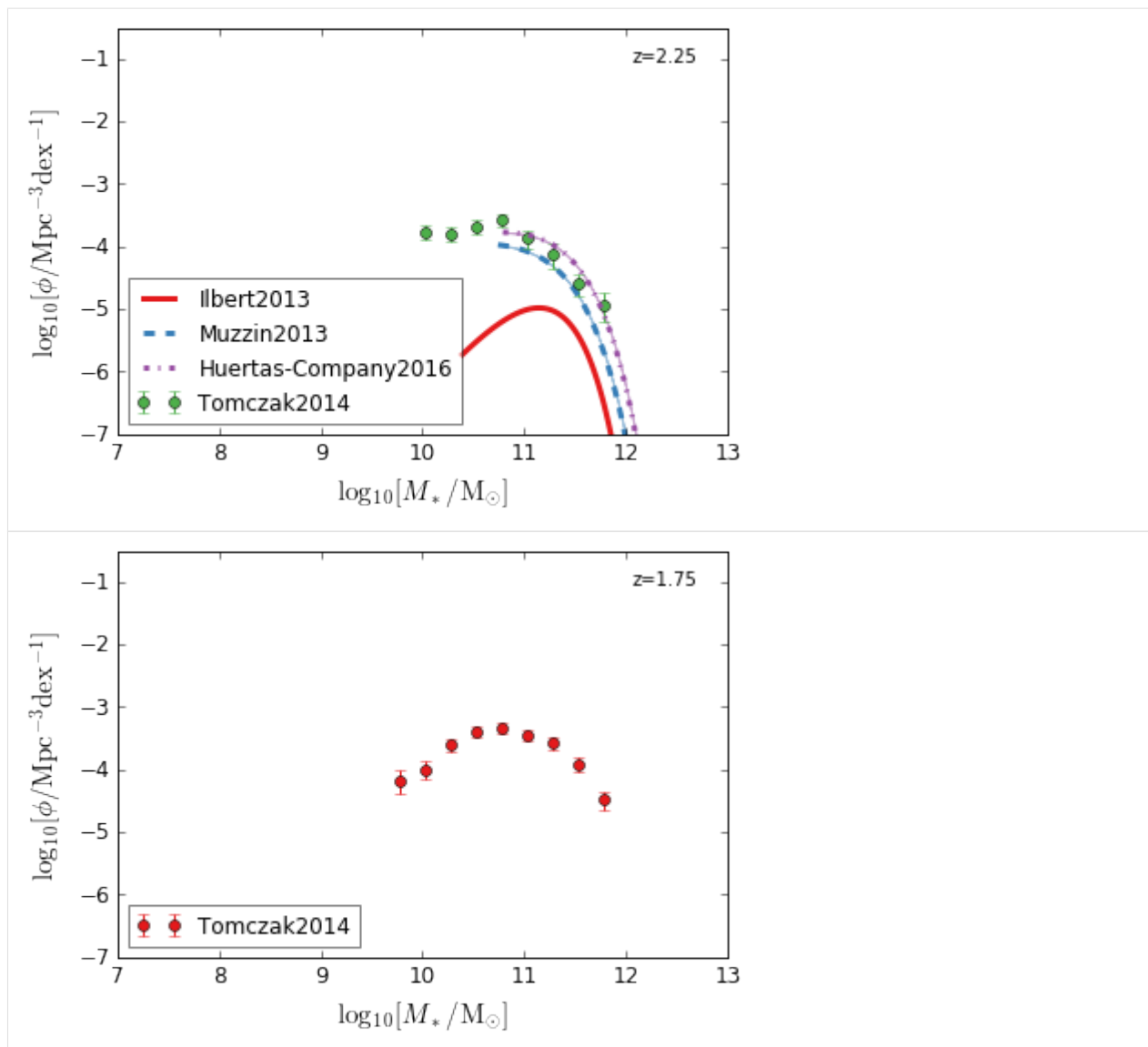
```

obs    = number_density(feature=feature,z_target=z,quiet=1,h=cosmo['h'])
j_data = 0
k_func = 0
for ii in range(obs.n_target_observation):
    data      = obs.target_observation['Data'][ii]
    label     = obs.target_observation.index[ii]
    datatype  = obs.target_observation['DataType'][ii]
    color     = colors[ii]
    marker    = markers[j_data]
    linestyle = linestyles[k_func]
    data[:,1:] = np.log10(data[:,1:])
    if datatype == 'data':
        ax.errorbar(data[:,0], data[:,1], yerr = [data[:,1]-data[:,3],data[:,2]- data[:,
→1]],\
                    label=label,color=color,fmt=marker)
        j_data +=1
    elif datatype == 'dataULimit':
        ax.errorbar(data[:,0], data[:,1], yerr = -0.2*data[:,1], uplims=True,\
                    label=label,color=color,fmt=marker)
        j_data +=1
    else:
        ax.plot(data[:,0],data[:,1],label=label,color=color,linestyle=linestyle,lw=3)
        ax.fill_between(data[:,0], data[:,2],data[:,3],color=color,alpha=0.5)
        k_func +=1

ax.set_xlim(xlim)
ax.set_ylim(ylim)
ax.text(0.95,0.95, "z=%0.2f"%z,horizontalalignment='right',\
        verticalalignment='top',transform=ax.transAxes)
leg = ax.legend(loc='lower left')
leg.get_frame().set_alpha(0.5)
ax.set_xlabel(xlabel)
ax.set_ylabel(ylabel)

```





8.2 SFRF

Star Formation Rate Function

```
[8]: feature = 'SFRF'
     xlim    = (-1, 3)
     ylim    = (-6, -1)
     xlabel  = r"$\log_{10}[\rm SFR/M_{\odot} \, yr^{-1}]$"
     ylabel  = r"$\log_{10}[\rm \phi/Mpc^{-3} \, dex^{-1}]$"
     zs      = [7,6,5,4]

     for z in zs:
         fig,ax = plt.subplots(1,1)
         obs     = number_density(feature=feature,z_target=z,quiet=1,h=cosmo['h'])
```

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```

j_data = 0
k_func = 0
for ii in range(obs.n_target_observation):
    data      = obs.target_observation['Data'][ii]
    label     = obs.target_observation.index[ii]
    datatype  = obs.target_observation['DataType'][ii]
    color     = colors[ii]
    marker    = markers[j_data]
    linestyle = linestyle[k_func]
    data[:,1:] = np.log10(data[:,1:])
    if datatype == 'data':
        ax.errorbar(data[:,0], data[:,1], yerr = [data[:,1]-data[:,3],data[:,2]- data[:,
↪1]],\
                    label=label,color=color,fmt=marker)
        j_data +=1
    elif datatype == 'dataULimit':
        ax.errorbar(data[:,0], data[:,1], yerr = -0.2*data[:,1], uplims=True,\
                    label=label,color=color,fmt=marker)
        j_data +=1
    else:
        ax.plot(data[:,0],data[:,1],label=label,color=color,linestyle=linestyle,lw=3)
        ax.fill_between(data[:,0], data[:,2],data[:,3],color=color,alpha=0.5)
        k_func +=1

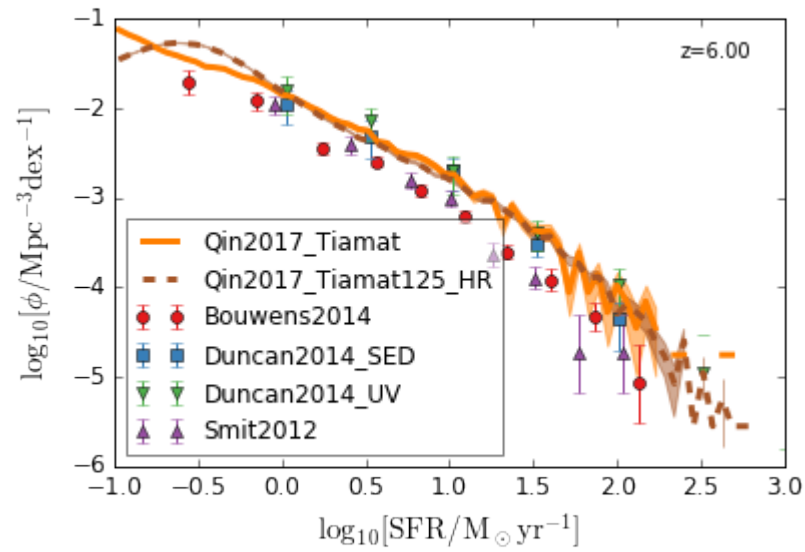
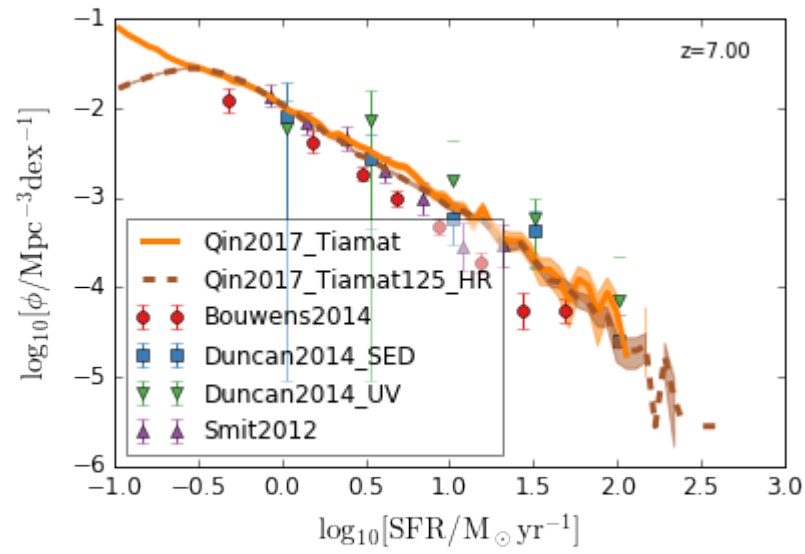
ax.set_xlim(xlim)
ax.set_ylim(ylim)
ax.text(0.95,0.95, "z=%.2f"%z,horizontalalignment='right',\
        verticalalignment='top',transform=ax.transAxes)
leg = ax.legend(loc='lower left')
leg.get_frame().set_alpha(0.5)
ax.set_xlabel(xlabel)
ax.set_ylabel(ylabel)

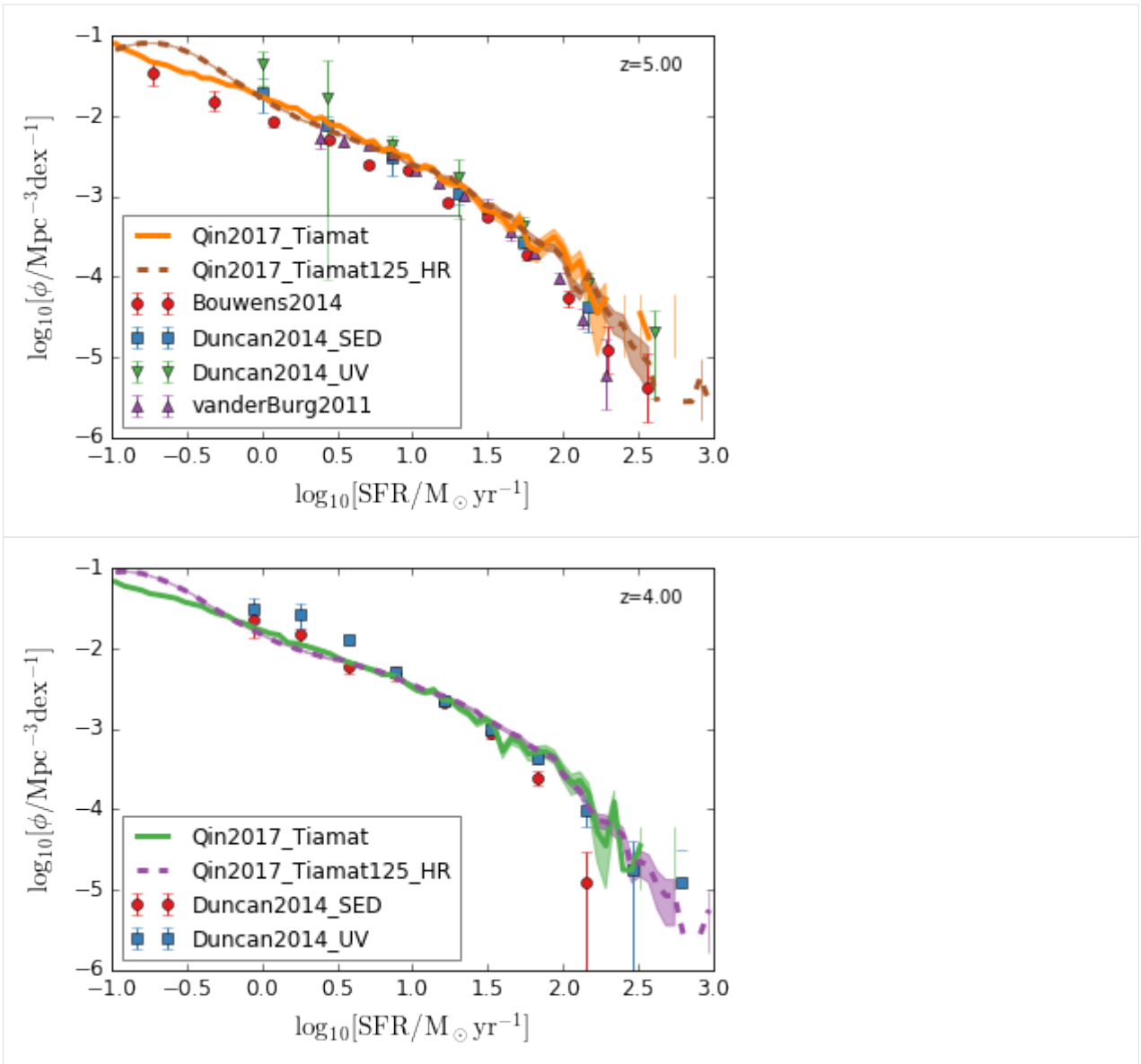
```

```

/home/yqin/3rd_party/lib/python3.6/site-packages/ipykernel_launcher.py:20: RuntimeWarning:
↪divide by zero encountered in log10
/home/yqin/3rd_party/lib/python3.6/site-packages/ipykernel_launcher.py:22: RuntimeWarning:
↪invalid value encountered in subtract

```





8.3 GLF

Galaxy Luminosity Function

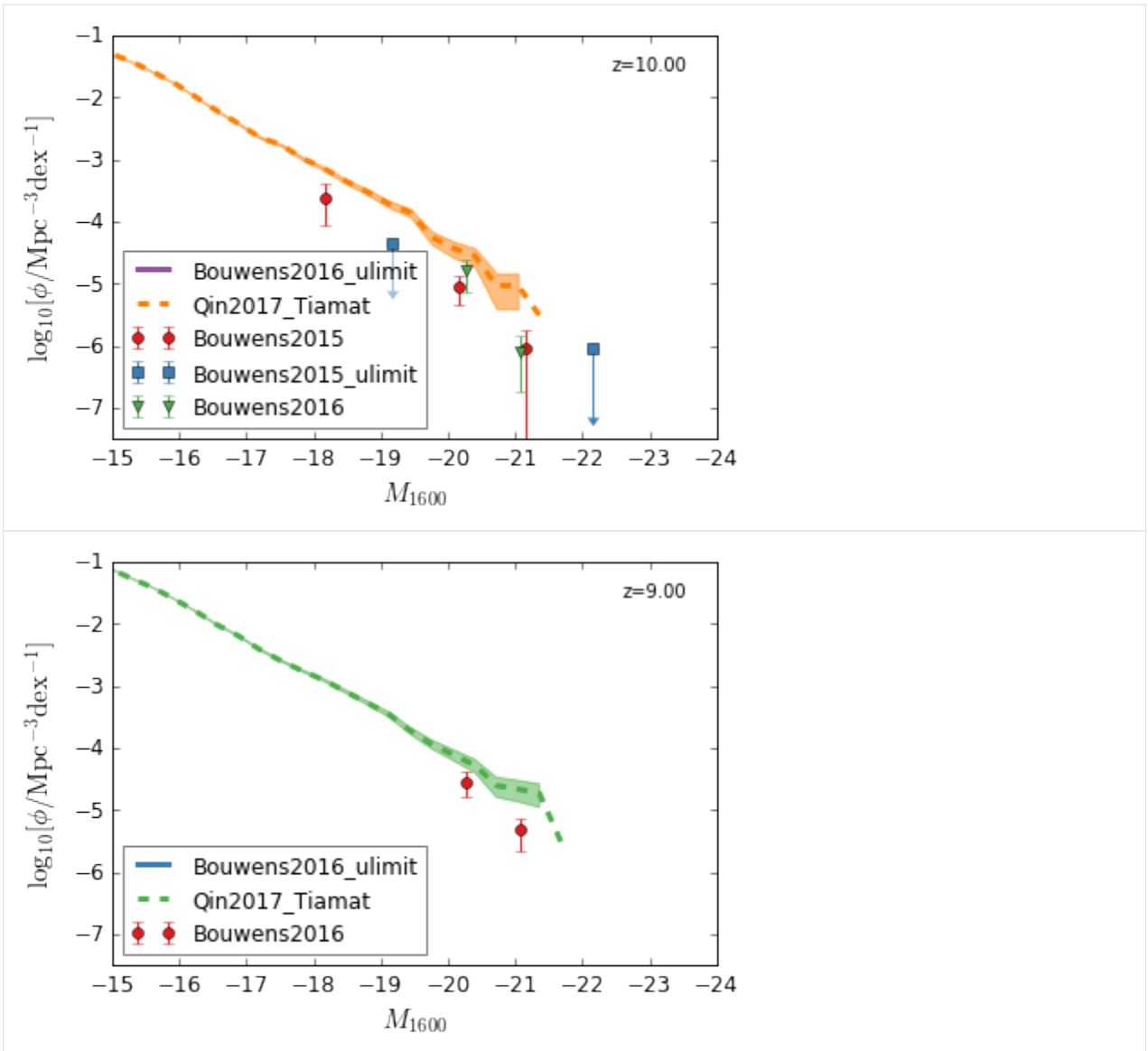
8.3.1 UV

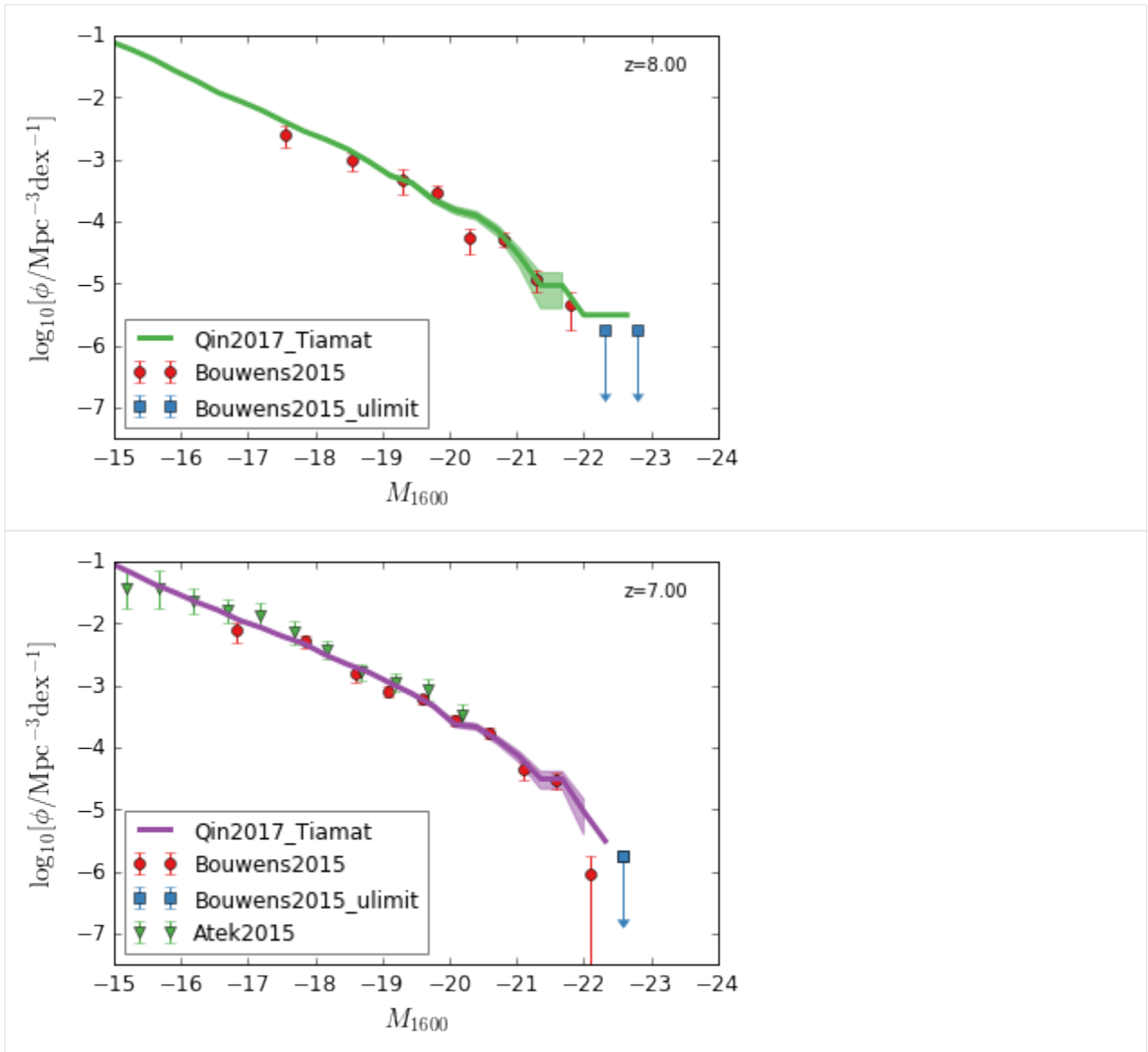
```
[9]: feature = 'GLF_UV'
xlim = (-15,-24)
ylim = (-7.5,-1)
xlabel = r"$M_{1600}$"
ylabel = r"$\log_{10}[\rm \phi/Mpc^{-3} dex^{-1}]$"
zs = [10,9,8,7,6,5,4,3]

