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Version 0.0
- The initial version of the old TSM_v11 that is now being tracked in Git.
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from __future__ import division
import numpy
import scipy.integrate
import pickle
import profiles
import time
import sys
import cosmo

# Constants and conversions
G = 4.3*10**(-9) #newton's constant in units of Mpc*(km/s)**2 / M_sun
c = 3e5 #speed of light km/s
sinGyr = 31556926.*10**9 # s in a Giga-year
kginMsun = 1.98892*10**30 # kg in a solar mass
kminMpc = 3.08568025*10**19 # km in a Megaparsec
minMpc = 3.08568025*10**22 # m in a Megaparsec
r2d = 180/numpy.pi # radians to degrees conversion factor

def randdraw(A,index=None):
    """
    This function randomly draws a variable from either and input gaussian
    distribution or an array of random draws from a parent distribution function
    (e.g. bootstrap sampling).
    Input:
    A = [(float, float) or (1D array of floats)] If (float, float) is input then
        it is interpreted as (mu, sigma) of a Gaussian distribution. If (1D
        array of floats with length > 2) then it is interpreted as a random
        sample from a parent distribution.
    index = [int] rather than drawing a random value from the array the value
    Output:
    a = [float] a random draw from either the Gaussian or sample distribution.
    """
    N_A = numpy.size(A)
    if N_A == 2: #then assumed (mu, sigma) format
        a = A[0]+A[1]*numpy.random.randn()
    elif N_A > 2: #Then assume distribution array format
        if index == None:
            index = numpy.random.randint(N_A)
        a = A[index]
    elif N_A < 2:
        print 'MCMAC.randdraw: Error, parameter input array is not a valid size, exiting'
        sys.exit()
    return a, index

def vrad(z1,z2):
    """
    Given the redshifts of the two subclusters this function calculates their
    relative line-of-sight velocity (km/s).
    Input:
    z1 = [float] redshift of subcluster 1
    z2 = [float] redshift of subcluster 2
    Output:
    v_los = [float; units:km/s] line-of-sight relative velocity of the two
    subclusters
    """
    v1 = ((1+z1)**2-1)/((1+z1)**2+1)*c
    v2 = ((1+z2)**2-1)/((1+z2)**2+1)*c
    return numpy.abs(v1-v2)/(1-v1*v2/c**2)

def f(x,a,b):
    """
    This is the functional form of the time since merger integral for two point
    masses.
    """

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    return 1/numpy.sqrt(a+b/x)
def TSMptpt(m_1,m_2,r_200_1,r_200_2,d_end,E):
    """
    This function calculates the time it takes for the system to go from a
    separation of r_200_1+r_200_2 to d_end. It is based on the equations of
    motion of two point masses, which is valid in the regime where the
    subclusters no longer overlap.
    Input:
    m_1 = [float; units: M_sun] mass of subcluster 1
    m_2 = [float; units: M_sun] mass of subcluster 2
    r_200_1 = [float; units: Mpc] NFW r_200 radius of subcluster 1
    r_200_2 = [float; units: Mpc] NFW r_200 radius of subcluster 2
    d_end = [float; units: Mpc] the final separation of interest
    E = [float; units: (km/s)^2*M_sun] the total energy (PE+KE) of the two subcluster system
    Output:
    t = [float; units: Gyr] the time it takes for the system to go from a
    separation of r_200_1+r_200_2 to d_end
    """
    d_start = r_200_1+r_200_2
    C = G*m_1*m_2
    mu = m_1*m_2/(m_1+m_2)
    if E < 0:
        integral = scipy.integrate.quad(lambda x: f(x,E,C),d_start,d_end)[0]
        t = numpy.sqrt(mu/2)*integral/sinGyr*kminMpc
    else:
        print 'TSMptpt: error total energy should not be > 0, exiting'
        sys.exit()
    if t < 0:
        print 'TSM < 0 encountered'
    return t

