

CATAM 14.5 Cosmological Distances

1 Distances and Time

1.1 Lookback Time

The lookback time t_L is the difference between the current age of the universe and the time at which a photon was emitted.

$$t_L = t_H \int_0^z \frac{dz'}{(1+z')E(z')} \quad (1)$$

With t_H the Hubble time and $E(z) = \sqrt{\Omega_m(1+z)^3 + \Omega_k(1+z)^2 + \Omega_\Lambda}$

Considering the Einstein-de-Sitter model Universe ($\Omega_m = 1$, $\Omega_\Lambda = 0$), we can easily compute the age of the Universe.

$$t_0 = t_H \int_0^\infty (1+z')^{-\frac{5}{2}} dz' = -\frac{2}{3} t_H (1+z')^{-\frac{3}{2}} \Big|_0^\infty = \frac{2}{3} t_H$$

1.1.1 Question 2

We will consider four distinct models of the universe:

- Einstein-de-Sitter universe ($\Omega_m = 1$, $\Omega_\Lambda = 0$)
- Classical closed universe ($\Omega_m = 2$, $\Omega_\Lambda = 0$)
- Baryon dominated low density universe ($\Omega_m = 0.04$, $\Omega_\Lambda = 0$)
- Currently popular universe ($\Omega_m = 0.27$, $\Omega_\Lambda = 0.73$)

A program has been written to tabulate and graph results for lookback times in each of these models. It is called ***Q2.py*** and can be found in Section 3.

| Redshift | Einstein-de-Sitter | Classical closed | Baryon Dominated | Currently Popular |
|----------|--------------------|------------------|------------------|-------------------|
| 0.1 | 12.06762 | 11.80719 | 12.34083 | 12.68661 |
| 1.0 | 58.55965 | 52.94232 | 67.42440 | 76.28055 |
| 2.0 | 73.15351 | 64.55459 | 89.44977 | 101.87216 |
| 4.0 | 82.48464 | 71.64913 | 106.62361 | 119.34947 |
| 6.7 | 86.34735 | 74.50169 | 115.30207 | 126.735608 |
| 10000 | 90.87743 | 77.90534 | 128.53490 | 135.05773 |

Table 1: Lookback times in 100 million years for various redshifts, assuming $H_0 = 72 \text{kms}^{-1} \text{Mpc}^{-1}$.

Note that in the last entry the maximum redshift is so high that the tail of the integral in equation 1 can be safely ignored. As such this gives a close approximation for the age of the universe.

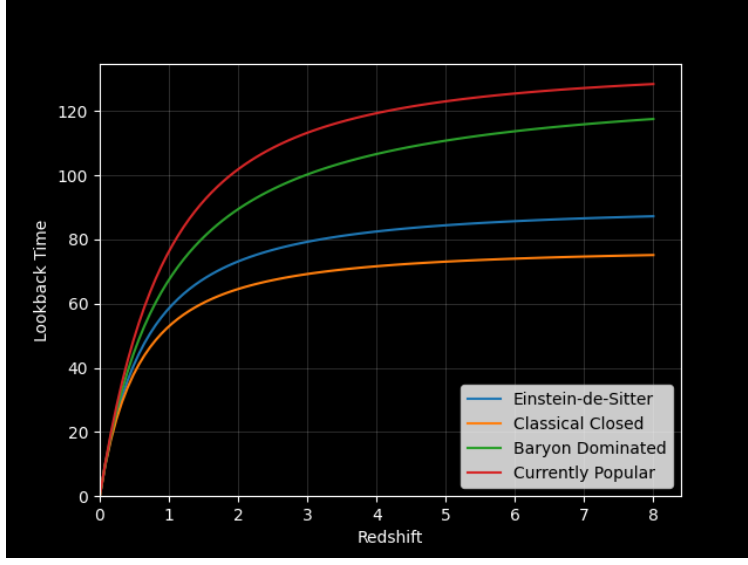


Figure 1: Lookback time graphed against redshift for various universes

We observe in Figure 1 that the lookback time is an increasing function with respect to redshift and plateaus as $z \rightarrow \infty$, so we can argue that it represents the age of the universe.

1.2 Distance Measures

Considering the Einstein-de-Sitter model Universe ($\Omega_k = 0$), we get an expression for D_A in:

$$D_A = \frac{D_C}{1+z} = \frac{D_H}{1+z} \int_0^z \frac{dz'}{E(z')} = \frac{D_H}{1+z} \int_0^z (1+z')^{-\frac{3}{2}} dz' = \frac{2D_H}{1+z} - \frac{2D_H}{(1+z)^{\frac{3}{2}}}$$

Finding stationary points:

$$\begin{aligned} \frac{dD_A}{dz} &= -\frac{2D_H}{(1+z)^2} + \frac{3D_H}{(1+z)^{\frac{5}{2}}} = 0 \\ \implies 2(1+z)^{\frac{1}{2}} &= 3 \implies 4 + 4z = 9 \implies z = 1.25 \end{aligned}$$

Proving it is a maxima:

$$\begin{aligned} \frac{d^2 D_A}{dz^2} &= \frac{4D_H}{(1+z)^3} - \frac{15D_H}{2(1+z)^{\frac{7}{2}}} \\ \left. \frac{d^2 D_A}{dz^2} \right|_{z=1.25} &= D_H \left(\frac{256}{729} - \frac{320}{729} \right) = -D_H \frac{64}{729} < 0 \end{aligned}$$