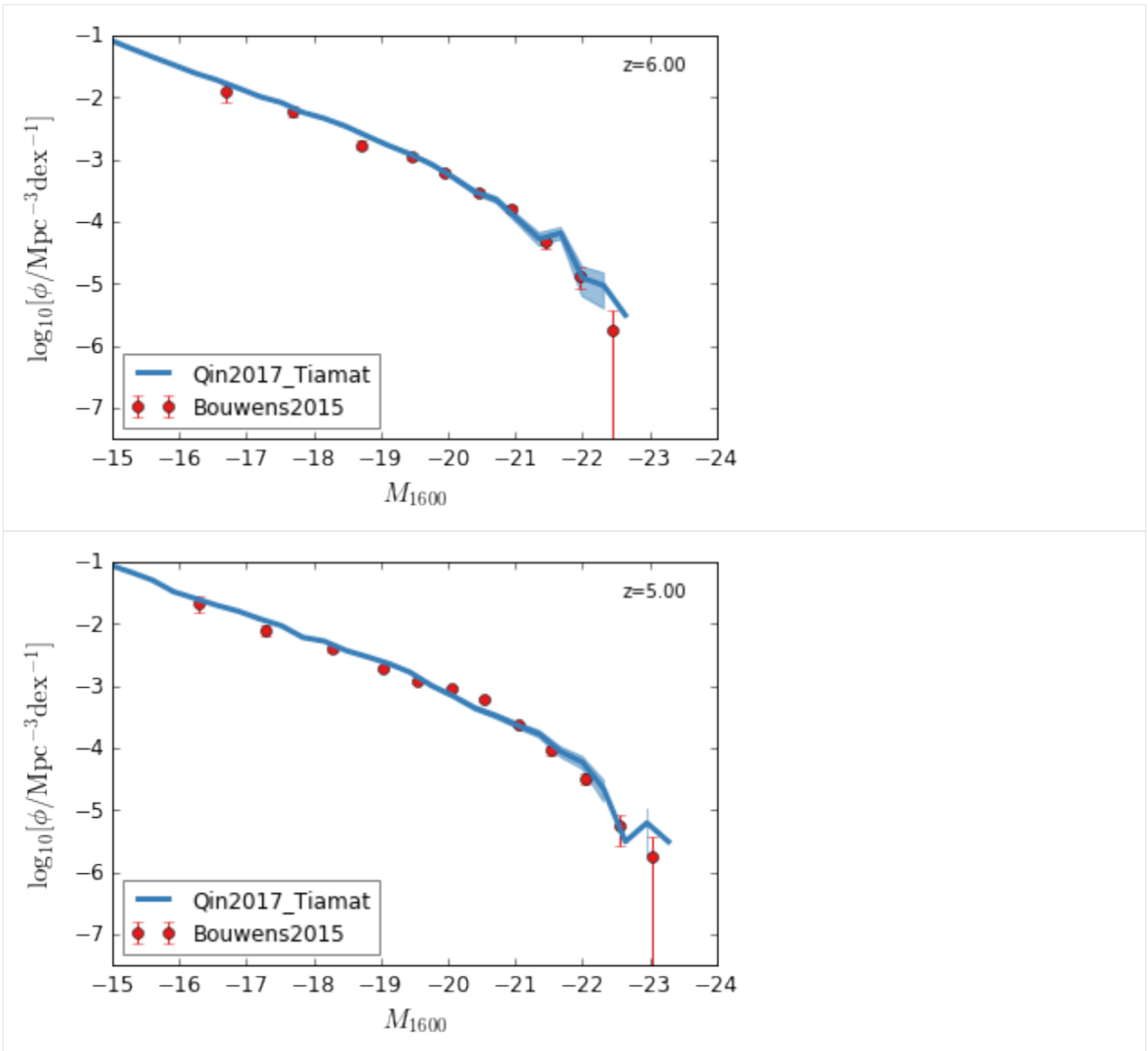
for z in zs:
    fig,ax = plt.subplots(1,1)
    obs = number_density(feature=feature,z_target=z,quiet=1,h=cosmo['h'])
    j_data = 0
    k_func = 0
    for ii in range(obs.n_target_observation):
        data = obs.target_observation['Data'][ii]
        label = obs.target_observation.index[ii]
        datatype = obs.target_observation['DataType'][ii]
        color = colors[ii]
        marker = markers[j_data]
        linestyle = linestyle[k_func]
        data[:,1:] = np.log10(data[:,1:])
        if datatype == 'data':
            ax.errorbar(data[:,0], data[:,1], yerr = [data[:,1]-data[:,3],data[:,2]- data[:,
→1]],\
                        label=label,color=color,fmt=marker)
            j_data +=1
        elif datatype == 'dataULimit':
            ax.errorbar(data[:,0], data[:,1], yerr = -0.2*data[:,1], uplims=True,\
                        label=label,color=color,fmt=marker)
            j_data +=1
        else:
            ax.plot(data[:,0],data[:,1],label=label,color=color,linestyle=linestyle,lw=3)
            ax.fill_between(data[:,0], data[:,2],data[:,3],color=color,alpha=0.5)
            k_func +=1

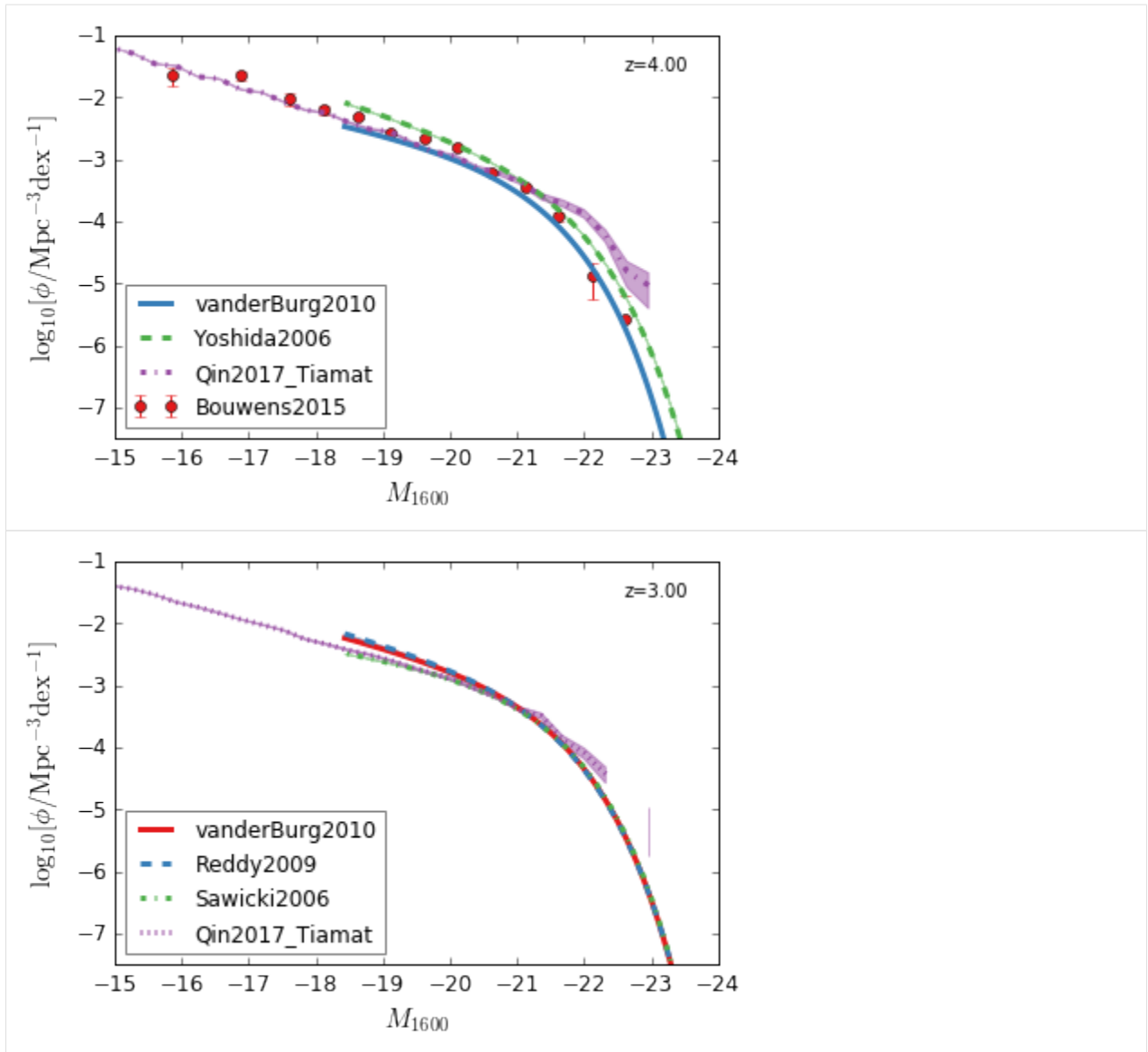
    ax.set_xlim(xlim)
    ax.set_ylim(ylim)
    ax.text(0.95,0.95, "z=%.2f"%z,horizontalalignment='right',\
            verticalalignment='top',transform=ax.transAxes)
    leg = ax.legend(loc='lower left')
    leg.get_frame().set_alpha(0.5)
    ax.set_xlabel(xlabel)
    ax.set_ylabel(ylabel)

/home/yqin/3rd_party/lib/python3.6/site-packages/ipykernel_launcher.py:20: RuntimeWarning:
→invalid value encountered in log10
/home/yqin/3rd_party/lib/python3.6/site-packages/ipykernel_launcher.py:20: RuntimeWarning:
→divide by zero encountered in log10
```









8.4 BHMF

Black Hole Mass Function

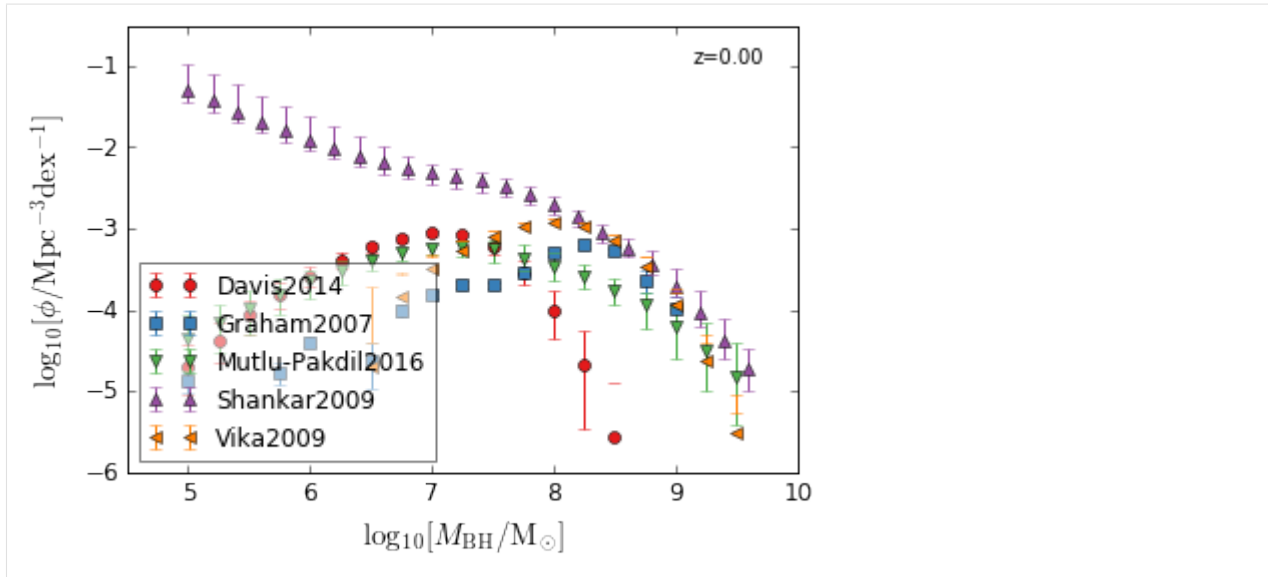
8.4.1 local

```
[10]: feature = 'BHMF'
xlim   = (4.5, 10)
ylim   = (-6, -0.5)
xlabel = r"$\log_{10}[M_{\rm BH}/\rm M_{\odot}]$"
ylabel = r"$\log_{10}[\rm \phi/Mpc^{-3} dex^{-1}]$"
zs     = [0.0, ]

for z in zs:
    fig,ax = plt.subplots(1,1)
    obs = number_density(feature=feature,z_target=z,quiet=1,h=cosmo['h'])
    j_data = 0
    k_func = 0
    for ii in range(obs.n_target_observation):
        data      = obs.target_observation['Data'][ii]
        label      = obs.target_observation.index[ii]
        datatype   = obs.target_observation['DataType'][ii]
        color      = colors[ii]
        marker     = markers[j_data]
        linestyle  = linestyles[k_func]
        data[:,1:] = np.log10(data[:,1:])
        if datatype == 'data':
            ax.errorbar(data[:,0], data[:,1], yerr = [data[:,1]-data[:,3],data[:,2]- data[:,
→1]],\
                        label=label,color=color,fmt=marker)
            j_data +=1
        elif datatype == 'dataULimit':
            ax.errorbar(data[:,0], data[:,1], yerr = -0.2*data[:,1], uplims=True,\
                        label=label,color=color,fmt=marker)
            j_data +=1
        else:
            ax.plot(data[:,0],data[:,1],label=label,color=color,linestyle=linestyle,lw=3)
            ax.fill_between(data[:,0], data[:,2],data[:,3],color=color,alpha=0.5)
            k_func +=1

    ax.set_xlim(xlim)
    ax.set_ylim(ylim)
    ax.text(0.95,0.95, "z=%.2f"%z,horizontalalignment='right',\
            verticalalignment='top',transform=ax.transAxes)
    leg = ax.legend(loc='lower left')
    leg.get_frame().set_alpha(0.5)
    ax.set_xlabel(xlabel)
    ax.set_ylabel(ylabel)

/home/yqin/3rd_party/lib/python3.6/site-packages/ipykernel_launcher.py:20: RuntimeWarning:
→divide by zero encountered in log10
/home/yqin/3rd_party/lib/python3.6/site-packages/ipykernel_launcher.py:20: RuntimeWarning:
→invalid value encountered in log10
/home/yqin/3rd_party/lib/python3.6/site-packages/ipykernel_launcher.py:22: RuntimeWarning:
→invalid value encountered in subtract
/home/yqin/3rd_party/lib/python3.6/site-packages/matplotlib/axes/_axes.py:2860:
→RuntimeWarning: invalid value encountered in double_scalars
    high = [thisx + thiserr for (thisx, thiserr)
```



8.4.2 Shen et al. 2012