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def PEnfnfw(d,m_1,rho_s_1,r_s_1,r_200_1,m_2,rho_s_2,r_s_2,r_200_2,N=100):
    """
    This function calculates the potential energy of two truncated NFW halos.
    Input:
    d = [float; units:Mpc] center to center 3D separation of the subclusters
    m_1 = [float; units:M_sun] mass of subcluster 1 out to r_200
    rho_s_1 = [float; units:M_sun/Mpc^3] NFW scale density of subcluster 1
    r_s_1 = [float; units:Mpc] NFW scale radius of subcluster 1
    r_200_1 = [float; units:Mpc] r_200 of subcluster 1
    m_2 = [float; units:M_sun] mass of subcluster 2 out to r_200
    rho_s_2 = [float; units:M_sun/Mpc^3] NFW scale density of subcluster 2
    r_s_2 = [float; units:Mpc] NFW scale radius of subcluster 2
    r_200_2 = [float; units:Mpc] r_200 of subcluster 2
    N = [int] number of mass elements along one coordinate axis for numerical
    integration approximation
    Output:
    V_total = [float; units:(km/s)^2*M_sun] total potential energy of the two
    subcluster system
    """
    if d >= r_200_1+r_200_2:
        V_total = -G*m_1*m_2/d
    else:
        # mass element sizes
        dr = r_200_2/N
        dt = numpy.pi/N
        i,j = numpy.meshgrid(numpy.arange(N),numpy.arange(N))
        # distance of 2nd NFW halo mass element from center of 1st NFW halo
        r = numpy.sqrt(((2*i+1)*dr/2*numpy.sin((2*j+1)*dt/2))**2+
            (d+(2*i+1)*dr/2*numpy.cos((2*j+1)*dt/2))**2)
        #mass elements of 2nd NFW halo
        m = 2*numpy.pi*rho_s_2*r_s_2**3*(numpy.cos(j*dt)-numpy.cos((j+1)*dt))*(1/(1+
        (i+1)*dr/r_s_2)-1/(1+i*dr/r_s_2)+numpy.log(((i+1)*dr+r_s_2)/(i*dr+r_s_2)))
        #determine if 2nd halo mass element is inside or outside of 1st halo
        mask_gt = r>=r_200_1
        mask_lt = r<r_200_1
        # potential energy of each mass element (km/s)^2 * M_sun
        # NFW PE

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    V_nfw = numpy.sum(-4*numpy.pi*G*rho_s_1*r_s_1**3/(r[mask_lt]+dr)*(numpy.log(1+
(r[mask_lt]+dr)/r_s_1)-(r[mask_lt]+dr)/(r_s_1+r_200_1))*m[mask_lt])
    # Point mass PE
    V_pt = numpy.sum(-G*m_1*m[mask_gt]/r[mask_gt])
    V_total = V_nfw+V_pt
    return V_total

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def NFWprop(M_200,z,c):
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Determines the NFW halo related properties. Added this for the case of user specified concentration.

Input:

M\_200 = [float; units:M\_sun] mass of the halo. Assumes M\_200 with respect to the critical density at the halo redshift.

z = [float; unitless] redshift of the halo.

c = [float; unitless] concentration of the NFW halo.

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# CONSTANTS

rho\_cr = cosmo.rhoCrit(z)/kginMsun\*minMpc\*\*3

#calculate the r\_200 radius

r\_200 = (M\_200\*3/(4\*numpy.pi\*200\*rho\_cr))\*\*(1/3.)

del\_c = 200/3.\*c\*\*3/(numpy.log(1+c)-c/(1+c))