```
[11]: feature = 'BHMF'
xlim   = (6, 11)
ylim   = (-15, -4)
xlabel  = r"$\log_{10}[M_{\rm BH}/M_{\odot}]$"
ylabel  = r"$\log_{10}[\phi / \text{Mpc}^{-3} \text{ dex}^{-1}]$"
zs      = [0.4, 0.6, 0.8, 1.0, 1.2, 1.4, 1.6, 1.8, 2.15, 2.65, 3.2, 3.75, 4.25, 4.75, ]

fig, ax = plt.subplots(1, 1)
for z, color in zip(zs, colors):
    obs = number_density(feature=feature, z_target=z, z_tol=0.05, quiet=1, h=cosmo['h'])
    j_data = 0
    k_func = 0
    for ii in range(obs.n_target_observation):
        if obs.target_observation.index[ii] != "Shen2012":
            continue
        data = obs.target_observation['Data'][ii]
        label = "z=%.2f"%z
        datatype = obs.target_observation['DataType'][ii]
        marker = markers[j_data]
        linestyle = linestyles[k_func]
        data[:, 1:] = np.log10(data[:, 1:])
        if datatype == 'data':
            ax.errorbar(data[:, 0], data[:, 1], yerr = [data[:, 1]-data[:, 3], data[:, 2]-data[:,
→ 1]], \
                        label=label, color=color, fmt=marker, markersize=1)
            j_data += 1
        elif datatype == 'dataULimit':
            ax.errorbar(data[:, 0], data[:, 1], yerr = -0.2*data[:, 1], uplims=True, \
                        label=label, color=color, fmt=marker)
            j_data += 1
```

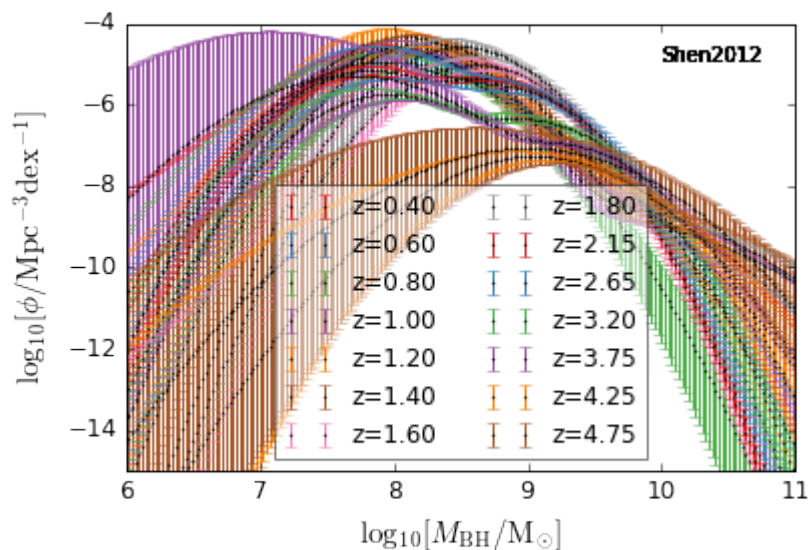
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```

else:
    ax.plot(data[:,0],data[:,1],label=label,color=color,linestyle=linestyle,lw=3)
    ax.fill_between(data[:,0], data[:,2],data[:,3],color=color,alpha=0.5)
    k_func +=1

ax.set_xlim(xlim)
ax.set_ylim(ylim)
ax.text(0.95,0.95, "Shen2012",horizontalalignment='right',\
        verticalalignment='top',transform=ax.transAxes)
leg = ax.legend(loc='lower center', ncol=2)
leg.get_frame().set_alpha(0.5)
ax.set_xlabel(xlabel)
ax.set_ylabel(ylabel)
    
```



8.4.3 DRAGONS

```

[12]: feature = 'BHMF'
      xlim    = (4, 10)
      ylim    = (-6, 0)
      xlabel  = r"$\log_{10}[M_{\rm BH}/M_{\odot}]$"
      ylabel  = r"$\log_{10}[\phi/\text{Mpc}^{-3} \text{ dex}^{-1}]$"
      zs      = [0.55,0.95,2.0,5.0,7.0]

fig,ax = plt.subplots(1,1)
for z, color in zip(zs, colors):
    obs = number_density(feature=feature,z_target=z,z_tol=0.05,quiet=1,h=cosmo['h'])
    j_data = 0
    k_func = 0
    for ii in range(obs.n_target_observation):
        if "Qin" not in obs.target_observation.index[ii]:
            continue
        data = obs.target_observation['Data'][ii]
    
```

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```

label      = "z=%.2f"%z
datatype   = obs.target_observation['DataType'][ii]
marker     = markers[j_data]
linestyle  = linestyle[k_func]
data[:,1:] = np.log10(data[:,1:])
if datatype == 'data':
    ax.errorbar(data[:,0], data[:,1], yerr = [data[:,1]-data[:,3],data[:,2]- data[:,
→1]],\
                label=label,color=color,fmt=marker,markersize=1)
    j_data +=1
elif datatype == 'dataULimit':
    ax.errorbar(data[:,0], data[:,1], yerr = -0.2*data[:,1], uplims=True,\
                label=label,color=color,fmt=marker)
    j_data +=1
else:
    ax.plot(data[:,0],data[:,1],label=label,color=color,linestyle=linestyle,lw=3)
    ax.fill_between(data[:,0], data[:,2],data[:,3],color=color,alpha=0.5)
    k_func +=1

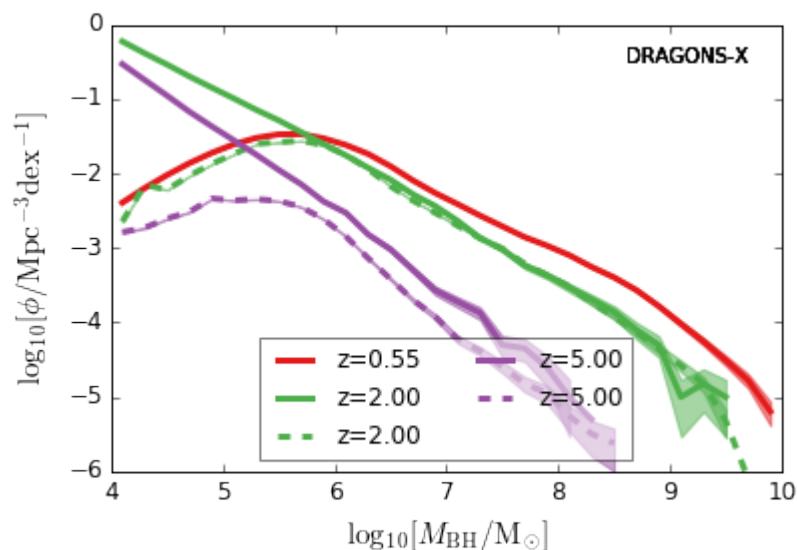
ax.set_xlim(xlim)
ax.set_ylim(ylim)
ax.text(0.95,0.95, "DRAGONS-X",horizontalalignment='right',\
        verticalalignment='top',transform=ax.transAxes)
leg = ax.legend(loc='lower center', ncol=2)
leg.get_frame().set_alpha(0.5)
ax.set_xlabel(xlabel)
ax.set_ylabel(ylabel)

```

No available data of BHMF at $0.90 < z_{\text{target}} < 1.00$

No available data of BHMF at $6.95 < z_{\text{target}} < 7.05$

/home/yqin/3rd_party/lib/python3.6/site-packages/ipykernel_launcher.py:21: RuntimeWarning:
→ divide by zero encountered in log10



8.5 QLF

Quasar Luminosity Function

8.5.1 UV

```
[13]: feature = 'QLF_UV'
xlim   = (-15, -29)
ylim   = (-10, -3.5)
xlabel  = r"$M_{1450}$"
ylabel  = r"$\log_{10}[\rm \phi/Mpc^{-3} dex^{-1}]$"
zs      = [6,5,4,3]

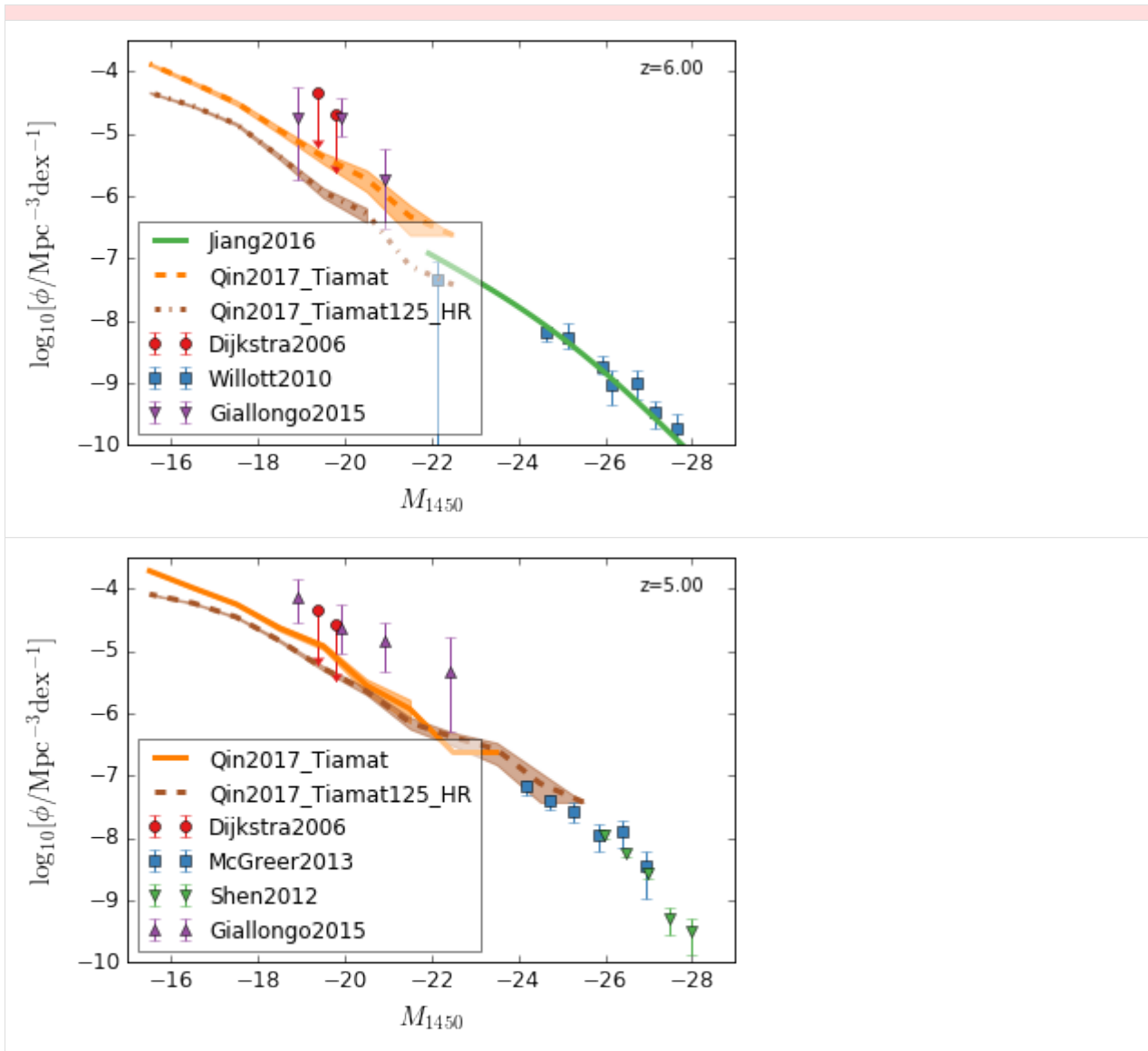
for z in zs:
    fig,ax = plt.subplots(1,1)
    obs     = number_density(feature=feature,z_target=z,quiet=1,h=cosmo['h'])
    j_data  = 0
    k_func  = 0
    for ii in range(obs.n_target_observation):
        data      = obs.target_observation['Data'][ii]
        label      = obs.target_observation.index[ii]
        datatype   = obs.target_observation['DataType'][ii]
        color      = colors[ii]
        marker     = markers[j_data]
        linestyle  = linestyles[k_func]
        data[:,1:] = np.log10(data[:,1:])
        if datatype == 'data':
            ax.errorbar(data[:,0], data[:,1], yerr = [data[:,1]-data[:,3],data[:,2]- data[:,
→ 1]],\
                        label=label,color=color,fmt=marker)
            j_data +=1
        elif datatype == 'dataULimit':
            ax.errorbar(data[:,0], data[:,1], yerr = -0.2*data[:,1], uplims=True,\
                        label=label,color=color,fmt=marker)
            j_data +=1
        else:
            ax.plot(data[:,0],data[:,1],label=label,color=color,linestyle=linestyle,lw=3)
            ax.fill_between(data[:,0], data[:,2],data[:,3],color=color,alpha=0.5)
            k_func +=1

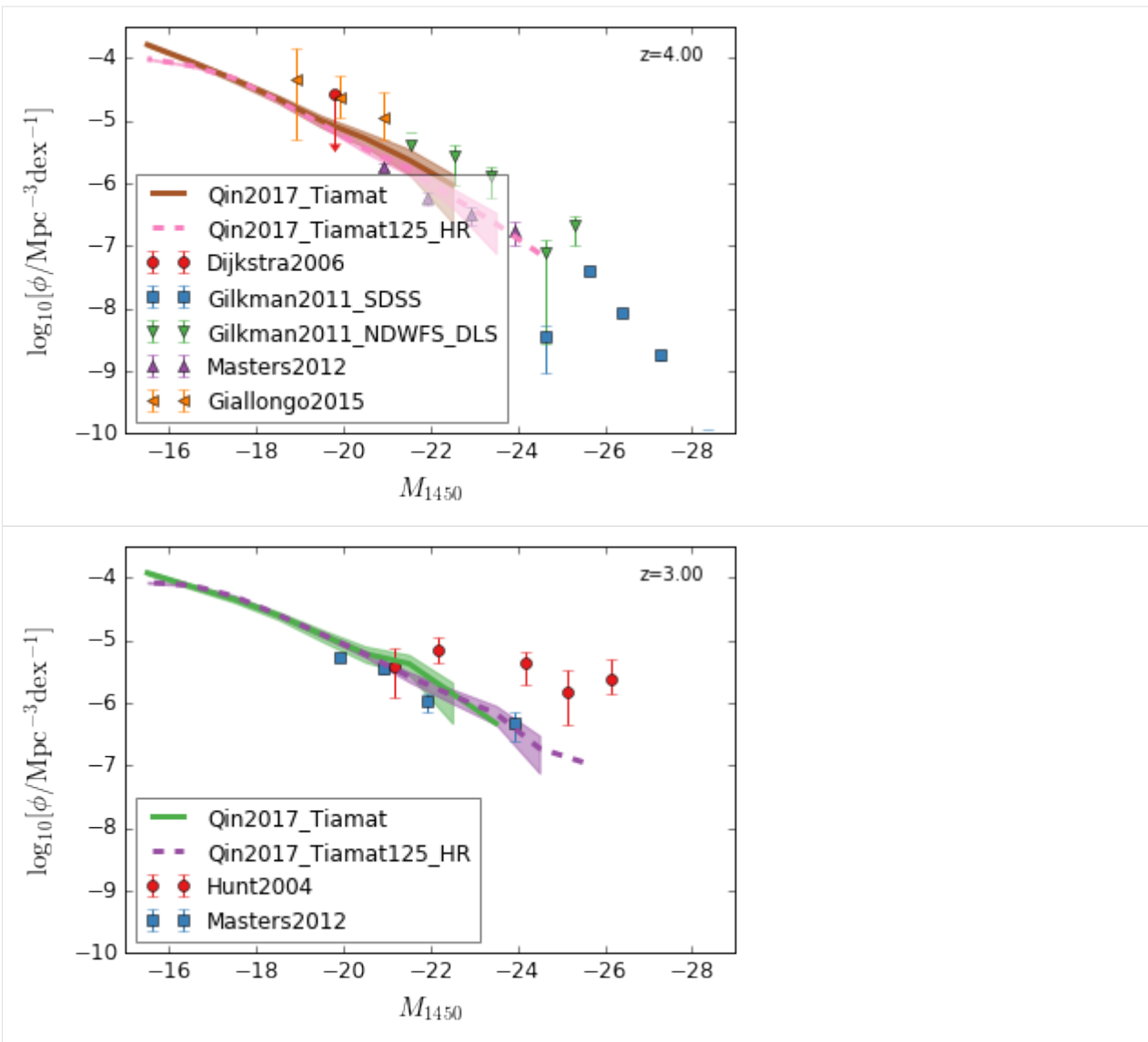
    ax.set_xlim(xlim)
    ax.set_ylim(ylim)
    ax.text(0.95,0.95, "z=%.2f"%z,horizontalalignment='right',\
            verticalalignment='top',transform=ax.transAxes)
    leg = ax.legend(loc='lower left')
    leg.get_frame().set_alpha(0.5)
    ax.set_xlabel(xlabel)
    ax.set_ylabel(ylabel)

/home/yqin/3rd_party/lib/python3.6/site-packages/ipykernel_launcher.py:20: RuntimeWarning:
→ invalid value encountered in log10
/home/yqin/3rd_party/lib/python3.6/site-packages/ipykernel_launcher.py:20: RuntimeWarning:
→ divide by zero encountered in log10
```

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8.5.2 optical B