r\_s = r\_200/c

rho\_s = del\_c\*rho\_cr

return del\_c, r\_s, r\_200, c, rho\_s

```
def MCEngine(N_mc,M1,M2,Z1,Z2,D_proj,prefix,C1=None,C2=None,del_mesh=100,TSM_mesh=200):
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This is the Monte Carlo engine that draws random parameters from the measured distributions and then calculates the kinematic parameters of the merger.

Input:

N\_mc = [int] number of successful Monte Carlo samplings to perform

M1 = [(float, float) or (1D array of floats); units:M\_sun] M\_200 of subcluster 1. If (float, float) is input then it is interpreted as (mu, sigma) of a Gaussian distribution. If (1D array of floats with length > 2) then it is interpreted as a random sample from a parent distribution.

M2 = [(float, float) or (1D array of floats); units:M\_sun] M\_200 of subcluster 2. Must have same format as M1.

Z1 = [(float, float) or (1D array of floats)] redshift of subcluster 1. Similar input format to M1.

Z2 = [(float, float) or (1D array of floats)] redshift of subcluster 2. Similar input format to M1.

D\_proj = [(float, float, float) or (1D array of floats); units:Mpc] projected separation of the two subclusters. If (float, float, float) is input then it is interpreted as (d\_proj, c1\_sigma, c2\_sigma), where d\_proj is the projected distance of the two halos and c1\_sigma and c2\_sigma are the centroid errors of each halo. If (1D array of floats with length > 3) then it is interpreted as a random sample from the parent distribution of d\_proj.

prefix = [string] prefix to attach to all output

C1 = [(float, float) or (1D array of floats); unitless] NFW concentration of subcluster 1. If (float, float) is input then it is interpreted as (mu, sigma) of a Gaussian distribution. If (1D array of floats with length > 2) then it is interpreted as a random sample from a parent distribution. If None then Duffey et al. (2008) scaling relation is used to determine the concentration based on M1 value. Must have same format as M1.

C2 = [(float, float) or (1D array of floats); unitless] NFW concentration of subcluster 2. Must have same format as M2.

del\_mesh = [int] number of mass elements along one coordinate axis for numerical integration approximation of potential energy

TSM\_mesh = [int] number of elements along the separation axis when performing the numerical integration approximation of the TSM

Output:

In general the 1D arrays of floats are output for each of the following parameters. The Nth element of each array corresponds to the system properties of the Nth viable solution.

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m_1_out = [units: M_sun] M_200 of halo 1
m_2_out = [units: M_sun] M_200 of halo 1
z_1_out = redshift of halo 1
z_2_out = redshift of halo 2
alpha_out = [units: degrees] merger axis angle with respect to the plane of
    the sky. 0 corresponds to in the plane of the sky, 90 corresponds to
    along the line-of-sight.
d_proj_out = [units: Mpc] projected center to center separation of the
    halos in observed state
d_3d_out = [units: Mpc] 3D center to center separation of the halos in
    observed state
d_max_out = [units: Mpc] 3D maximum center to center separation of the two
    halo at the apoapsis
v_rad_obs_out = [units: km/s] relative line-of-sight velocity of the two
    halos at the observed time
v_3d_obs_out = [units: km/s] relative 3D velocity of the two halos at the
    observed time
v_3d_col_out = [units: km/s] relative 3D velocity of the two halos at the
    collision time
TSM_0_out = [units: Gyr] time it took the system to reach the observed state
    from the collision state. Assuming the system has not reached its
    apoapsis since colliding.
TSM_1_out = [units: Gyr] time it took the system to reach the observed state