```
[14]: feature = 'QLF_optical'
      xlim    = (-15, -29)
      ylim    = (-10, -3.5)
      xlabel  = r"$M_{\rm B}$"
      ylabel  = r"$\log_{10}[\phi/\text{Mpc}^{-3} \text{ dex}^{-1}]$"
      zs      = [2, 1.5, 1.3, 0.5]

      for z in zs:
          fig, ax = plt.subplots(1, 1)
          obs      = number_density(feature=feature, z_target=z, quiet=1, h=cosmo['h'])
          j_data   = 0
          k_func   = 0
          for ii in range(obs.n_target_observation):
```

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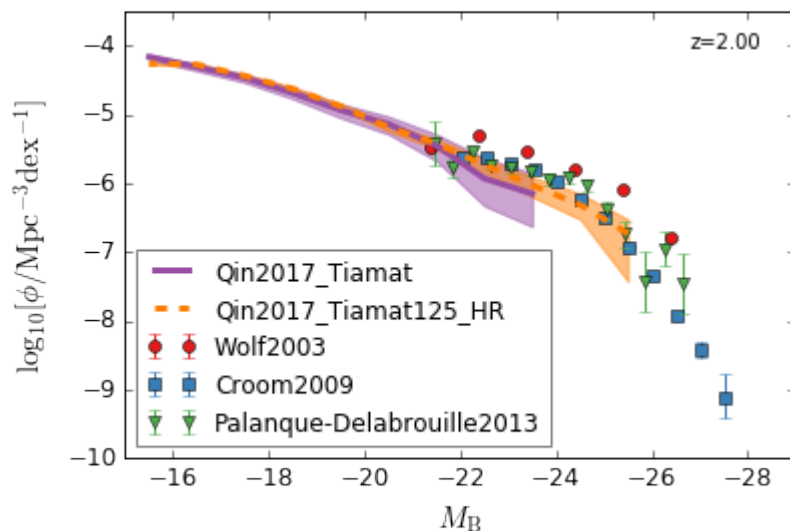
(continued from previous page)

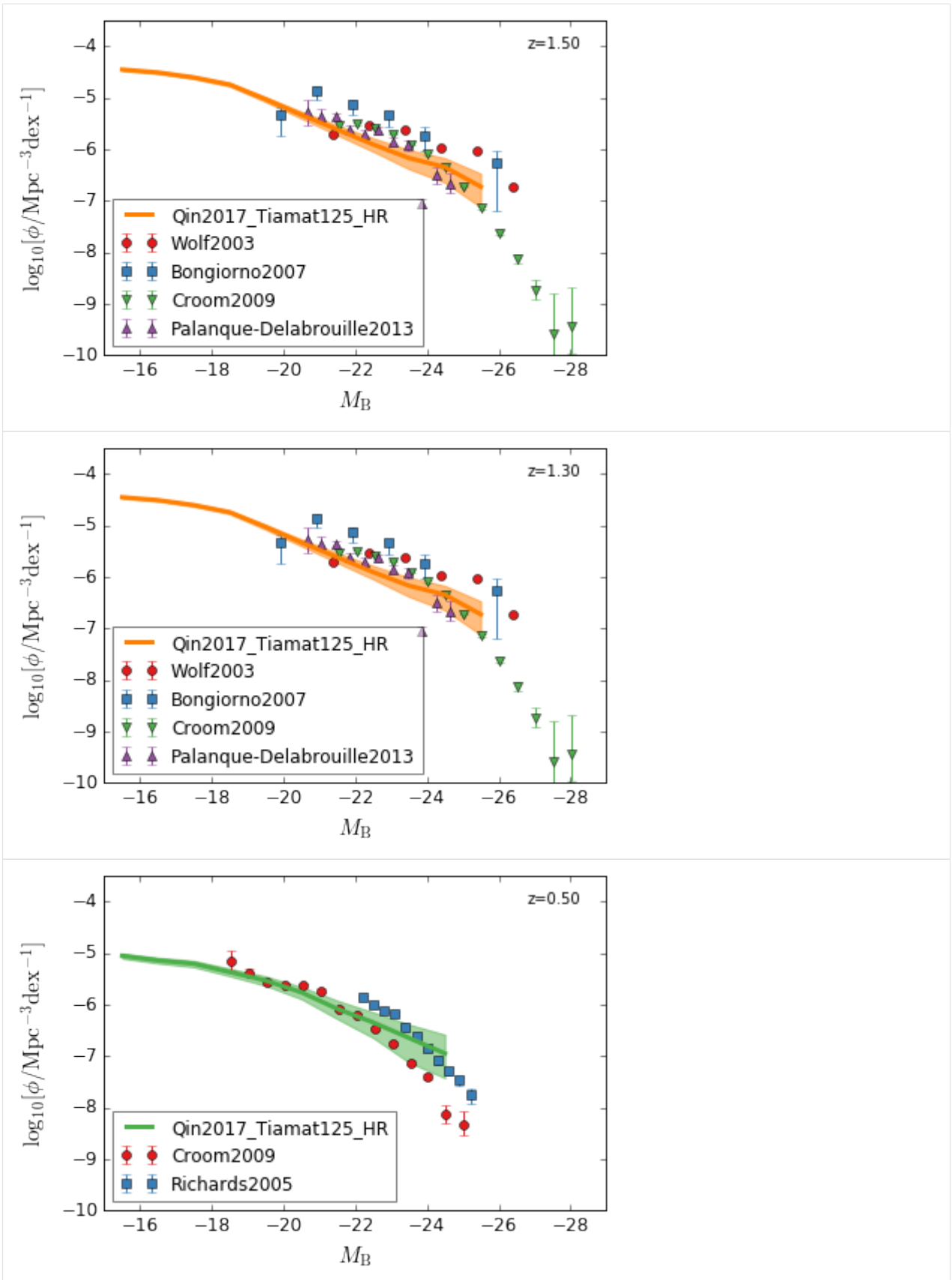
```

data      = obs.target_observation['Data'][ii]
label     = obs.target_observation.index[ii]
datatype  = obs.target_observation['DataType'][ii]
color     = colors[ii]
marker    = markers[j_data]
linestyle = linestyle[k_func]
data[:,1:] = np.log10(data[:,1:])
if datatype == 'data':
    ax.errorbar(data[:,0], data[:,1], yerr = [data[:,1]-data[:,3],data[:,2]- data[:,
↪1]],\
                label=label,color=color,fmt=marker)
    j_data +=1
elif datatype == 'dataULimit':
    ax.errorbar(data[:,0], data[:,1], yerr = -0.2*data[:,1], uplims=True,\
                label=label,color=color,fmt=marker)
    j_data +=1
else:
    ax.plot(data[:,0],data[:,1],label=label,color=color,linestyle=linestyle,lw=3)
    ax.fill_between(data[:,0], data[:,2],data[:,3],color=color,alpha=0.5)
    k_func +=1

ax.set_xlim(xlim)
ax.set_ylim(ylim)
ax.text(0.95,0.95, "z=%.2f"%z,horizontalalignment='right',\
        verticalalignment='top',transform=ax.transAxes)
leg = ax.legend(loc='lower left')
leg.get_frame().set_alpha(0.5)
ax.set_xlabel(xlabel)
ax.set_ylabel(ylabel)

```



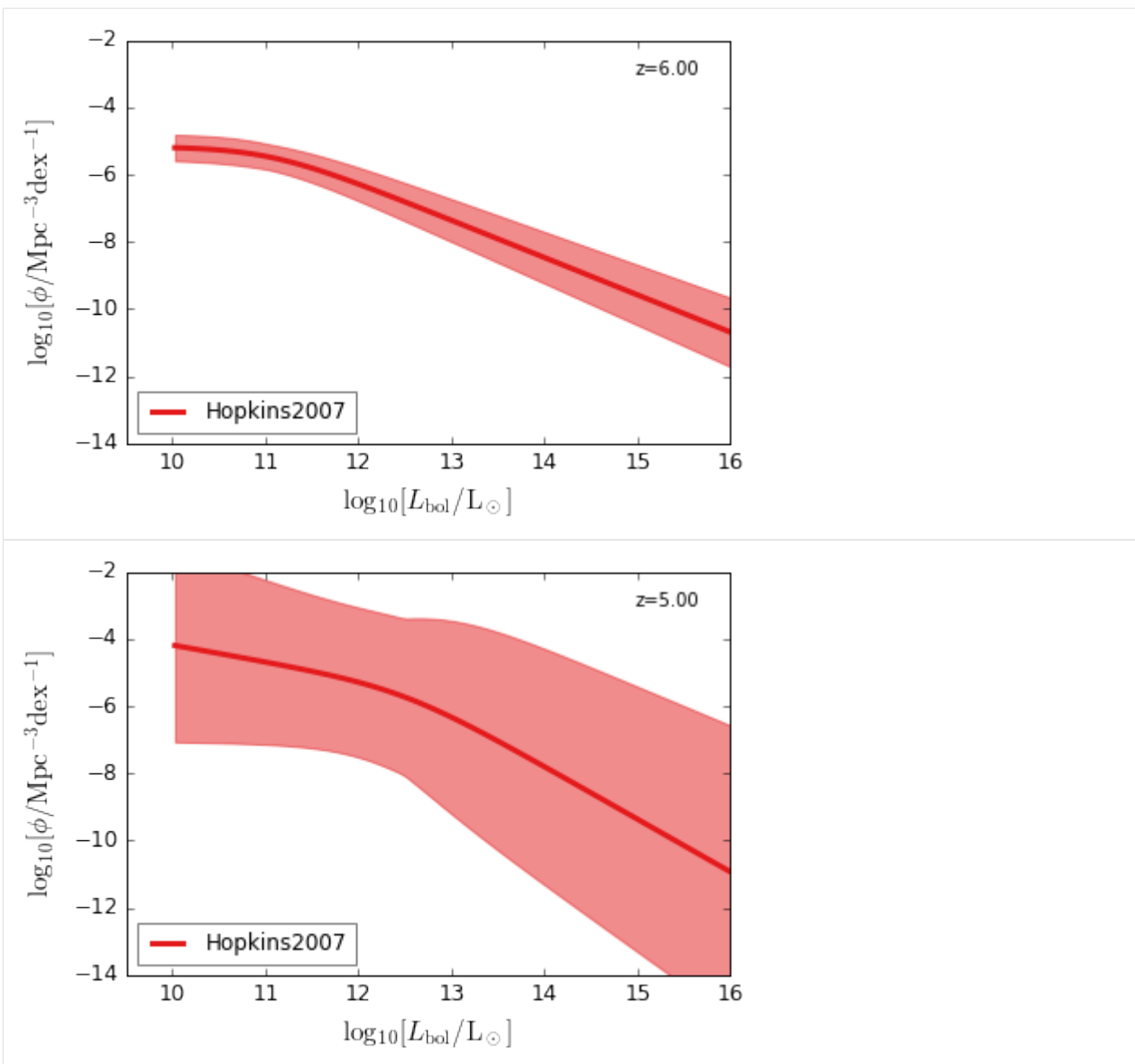


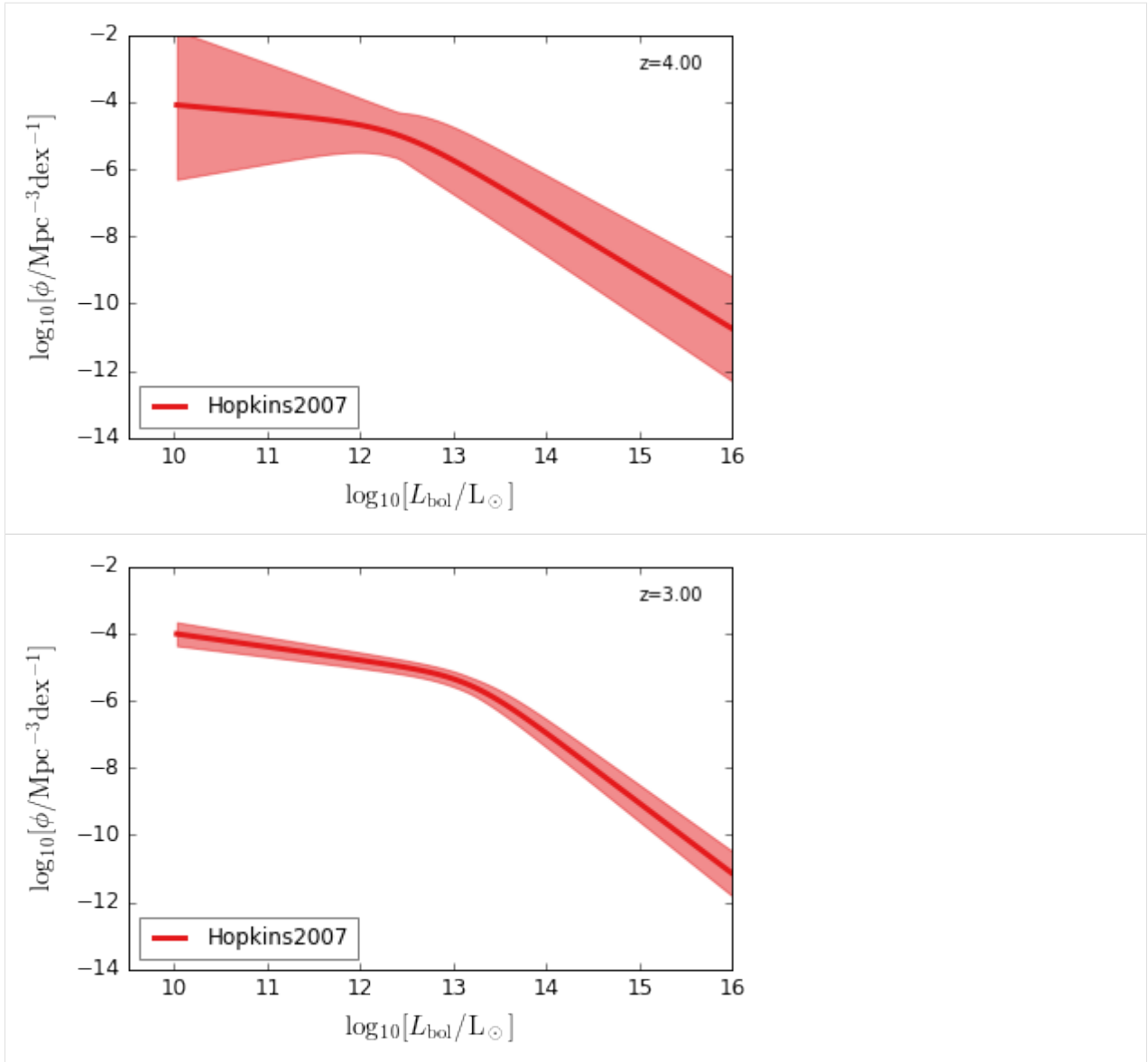
8.5.3 Bolometric

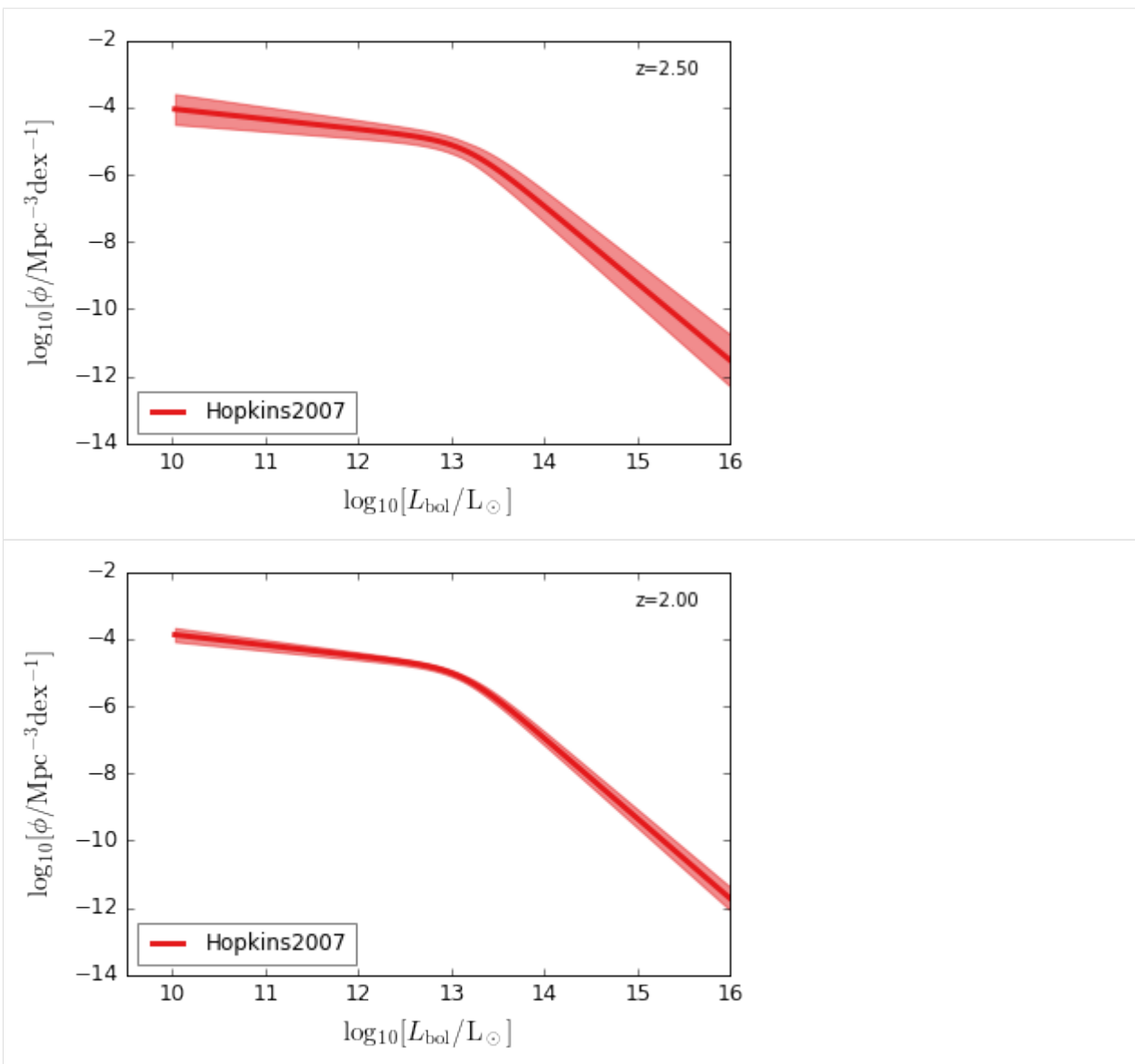
```
[15]: feature = 'QLF_bolometric'
      xlim    = (9.5, 16)
      ylim    = (-14, -2)
      xlabel  = r"$\log_{10}[L_{\rm bol}]/\rm L_{\odot}]$"
      ylabel  = r"$\log_{10}[\rm \phi/Mpc^{-3} dex^{-1}]$"
      zs      = [6.0, 5.0, 4.0, 3.0, 2.5, 2.0, 1.5, 1.0, 0.5, 0.1]

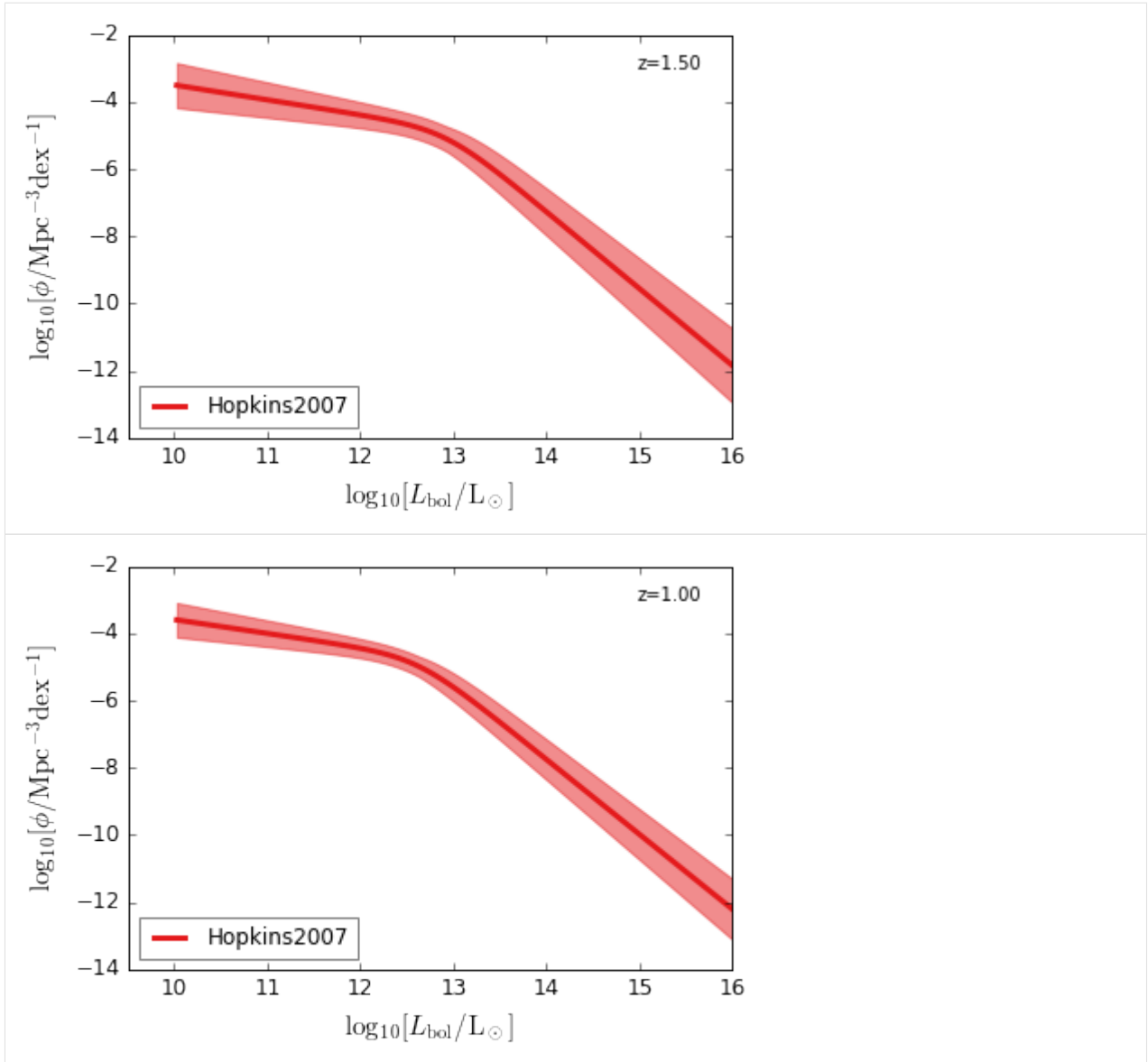
      for z in zs:
          fig, ax = plt.subplots(1,1)
          obs = number_density(feature=feature, z_target=z, quiet=1, h=cosmo['h'])
          j_data = 0
          k_func = 0
          for ii in range(obs.n_target_observation):
              data = obs.target_observation['Data'][ii]
              label = obs.target_observation.index[ii]
              datatype = obs.target_observation['DataType'][ii]
              color = colors[ii]
              marker = markers[j_data]
              linestyle = linestyles[k_func]
              data[:,1:] = np.log10(data[:,1:])
              if datatype == 'data':
                  ax.errorbar(data[:,0], data[:,1], yerr = [data[:,1]-data[:,3], data[:,2]-data[:,
→1]],\
                             label=label, color=color, fmt=marker)
                  j_data +=1
              elif datatype == 'dataULimit':
                  ax.errorbar(data[:,0], data[:,1], yerr = -0.2*data[:,1], uplims=True,\
                             label=label, color=color, fmt=marker)
                  j_data +=1
              else:
                  ax.plot(data[:,0], data[:,1], label=label, color=color, linestyle=linestyle, lw=3)
                  ax.fill_between(data[:,0], data[:,2], data[:,3], color=color, alpha=0.5)
                  k_func +=1

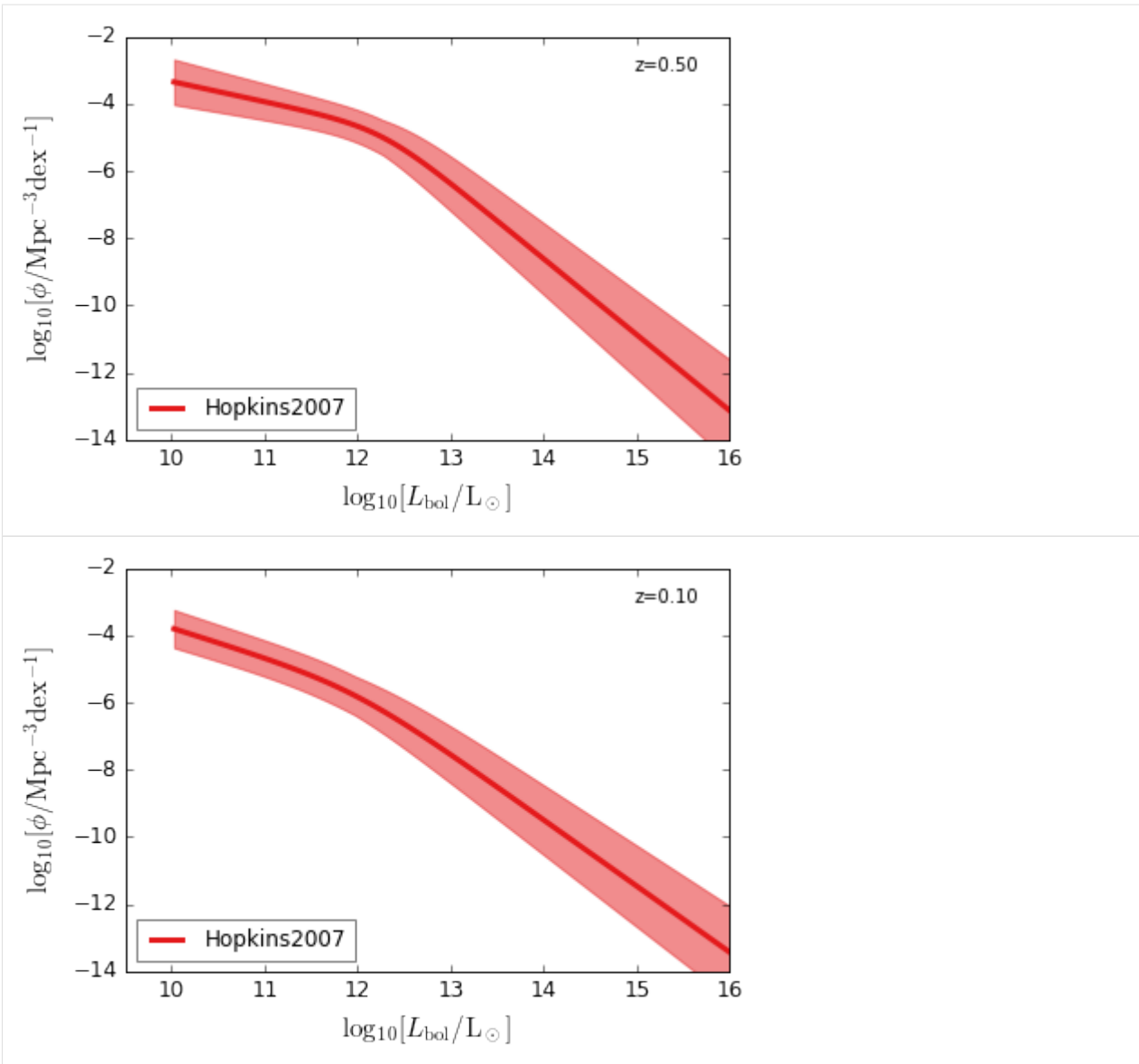
          ax.set_xlim(xlim)
          ax.set_ylim(ylim)
          ax.text(0.95, 0.95, "z=%.2f"%z, horizontalalignment='right',\
                 verticalalignment='top', transform=ax.transAxes)
          leg = ax.legend(loc='lower left')
          leg.get_frame().set_alpha(0.5)
          ax.set_xlabel(xlabel)
          ax.set_ylabel(ylabel)
```











8.6 Magorrian Relation

```
[16]: feature = 'Magorrian'
      xlim    = (5, 13)
      ylim    = (3, 11)
      xlabel  = r"$\log_{10}[M_{\rm sph}/M_{\odot}]$"
      ylabel  = r"$\log_{10}[M_{\rm bh}/M_{\odot}]$"
      zs      = [0.0, ]

      for z in zs:
          fig, ax = plt.subplots(1, 1)
          obs      = correlation(feature=feature, z_target=z, quiet=1, h=cosmo['h'])
          for ii in range(obs.n_target_observation):
```

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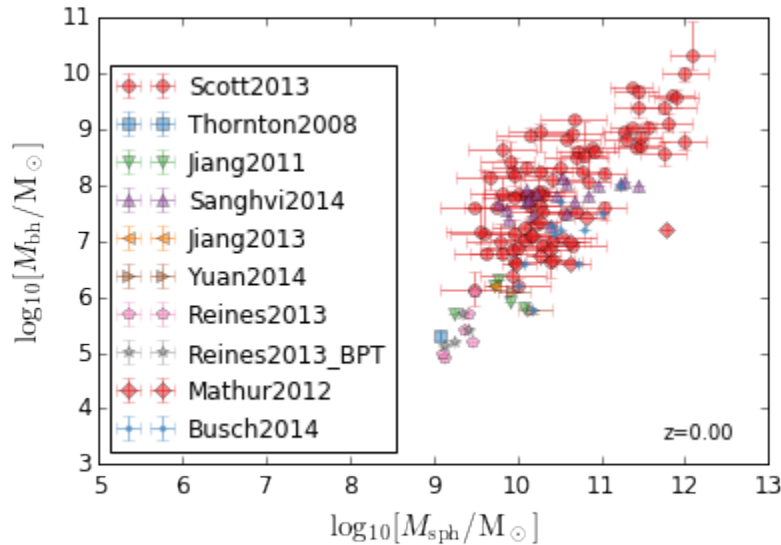
(continued from previous page)

```

data      = obs.target_observation['Data'][ii]
label     = obs.target_observation.index[ii]
datatype  = obs.target_observation['DataType'][ii]
color     = colors[ii]
marker    = markers[ii]
linestyle = linestyle[ii]
data      = np.log10(data)
if len(data) > 1e3:
    ax.hist2d(data[:,0], data[:,3],\
               range = [xlim, ylim], bins=50,\
               norm=LogNorm(), label=label, cmap=plt.get_cmap(color_maps[ii]))
    ax.text(0.05, 0.05*ii, label, horizontalalignment='left', color=color,\
            verticalalignment='bottom', transform=ax.transAxes)
else:
    ax.errorbar(data[:,0], data[:,3],\
                xerr = [data[:,1]-data[:,0], data[:,0] - data[:,2]],\
                yerr = [data[:,4]-data[:,3], data[:,3] - data[:,5]],\
                label=label, color=color, fmt=marker, alpha=0.5)

ax.set_xlim(xlim)
ax.set_ylim(ylim)
ax.text(0.95, 0.05, "z=%.2f"%z, horizontalalignment='right',\
        verticalalignment='bottom', transform=ax.transAxes)
leg = ax.legend(loc='lower left')
ax.set_xlabel(xlabel)
ax.set_ylabel(ylabel)

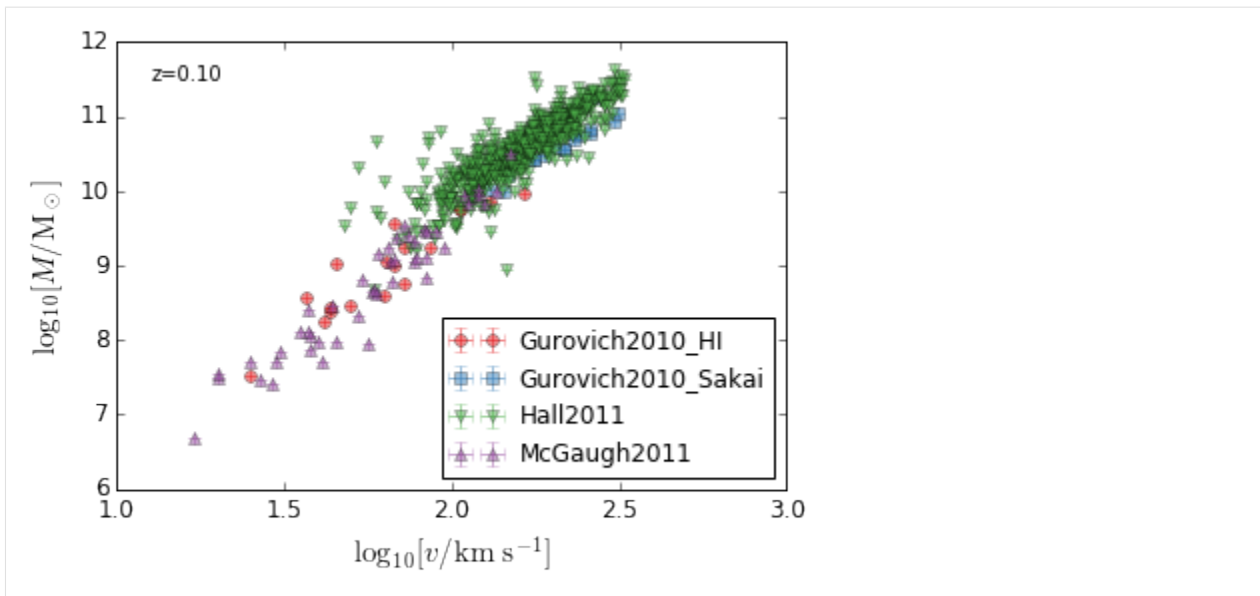
```



8.7 Tully_Fisher Relation

```
[17]: feature = 'Tully_Fisher'
xlim   = (1, 3)
ylim   = (6, 12)
xlabel = r"$\log_{10}[v/{\rm km\ s^{-1}}]$"
ylabel = r"$\log_{10}[M/{\rm M_{\odot}}]$"
zs     = [0.1, ]

for z in zs:
    fig, ax = plt.subplots(1, 1)
    obs = correlation(feature=feature, z_target=z, quiet=1, h=cosmo['h'])
    for ii in range(obs.n_target_observation):
        data      = obs.target_observation['Data'][ii]
        label      = obs.target_observation.index[ii]
        datatype   = obs.target_observation['DataType'][ii]
        color       = colors[ii]
        marker      = markers[ii]
        linestyle   = linestyles[ii]
        data        = np.log10(data)
        if len(data) > 1e3:
            ax.hist2d(data[:, 0], data[:, 3], \
                      range = [xlim, ylim], bins=50, \
                      norm=LogNorm(), label=label, cmap=plt.get_cmap(color_maps[ii]))
            ax.text(0.05, 0.05*ii, label, horizontalalignment='left', color=color, \
                   verticalalignment='bottom', transform=ax.transAxes)
        else:
            ax.errorbar(data[:, 0], data[:, 3], \
                       xerr = [data[:, 1]-data[:, 0], data[:, 0] - data[:, 2]], \
                       yerr = [data[:, 4]-data[:, 3], data[:, 3] - data[:, 5]], \
                       label=label, color=color, fmt=marker, alpha=0.5)
    ax.set_xlim(xlim)
    ax.set_ylim(ylim)
    ax.text(0.05, 0.95, "z=%0.2f"%z, horizontalalignment='left', \
           verticalalignment='top', transform=ax.transAxes)
    leg = ax.legend(loc='lower right')
    ax.set_xlabel(xlabel)
    ax.set_ylabel(ylabel)
```



8.8 DiskSize_StellarMass

```
[18]: feature = 'DiskSize_StellarMass'
      xlim    = (5, 13)
      ylim    = (-2, 3)
      xlabel  = r'$\log_{10}[M_{\rm disk}/M_{\odot}]$'
      ylabel  = r'$\log_{10}[R_{\rm disk}/\rm kpc]$\text{'
      zs      = [0.1, 0.35, 0.65, 0.95, 1.35, 1.75, 2.25, 2.75, 3.5]