    from the collision state. Assuming the system has passed through the
    apoapsis once since colliding.
T_out = [units: Gyr] period of the system
prob_out = This is the probability of observing the system with the randomly
    drawn parameters. This accounts for the fact that it is more likely to
    observe the system near the apoapsis rather than with zero separation,
    due to the system spending more of its time at large separation. Simply
    an effect of the velocity of the system.
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# Verify user input
# Check to make sure mass inputs for each halo are the same
N_M1 = numpy.size(M1)
N_M2 = numpy.size(M2)
if N_M1 != N_M2:
    print 'MCMAC.MCengine: Error, the mass inputs for the two halos must \
        be the same type and size. For example, you cannot mix input \
        format (mu, sigma) for halo1 with (1D array of floats) format \
        for halo 2. Nor can the size of the (1D array of floats) input \
        be different. This is to facilitate correct covariance handling. \
        Exiting.'
    sys.exit()

if C1 != None or C2 != None:
    N_C1 = numpy.size(C1)
    N_C2 = numpy.size(C2)
    if N_C1 != N_M1 or N_C2 != N_M2:
        print 'MCMAC.MCengine: Error, the concentration inputs for the two \
            halos must be the same type and size as the mass inputs. For \
            example, you cannot mix input format (mu, sigma) for M1 with \
            (1D array of floats) format for C1, or vice versa. Nor can the size\
            of the (1D array of floats) input be different. This is to \
            facilitate correct covariance handling. Exiting.'
        sys.exit()
    elif N_M1 > 2:
        print 'MCMAC.MCengine: Assuming that the order and values of the \
            C1 and C2 (1D array of floats) are correlated with the order and \
            values of the M1 and M2 (1D array of floats). This is meant to \
            maintain proper covariance.'

N_D_proj = numpy.size(D_proj)
if N_D_proj == N_M1:
    print 'MCMAC.MCengine: Assuming that the order and values of the \
        D_proj (1D array of floats) are correlated with the order and values of\
        the M1 and M2 (1D array of floats). This is meant to maintain proper\
        covariance.'

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N_Z1 = numpy.size(Z1)
if N_Z1 == N_D_proj:
    print 'MCMAC.MCengine: Warning. It is currently assumed that the halo\
redshifts and projected separation estimates are uncorrelated. \
Covariance will not be handled correctly.'
if N_Z1 >2 and N_Z1 == N_M1:
    print 'MCMAC,MCengine: Warning. It is currently assumed that the halo \
redshifts and mass estimates are uncorrelated. Covariance will not be \
handled correctly.'

i = 0
# Create the output arrays
m_1_out = numpy.zeros(N_mc)
m_2_out = numpy.zeros(N_mc)
z_1_out = numpy.zeros(N_mc)
z_2_out = numpy.zeros(N_mc)
d_proj_out = numpy.zeros(N_mc)
v_rad_obs_out = numpy.zeros(N_mc)
alpha_out = numpy.zeros(N_mc)
v_3d_obs_out = numpy.zeros(N_mc)
d_3d_out = numpy.zeros(N_mc)
v_3d_col_out = numpy.zeros(N_mc)
d_max_out = numpy.zeros(N_mc)
TSM_0_out = numpy.zeros(N_mc)
TSM_1_out = numpy.zeros(N_mc)
T_out = numpy.zeros(N_mc)
prob_out = numpy.zeros(N_mc)

N_d = numpy.size(D_proj)
t_start = time.time()
while i < N_mc:
    # Draw random mass and redshift parameters
    m_1, index = randdraw(M1)
    m_2, index = randdraw(M2,index)
    if m_1 <= 0 or m_2 <=0:
        # Discard these unphysical draws, this can happen if a Gaussian
        # distribution is specified since at least part of the tail will be
        # in the negative mass range.
        continue
    z_1, temp = randdraw(Z1)
    z_2, temp = randdraw(Z2)

    # Draw random projected separation