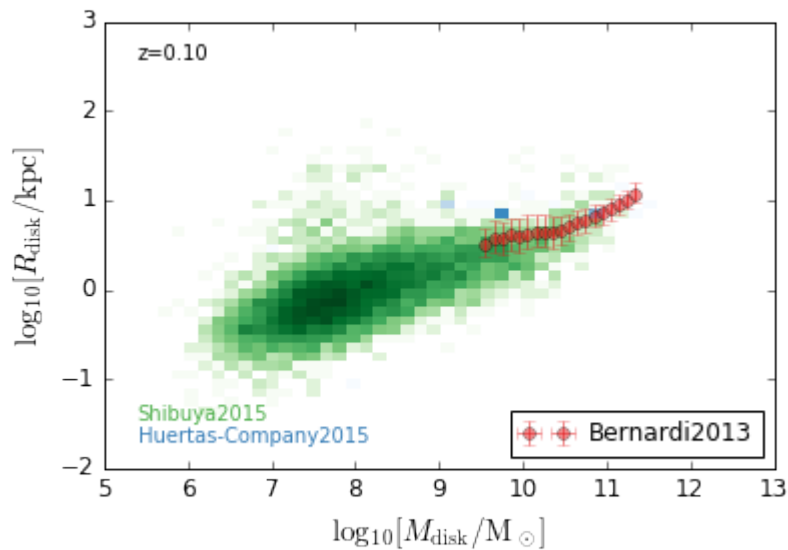
      for z in zs:
          fig, ax = plt.subplots(1, 1)
          obs = correlation(feature=feature, z_target=z, quiet=1, h=cosmo['h'])
          for ii in range(obs.n_target_observation):
              data      = obs.target_observation['Data'][ii]
              label     = obs.target_observation.index[ii]
              datatype  = obs.target_observation['DataType'][ii]
              color     = colors[ii]
              marker    = markers[ii]
              linestyle = styles[ii]
              data      = np.log10(data)
              if len(data) > 1e3:
                  ax.hist2d(data[:, 0], data[:, 3], \
                           range = [xlim, ylim], bins=50, \
                           norm=LogNorm(), label=label, cmap=plt.get_cmap(color_maps[ii]))
                  ax.text(0.05, 0.05*ii, label, horizontalalignment='left', color=color, \
                          verticalalignment='bottom', transform=ax.transAxes)
              else:
                  ax.errorbar(data[:, 0], data[:, 3], \
                             xerr = [data[:, 1]-data[:, 0], data[:, 0] - data[:, 2]], \
                             yerr = [data[:, 4]-data[:, 3], data[:, 3] - data[:, 5]], \
                             label=label, color=color, fmt=marker, alpha=0.5)
```

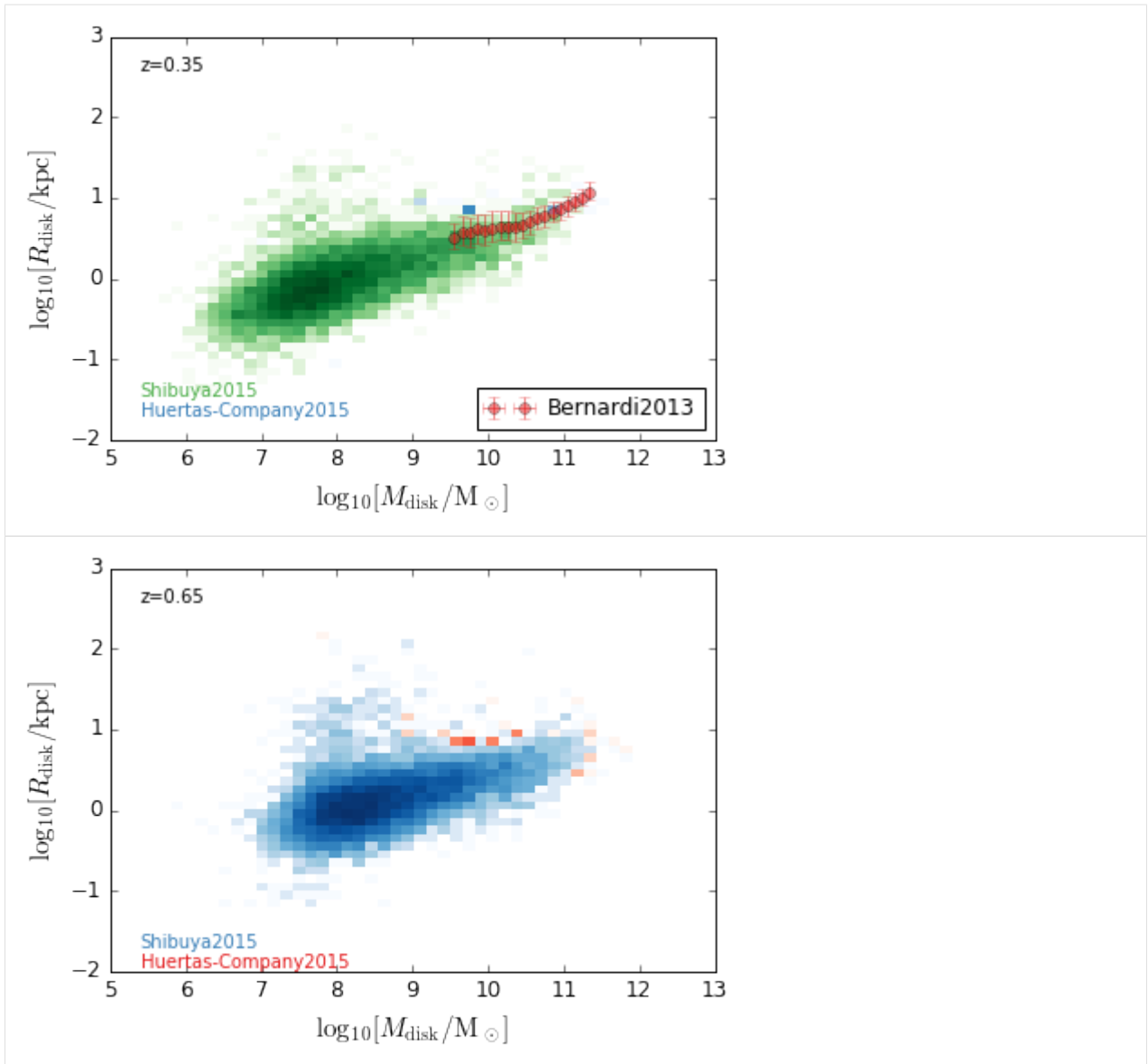
(continues on next page)

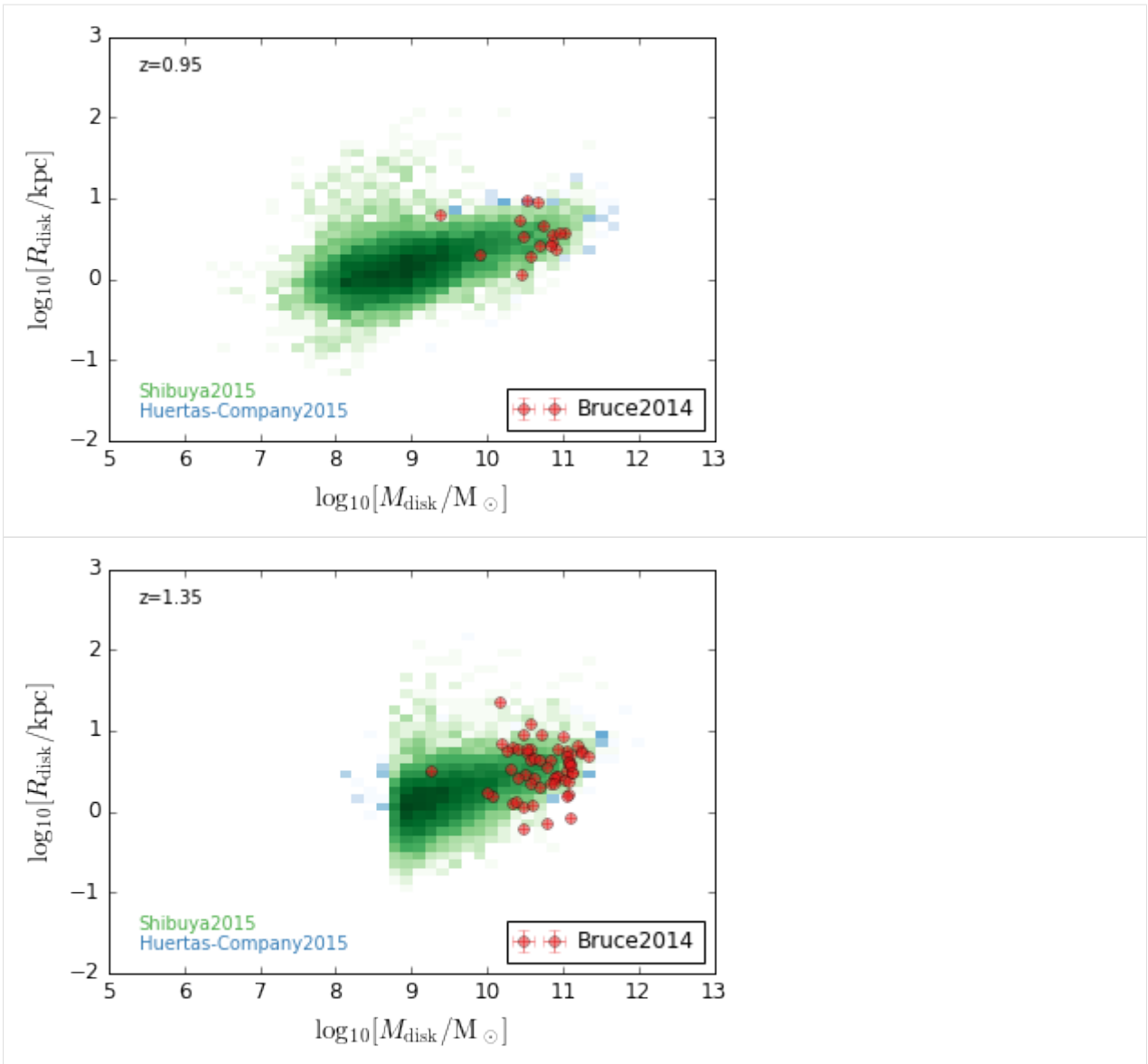
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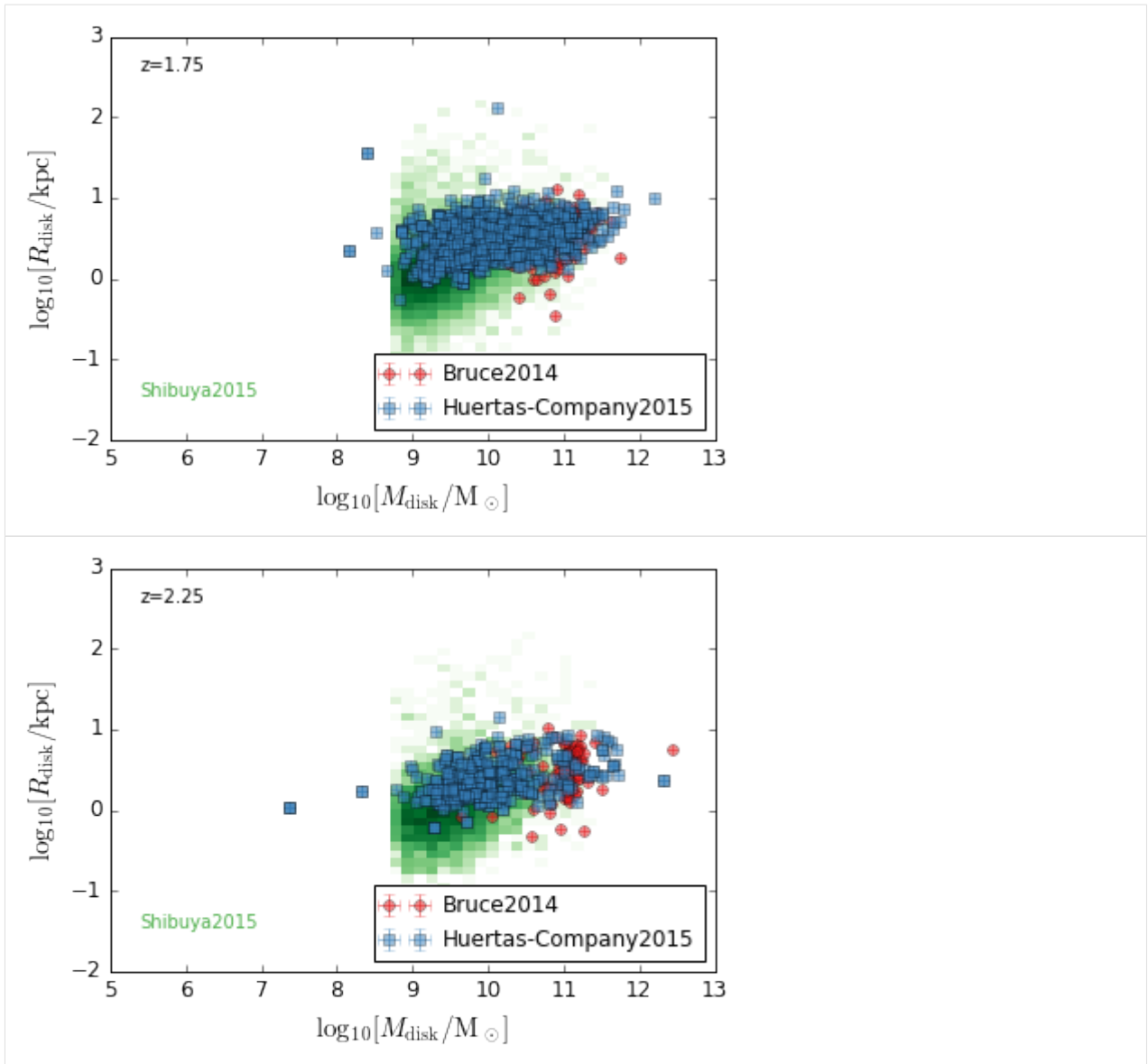
```
ax.set_xlim(xlim)
ax.set_ylim(ylim)
ax.text(0.05,0.95, "z=%.2f"%z, horizontalalignment='left',\
        verticalalignment='top', transform=ax.transAxes)
leg = ax.legend(loc='lower right')
ax.set_xlabel(xlabel)
ax.set_ylabel(ylabel)
```

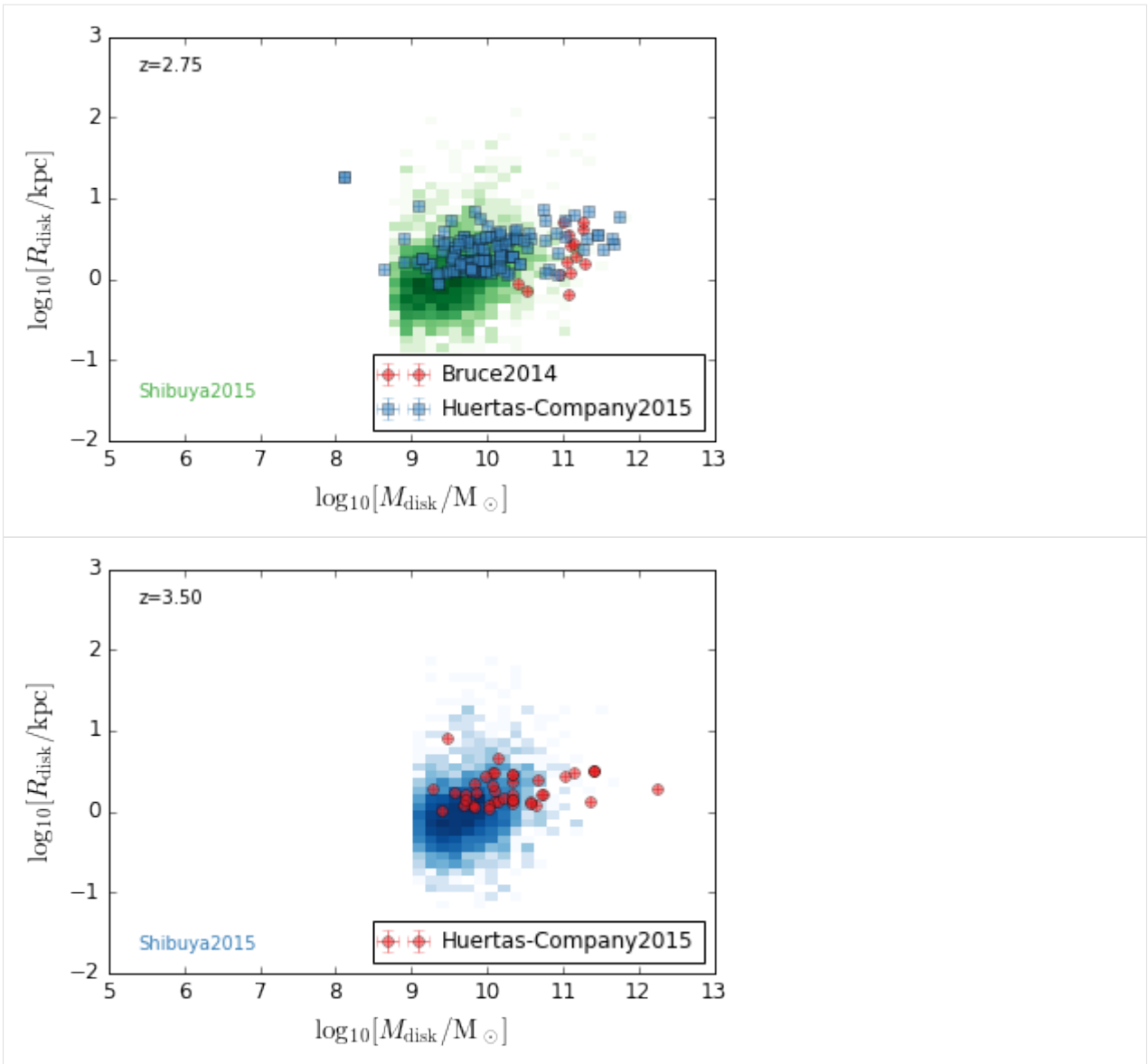
```
/home/yqin/3rd_party/lib/python3.6/site-packages/ipykernel_launcher.py:18: RuntimeWarning:
↳divide by zero encountered in log10
/home/yqin/3rd_party/lib/python3.6/site-packages/ipykernel_launcher.py:18: RuntimeWarning:
↳invalid value encountered in log10
/home/yqin/3rd_party/lib/python3.6/site-packages/matplotlib/axes/_axes.py:531: UserWarning:
↳No labelled objects found. Use label='...' kwarg on individual plots.
  warnings.warn("No labelled objects found. ")
/home/yqin/3rd_party/lib/python3.6/site-packages/ipykernel_launcher.py:23: RuntimeWarning:
↳invalid value encountered in subtract
```











8.9 GasFraction_StellarMass

```
[19]: feature = 'GasFraction_StellarMass'
      xlim    = (5, 13)
      ylim    = (-2, 3)
      xlabel  = r'$\log_{10}[M_{*}/\rm M_{\odot}]$'
      ylabel  = r"$\log_{10}[M_{\rm gas}/M_{*}]$"
      zs      = [0.1,]

      for z in zs:
          fig, ax = plt.subplots(1, 1)
          obs      = correlation(feature=feature, z_target=z, quiet=1, h=cosmo['h'])
          for ii in range(obs.n_target_observation):
```

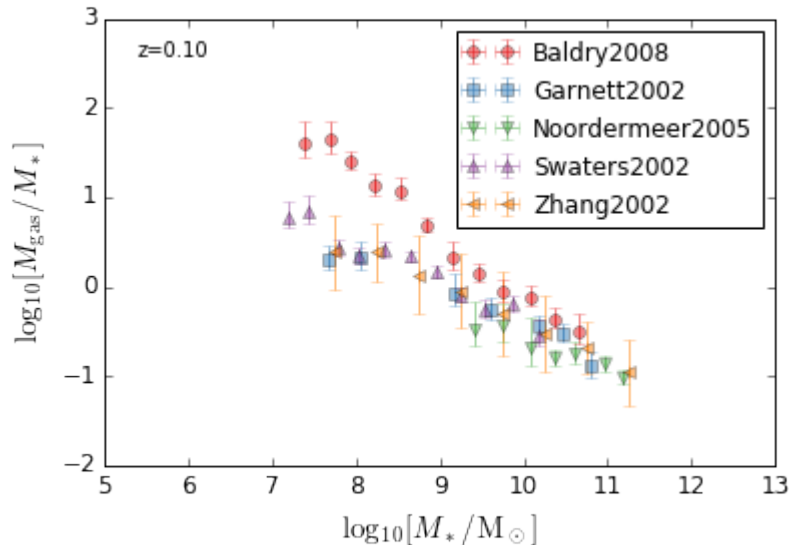
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```

data      = obs.target_observation['Data'][ii]
label     = obs.target_observation.index[ii]
datatype  = obs.target_observation['DataType'][ii]
color     = colors[ii]
marker    = markers[ii]
linestyle = linestyle[ii]
data      = np.log10(data)
if len(data)> 1e3:
    ax.hist2d(data[:,0], data[:,3],\
              range = [xlim, ylim], bins=50,\
              norm=LogNorm(), label=label, cmap=plt.get_cmap(color_maps[ii]))
    ax.text(0.05,0.05*ii, label, horizontalalignment='left', color=color,\
           verticalalignment='bottom', transform=ax.transAxes)
else:
    ax.errorbar(data[:,0], data[:,3],\
               xerr = [data[:,1]-data[:,0], data[:,0] - data[:,2]],\
               yerr = [data[:,4]-data[:,3], data[:,3] - data[:,5]],\
               label=label, color=color, fmt=marker, alpha=0.5)

ax.set_xlim(xlim)
ax.set_ylim(ylim)
ax.text(0.05,0.95, "z=%0.2f"%z, horizontalalignment='left',\
       verticalalignment='top', transform=ax.transAxes)
leg = ax.legend(loc='upper right')
ax.set_xlabel(xlabel)
ax.set_ylabel(ylabel)
    
```



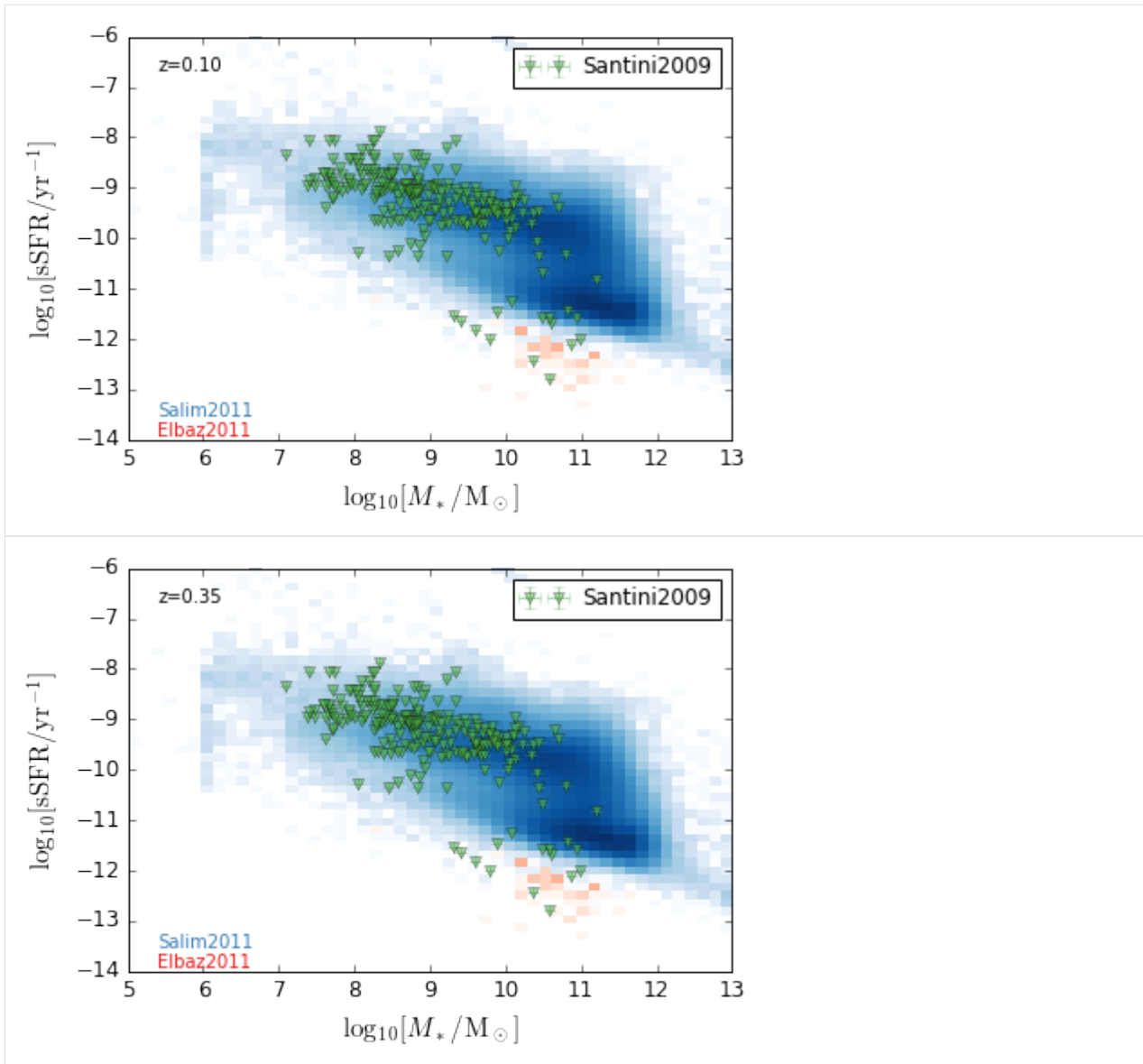
8.10 sSFR_StellarMass

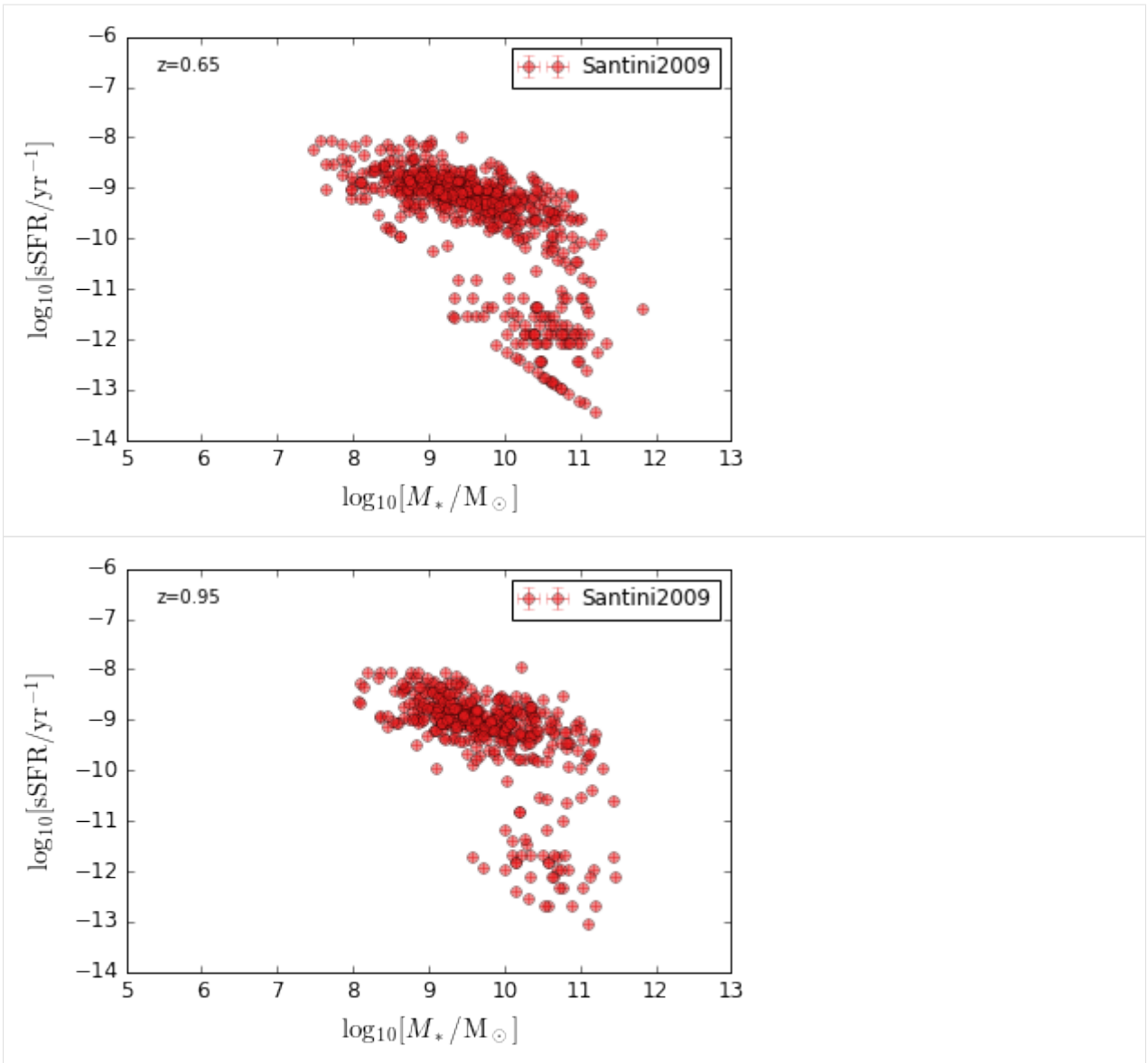
8.10.1 Blue

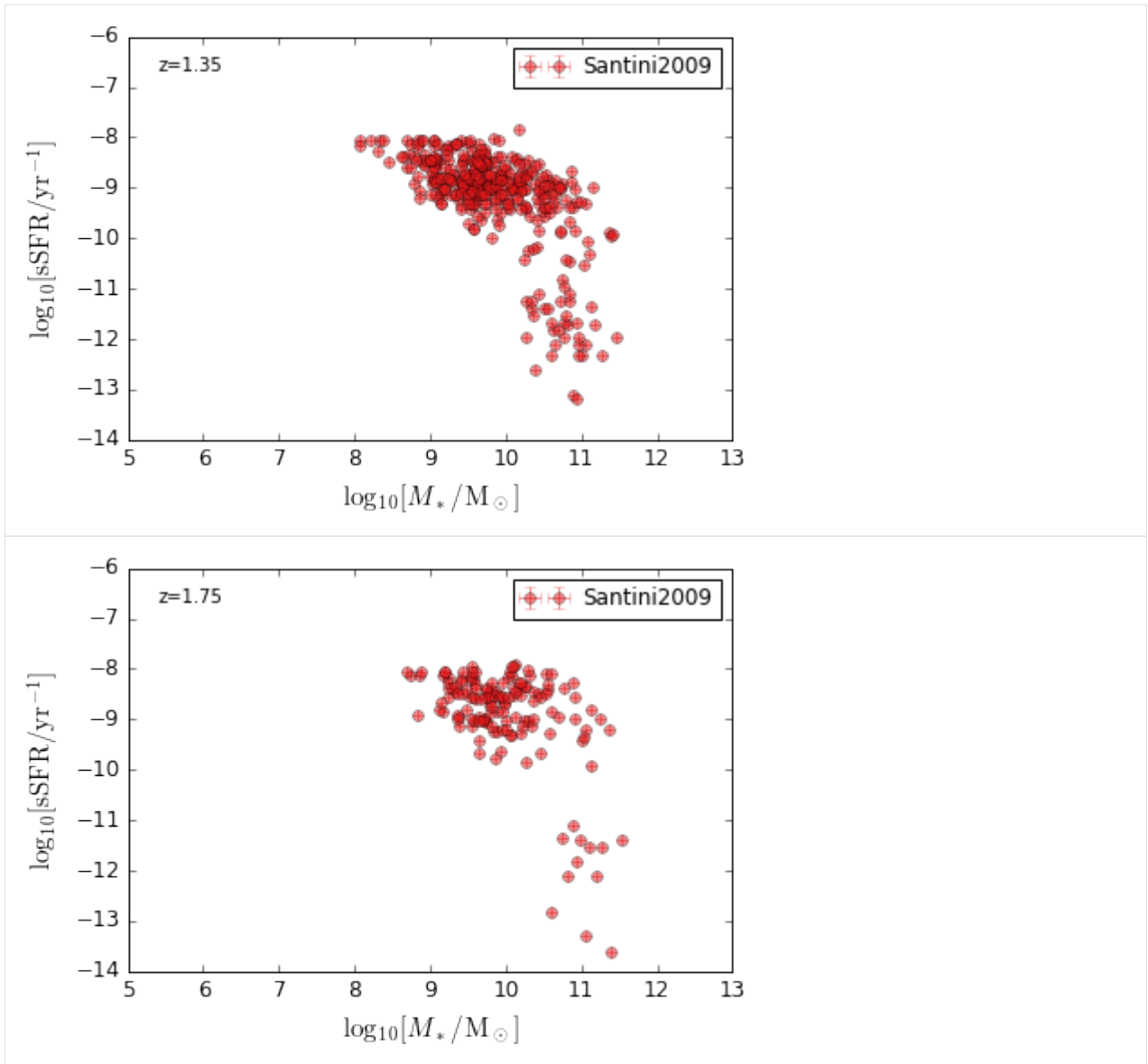
```
[20]: feature = 'sSFR_StellarMass_Blue'
xlim   = (5, 13)
ylim   = (-14, -6)
xlabel = r'$\log_{10}[M_*/{\rm M_\odot}]$'
ylabel = r"$\log_{10}[\rm sSFR/yr^{-1}]$"
zs     = [0.1, 0.35, 0.65, 0.95, 1.35, 1.75, 2.25, 2.75, 3.5]

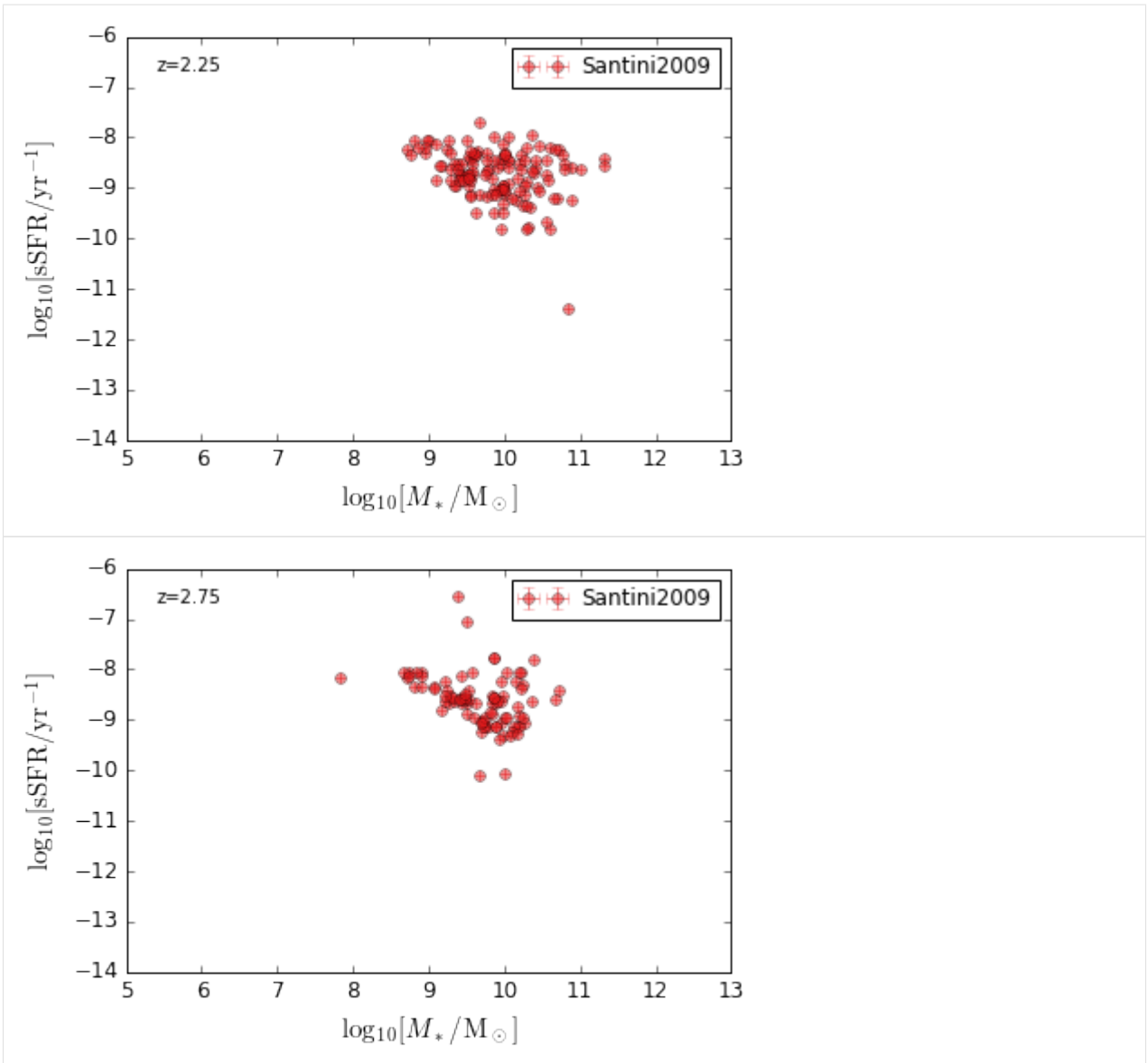
for z in zs:
    fig, ax = plt.subplots(1, 1)
    obs = correlation(feature=feature, z_target=z, quiet=1, h=cosmo['h'])
    for ii in range(obs.n_target_observation):
        data      = obs.target_observation['Data'][ii]
        label      = obs.target_observation.index[ii]
        datatype   = obs.target_observation['DataType'][ii]
        color      = colors[ii]
        marker     = markers[ii]
        linestyle  = linestyle[ii]
        data       = np.log10(data)
        if len(data) > 1e3:
            ax.hist2d(data[:, 0], data[:, 3], \
                      range = [xlim, ylim], bins=50, \
                      norm=LogNorm(), label=label, cmap=plt.get_cmap(color_maps[ii]))
            ax.text(0.05, 0.05*ii, label, horizontalalignment='left', color=color, \
                   verticalalignment='bottom', transform=ax.transAxes)
        else:
            ax.errorbar(data[:, 0], data[:, 3], \
                       xerr = [data[:, 1]-data[:, 0], data[:, 0] - data[:, 2]], \
                       yerr = [data[:, 4]-data[:, 3], data[:, 3] - data[:, 5]], \
                       label=label, color=color, fmt=marker, alpha=0.5)
    ax.set_xlim(xlim)
    ax.set_ylim(ylim)
    ax.text(0.05, 0.95, "z=%.2f"%z, horizontalalignment='left', \
           verticalalignment='top', transform=ax.transAxes)
    leg = ax.legend(loc='upper right')
    ax.set_xlabel(xlabel, fontsize=15)
    ax.set_ylabel(ylabel, fontsize=15)

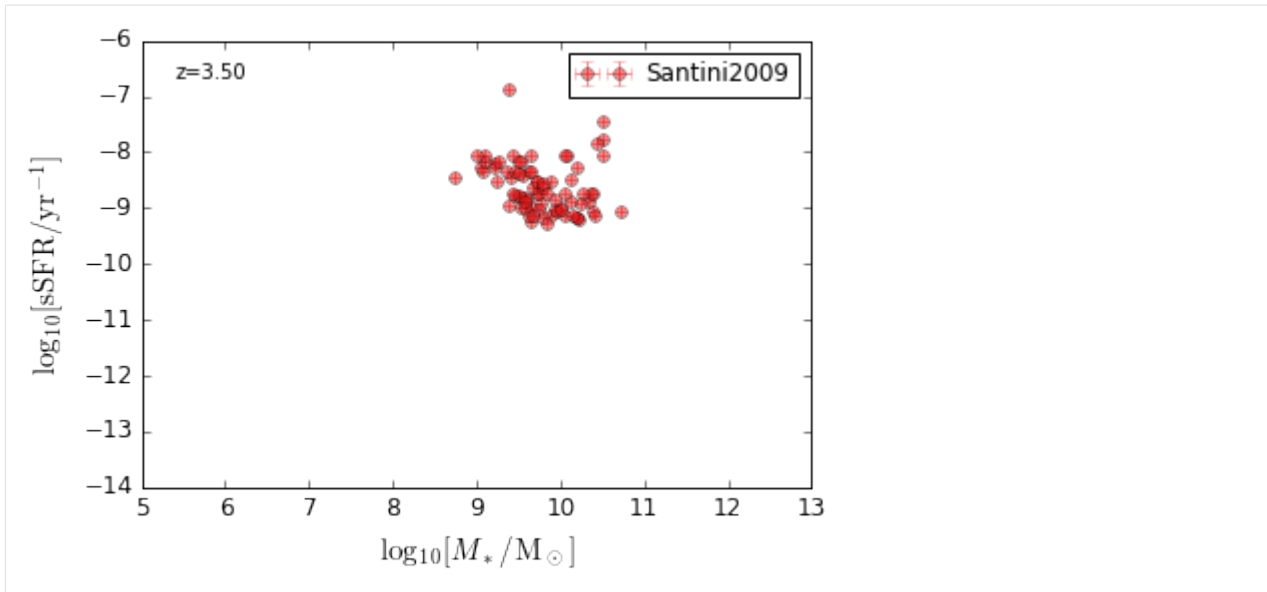
/home/yqin/3rd_party/lib/python3.6/site-packages/astrodatapy-0.0.dev23-py3.6.egg/astrodatapy/
↳ correlation.py:480: RuntimeWarning: overflow encountered in power
data = 10**data
```