    if N_d == 3: #then assumed (D_proj, c1_sigma, c2_sigma)
        #draw del_r1, del_r2, phi1 and phi2, where phi is the
        del_r_1 = D_proj[1] * numpy.random.randn()
        del_r_2 = D_proj[2] * numpy.random.randn()
        phi_1 = numpy.random.rand()*2*numpy.pi
        phi_2 = numpy.random.rand()*2*numpy.pi
        #calculate the projected separation based on drawn centers
        d_proj = numpy.sqrt((D_proj[0]-del_r_1*numpy.cos(phi_1)+del_r_2*numpy.cos(phi_2))*2+
        (del_r_1*numpy.sin(phi_1)+del_r_2*numpy.sin(phi_2))*2)
    elif N_d > 3: #then assume distribution array format
        if N_D_proj == N_M1:
            # assume D_proj array values and order correlated with M1 and M2
            # array values and order.
            d_proj, index = randdraw(D_proj,index)
        else:
            # assume D_proj is uncorrelated with M1 and M2
            d_proj = D_proj[numpy.random.randint(N_d)]
    elif N_d < 3:
        print 'MCMAC.MCengine: Error, D_proj parameter input array is not a valid size,
exiting'
        sys.exit()
    d_proj = abs(d_proj)

    # Define NFW halo properties
    if C1 == None:
        # Then use scaling relation to determine concentration

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del_c_1, r_s_1, r_200_1, c_1, rho_s_1 = profiles.nfwparam_extended(m_1/1e14,z_1)
else:
    # Then user specified concentration
    # Draw random concentration parameter
    c_1, index = randdraw(C1,index)
    del_c_1, r_s_1, r_200_1, c_1, rho_s_1 = NFWprop(m_1,z_1,c_1)
if C2 == None:
    del_c_2, r_s_2, r_200_2, c_2, rho_s_2 = profiles.nfwparam_extended(m_2/1e14,z_2)
else:
    c_2, index = randdraw(C2,index)
    del_c_2, r_s_2, r_200_2, c_2, rho_s_2 = NFWprop(m_2,z_2,c_2)

# Reduced mass
mu = m_1*m_2/(m_1+m_2)

# Calculate potential energy at time of collision
PE_col = PEnfwnfw(0,m_1,rho_s_1,r_s_1,r_200_1,m_2,rho_s_2,r_s_2,r_200_2,N=del_mesh)

# Calculate maximum 3D free-fall velocity
# Note that this assumes that the clusters begin with infinite
# separation and their observed mass. It also guarantees that all
# solutions will be for a bound system.
v_3d_max = numpy.sqrt(-2/mu*PE_col)

# Calculate observed radial velocity
v_rad_obs = vrad(z_1,z_2)

# Draw a random alpha, merger axis angles with respect to the sky
ALPHA = numpy.random.rand()*numpy.pi/2
#Since not all alpha are equally likely.
alpha = (1-numpy.cos(ALPHA))*numpy.pi/2

# Calculate the 3D velocity at observed time
v_3d_obs = v_rad_obs/numpy.sin(alpha)

if v_3d_obs > v_3d_max:
    # then the randomly chosen alpha is not valid
    continue

# Calculate the 3D separation
d_3d = d_proj/numpy.cos(alpha)

# Calculate the potential energy at observed time
PE_obs = PEnfwnfw(d_3d,m_1,rho_s_1,r_s_1,r_200_1,m_2,rho_s_2,r_s_2,r_200_2,N=del_mesh)

# Calculate the 3D velocity at collision time
v_3d_col = numpy.sqrt(v_3d_obs**2+2/mu*(PE_obs-PE_col))

if v_3d_col > v_3d_max:
    # then the randomly chosen alpha is not valid
    continue

# Total Energy
E = PE_obs+mu/2*v_3d_obs**2

# Calculate PE from d = 0 to r_200_1+r_200_2
del_TSM_mesh = (r_200_1+r_200_2)/(TSM_mesh-1)
d = numpy.arange(0.00001,(r_200_1+r_200_2)+del_TSM_mesh,del_TSM_mesh)
PE_array = numpy.zeros(TSM_mesh)
for j in numpy.arange(TSM_mesh):
    PE_array[j] =
PEnfwnfw(d[j],m_1,rho_s_1,r_s_1,r_200_1,m_2,rho_s_2,r_s_2,r_200_2,N=del_mesh)

# Calculate d_max
if E >= -G*m_1*m_2/(r_200_1+r_200_2):
    # then d_max > r_200_1+r_200_2
    d_max = -G*m_1*m_2/E
else:
    # d_max <= r_200_1+r_200_2

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## find closet d value less than d_max
#idx=(numpy.abs(PE_array-E)).argmin()
#d_max = d[idx]
# determine d_max, ensuring that E is always > PE
mask_tmp = E >= PE_array
d_max = d[mask_tmp][-1]

# Calculate TSM_0
if d_3d >= r_200_1+r_200_2:
    # then halos no longer overlap
    # calculate the time it takes to go from d=0 to r_200_1+r_200_2
    TSM_0a = numpy.sum(del_TSM_mesh/numpy.sqrt(2/mu*(E-PE_array))*kminMpc/sinGyr)
    # calculate the time it takes to go from d = r_200_1+r_200_2 to d_3d
    TSM_0b = TSMptpt(m_1,m_2,r_200_1,r_200_2,d_3d,E)
    TSM_0 = TSM_0a+TSM_0b
else:
    # then d_3d < r_200_1+r_200_2, halos always overlap
    # calculate the time it takes to go from d=0 to d_3d
    mask = d <= d_3d
    TSM_0 = numpy.sum(del_TSM_mesh/numpy.sqrt(2/mu*(E-PE_array[mask]))*kminMpc/sinGyr)

# Check that TSM_0 < Age of Universe at (z_1+z_2)/2
age = cosmo.age((z_1+z_2)/2)
if TSM_0 > age:
    # unlikely that this system could occur
    continue

# Calculate period
if E >= -G*m_1*m_2/(r_200_1+r_200_2):
    # then d_max > r_200_1+r_200_2
    # calculate the time it takes to go from d = r_200_1+r_200_2 to d_max
    if d_3d < r_200_1+r_200_2:
        #then TSM_0a has not been previously defined
        TSM_0a = numpy.sum(del_TSM_mesh/numpy.sqrt(2/mu*(E-PE_array))*kminMpc/sinGyr)
    TSM_0b = TSMptpt(m_1,m_2,r_200_1,r_200_2,d_max,E)
    T = 2*(TSM_0a+TSM_0b)
else:
    # then d_max < r_200_1+r_200_2
    # calculate the time it takes to go from d=0 to d_max
    mask = d <= d_max
    T = 2*numpy.sum(del_TSM_mesh/numpy.sqrt(2/mu*(E-PE_array[mask]))*kminMpc/sinGyr)

# Calculate probability of d_3d
prob = TSM_0/(T/2)

# Calculate TSM_1
TSM_1 = T-TSM_0

if TSM_0 < 0:
    print 'TSM < 0 encountered'

# Write calculated merger parameters
m_1_out[i] = m_1
m_2_out[i] = m_2
z_1_out[i] = z_1
z_2_out[i] = z_2
d_proj_out[i] = d_proj
v_rad_obs_out[i] = v_rad_obs
alpha_out[i] = alpha*180/numpy.pi
v_3d_obs_out[i] = v_3d_obs
d_3d_out[i] = d_3d
v_3d_col_out[i] = v_3d_col
d_max_out[i] = d_max
TSM_0_out[i] = TSM_0
TSM_1_out[i] = TSM_1
T_out[i] = T
prob_out[i] = prob

i+=1

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# Estimate calculation time
if i== 10 or i == 100 or i%1000 == 0:
    del_t = time.time()-t_start
    t_total = N_mc*del_t/i
    eta = (t_total-del_t)/60
    print 'Completed Monte Carlo iteration {0} of {1}.'.format(i,N_mc)
    print '~{0:0.0f} minutes remaining'.format(eta)

# Pickle the results of the MC analysis
filename = prefix+'_m_1.pickle'
F = open(filename,'w')
pickle.dump(m_1_out,F)
F.close()
filename = prefix+'_m_2.pickle'
F = open(filename,'w')
pickle.dump(m_2_out,F)
F.close()
filename = prefix+'_z_1.pickle'
F = open(filename,'w')
pickle.dump(z_1_out,F)
F.close()
filename = prefix+'_z_2.pickle'
F = open(filename,'w')
pickle.dump(z_2_out,F)
F.close()
filename = prefix+'_d_proj.pickle'
F = open(filename,'w')
pickle.dump(d_proj_out,F)
F.close()
filename = prefix+'_v_rad_obs.pickle'
F = open(filename,'w')
pickle.dump(v_rad_obs_out,F)
F.close()
filename = prefix+'_alpha.pickle'
F = open(filename,'w')
pickle.dump(alpha_out,F)
F.close()
filename = prefix+'_v_3d_obs.pickle'
F = open(filename,'w')
pickle.dump(v_3d_obs_out,F)
F.close()
filename = prefix+'_d_3d.pickle'
F = open(filename,'w')
pickle.dump(d_3d_out,F)
F.close()
filename = prefix+'_v_3d_col.pickle'
F = open(filename,'w')
pickle.dump(v_3d_col_out,F)
F.close()
filename = prefix+'_d_max.pickle'
F = open(filename,'w')
pickle.dump(d_max_out,F)
F.close()
filename = prefix+'_TSM_0.pickle'
F = open(filename,'w')
pickle.dump(TSM_0_out,F)
F.close()
filename = prefix+'_TSM_1.pickle'
F = open(filename,'w')
pickle.dump(TSM_1_out,F)
F.close()
filename = prefix+'_T.pickle'
F = open(filename,'w')
pickle.dump(T_out,F)
F.close()
filename = prefix+'_prob.pickle'
F = open(filename,'w')
pickle.dump(prob_out,F)

```



```
F.close()
```

```
return
```

```
m_1_out,m_2_out,z_1_out,z_2_out,d_proj_out,v_rad_obs_out,alpha_out,v_3d_obs_out,d_3d_out,v_3d_col_  
out,d_max_out,TSM_0_out,TSM_1_out,T_out,prob_out
```