8.11 HaloMass_StellarMass

8.11.1 all & Blue & Red

```
[21]: features = ['HaloMass_StellarMass', 'HaloMass_StellarMass_Blue', 'HaloMass_StellarMass_Red']
      xlim      = (9, 12)
      ylim      = (11, 14)
      xlabel    = r'$\log_{10}[M_{*}/M_{\odot}]$'
      ylabel    = r'$\log_{10}[M_{\rm vir}/M_{\odot}]$'
      zs        = [0.1,]
```

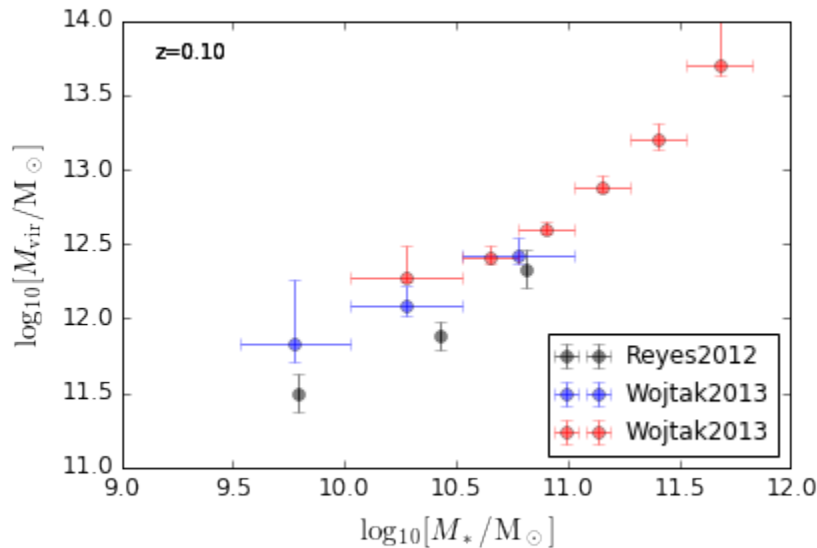
```
for z in zs:
    fig,ax = plt.subplots(1,1)
    for feature, color in zip(features, ['black', 'blue', 'red']):
        obs = correlation(feature=feature,z_target=z,quiet=1,h=cosmo['h'])
        for ii in range(obs.n_target_observation):
            data = obs.target_observation['Data'][ii]
            label = obs.target_observation.index[ii]
            datatype = obs.target_observation['DataType'][ii]
            marker = markers[ii]
            linestyle = linestyle[ii]
            data = np.log10(data)
            if len(data)> 1e3:
                ax.hist2d(data[:,0], data[:,3],\
                           range = [xlim, ylim], bins=50,\
                           norm=LogNorm(), label=label, cmap=plt.get_cmap(color_maps[ii]))
                ax.text(0.05,0.05*ii, label,horizontalalignment='left',color=color,\
                        verticalalignment='bottom',transform=ax.transAxes)
            else:
                ax.errorbar(data[:,0], data[:,3],\
                           xerr = [data[:,1]-data[:,0], data[:,0] - data[:,2]],\
```

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```
yerr = [data[:,4]-data[:,3], data[:,3] - data[:,5]],\
label=label,color=color,fmt=marker,alpha=0.5)

ax.set_xlim(xlim)
ax.set_ylim(ylim)
ax.text(0.05,0.95, "z=%.2f"%z, horizontalalignment='left',\
        verticalalignment='top', transform=ax.transAxes)
leg = ax.legend(loc='lower right')
ax.set_xlabel(xlabel)
ax.set_ylabel(ylabel)
```



8.12 QC_2PTCF

Quasar Clustering 2 Point Correlation Function

```
[22]: feature = 'QC_2PTCF'
xlim      = (-1, 3)
ylim      = (-3, 5.1)
xlabel    = r"$\log_{10}[r/\mathrm{cMpc}]$"
ylabel    = r"$\log_{10}\xi(r)$"
zs        = [4.5, 3.8, 3.2, 2.5, 1.5, 0.6]

for z in zs:
    fig, ax = plt.subplots(1, 1)
    obs      = clustering(feature=feature, z_target=z, quiet=1, h=cosmo['h'])
    j_data   = 0
    k_func   = 0
    for ii in range(obs.n_target_observation):
        data      = obs.target_observation['Data'][ii]
        label     = obs.target_observation.index[ii]
        datatype  = obs.target_observation['DataType'][ii]
        color     = colors[ii]
```

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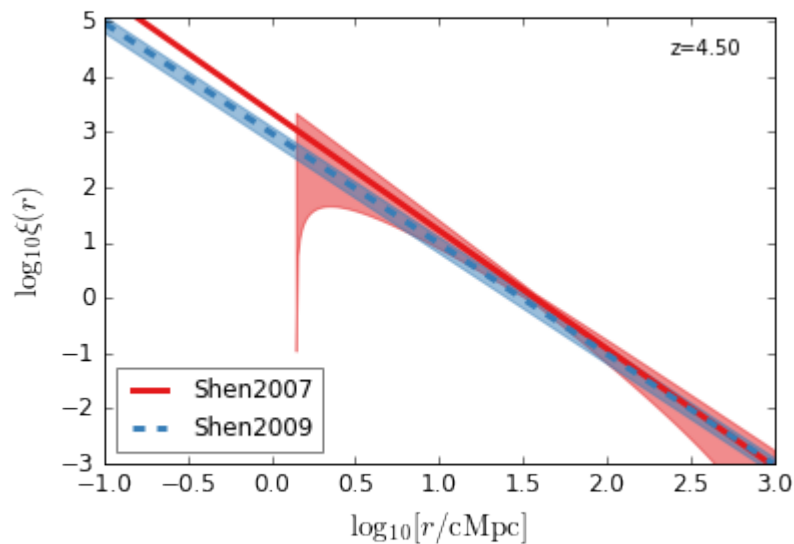
```

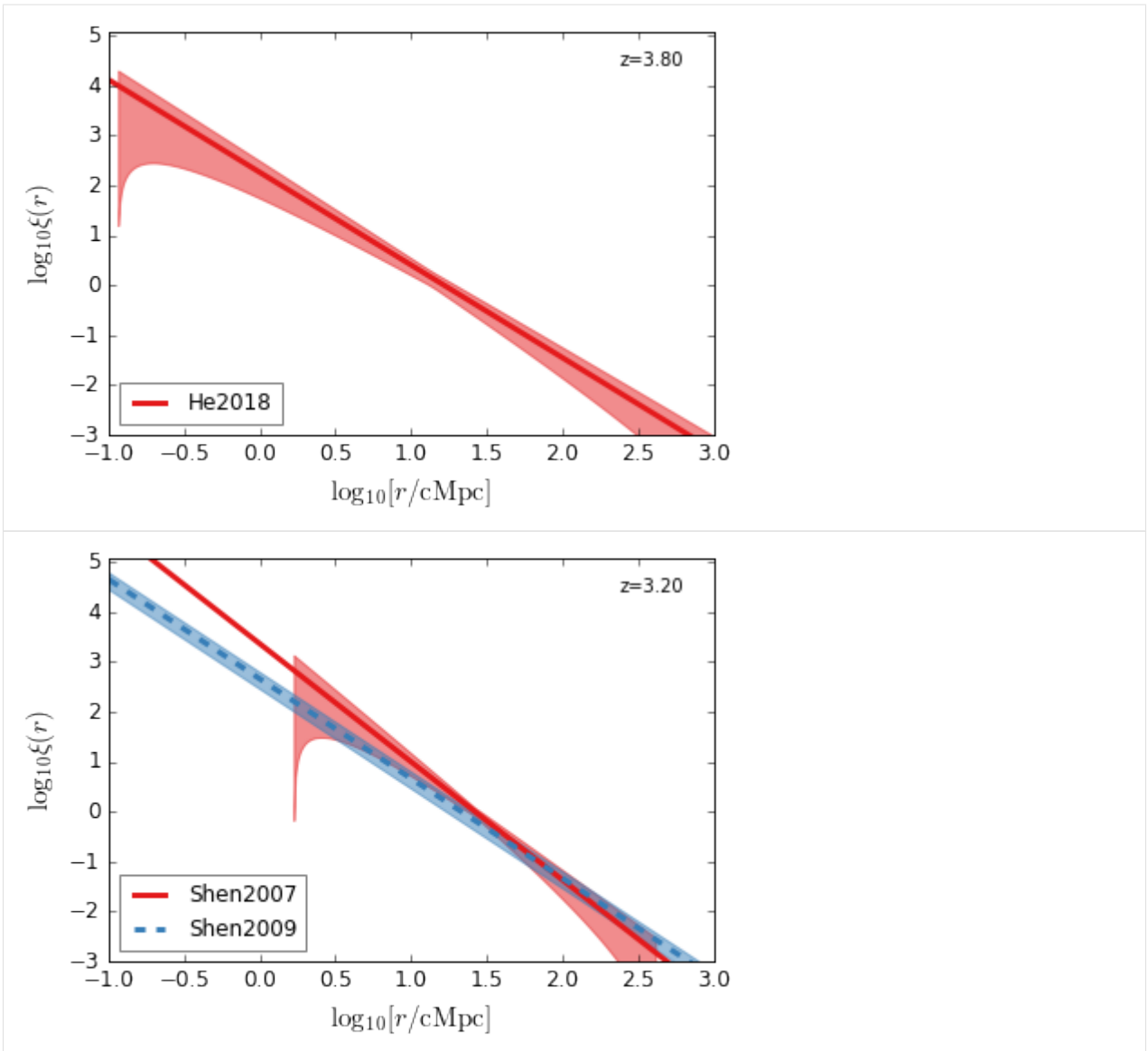
marker      = markers[j_data]
linestyle   = linestyles[k_func]
data        = np.log10(data)
if datatype == 'data':
    ax.errorbar(data[:,0], data[:,1], yerr = [data[:,1]-data[:,3],data[:,2]- data[:,
↪1]],\
                label=label,color=color,fmt=marker)
    j_data +=1
elif datatype == 'dataULimit':
    ax.errorbar(data[:,0], data[:,1], yerr = -0.2*data[:,1], uplims=True,\
                label=label,color=color,fmt=marker)
    j_data +=1
else:
    ax.plot(data[:,0],data[:,1],label=label,color=color,linestyle=linestyle,lw=3)
    ax.fill_between(data[:,0], data[:,2],data[:,3],color=color,alpha=0.5)
    k_func +=1

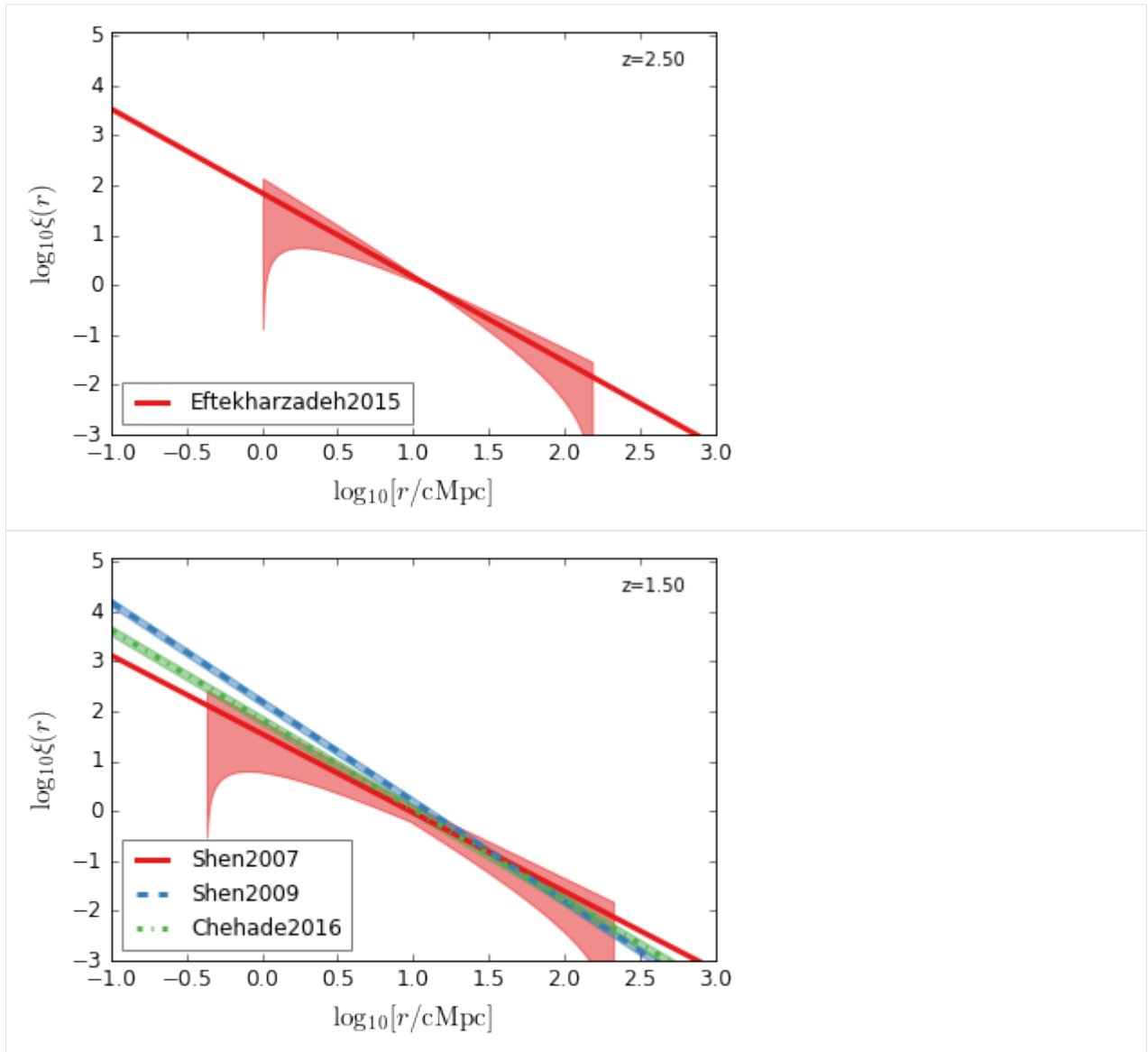
ax.set_xlim(xlim)
ax.set_ylim(ylim)
ax.text(0.95,0.95, "z=%0.2f"%z,horizontalalignment='right',\
        verticalalignment='top',transform=ax.transAxes)
leg = ax.legend(loc='lower left')
leg.get_frame().set_alpha(0.5)
ax.set_xlabel(xlabel)
ax.set_ylabel(ylabel)

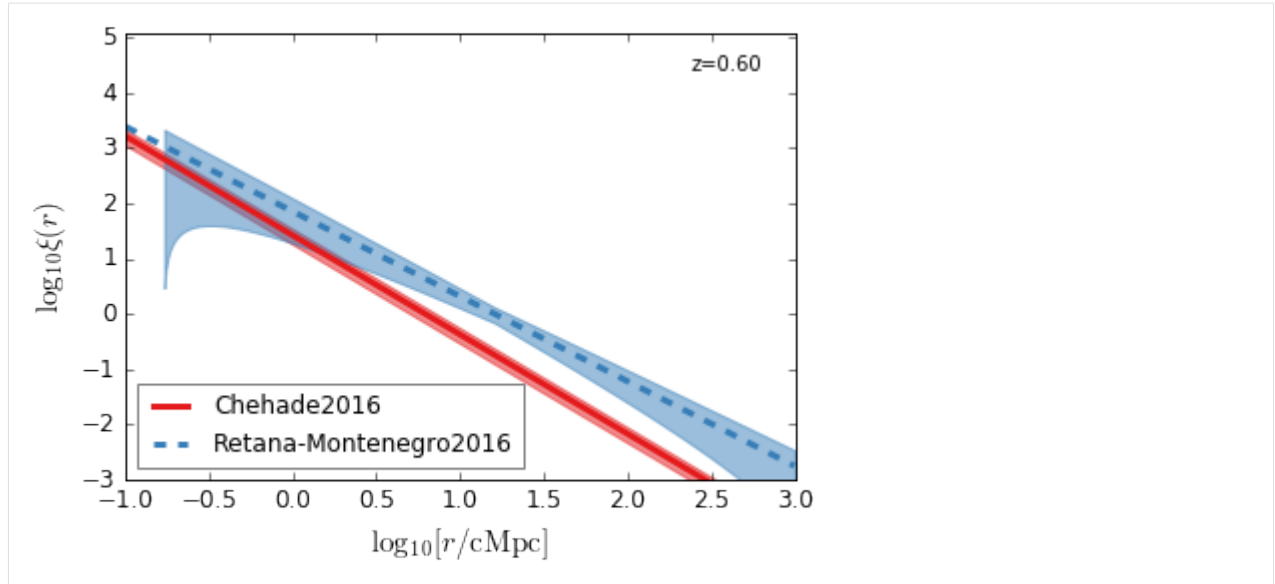
```

/home/yqin/3rd_party/lib/python3.6/site-packages/ipykernel_launcher.py:20: RuntimeWarning: ↪invalid value encountered in log10









[]:

Note: The layout of this directory is simply a suggestion. To follow traditional practice, do *not* edit this page, but instead place all documentation for the package inside `astrodatapy/`. You can follow this practice or choose your own layout.