1.2.1 Question 4

A program has been written to compute D_A and D_L given a redshift and universe model. It is also designed to plot the values of D_A/D_H and D_L/D_H against redshift. It is called **Q4.py** and can be found in Section 3.

| Redshift | Einstein D_A/D_H | D_L/D_H | Baryon D_A/D_H | D_L/D_H | Popular D_A/D_H | D_L/D_H |
|----------|-----------------------|-----------|---------------------|-----------|----------------------|-----------|
| 1.0 | 0.29260 | 1.17040 | 0.36969 | 1.47874 | 0.39244 | 1.56976 |
| 1.25 | 0.29600 | 1.49850 | 0.39401 | 1.99467 | 0.40981 | 2.07465 |
| 2.0 | 0.28148 | 2.53336 | 0.43112 | 3.88008 | 0.41366 | 3.72297 |
| 4.0 | 0.22089 | 5.52235 | 0.45001 | 11.25031 | 0.34575 | 8.64375 |

Table 2: Distance ratios at certain redshifts for each model universe.

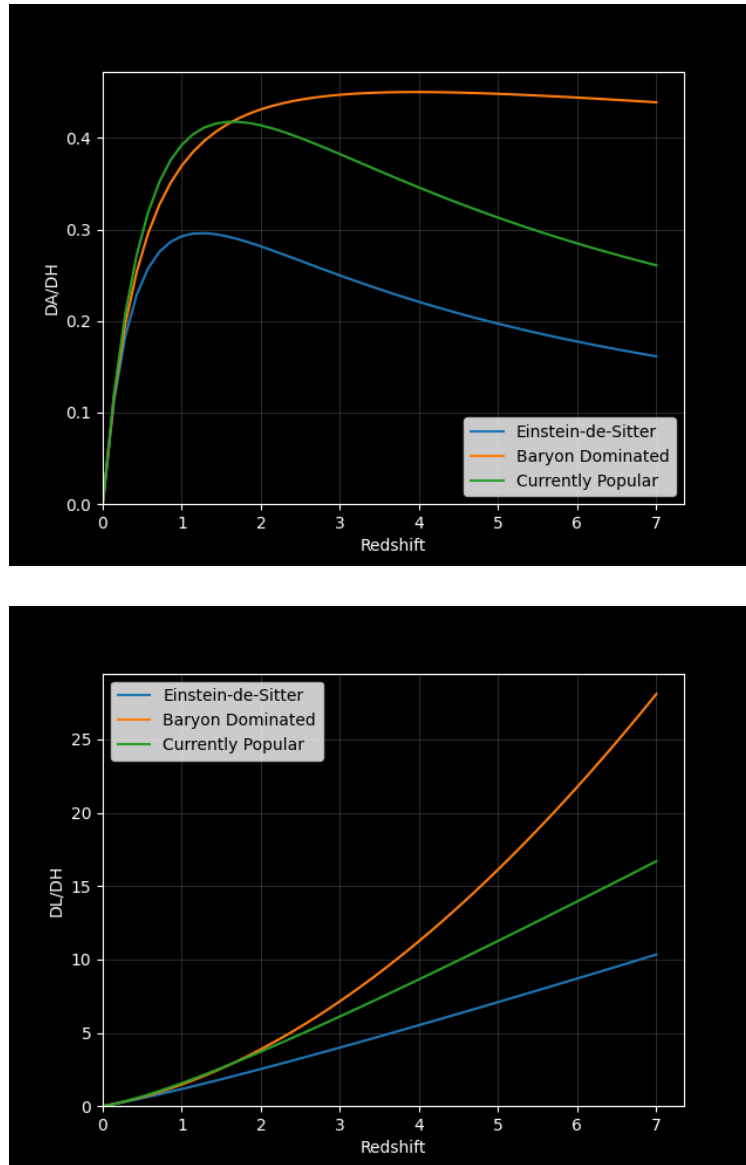


Figure 2: Plots of D_A/D_H and D_L/D_H against redshift

2 Comoving Volume

2.1 Uniform Comoving Distribution

In order to find $\langle V/V_{max} \rangle$ we must average the population weighted according to V/V_{max} . It is clear that we should use the given formula for the number of objects to produce our weighting. Assuming we have a uniform distribution of the number of cosmological objects over the range $L \in (0, \infty), V \in (0, V_{max}(L))$, this yields the following PDF ϕ :

$$\phi(V, L) = \frac{1}{\int_0^\infty \Phi(L) \int_0^{V_{max}(L)} dV dL}$$

Then computing $\langle V/V_{max} \rangle$ is simply a matter of computing the expectation $\mathbb{E}(V/V_{max})$.

$$\langle V/V_{max} \rangle = \frac{\int_0^\infty \Phi(L) \int_0^{V_{max}(L)} V/V_{max} dV dL}{\int_0^\infty \Phi(L) \int_0^{V_{max}(L)} dV dL} = \frac{\int_0^\infty \Phi(L) \frac{1}{2} V_{max} dL}{\int_0^\infty \Phi(L) V_{max} dL} = \frac{1}{2}$$

2.2 Computing V/V_{max}

2.2.1 Question 6

A program has been written to compute V and V_{max} for an arbitrary redshift z and a ratio between detected and minimum flux f/f_0 . It works by computing the maximum redshift z_0 corresponding to a flux of f_0 by way of binary search; a sufficiently fast algorithm. Then using z and z_0 along with the formulas provided to compute D_C in each case, yielding V and V_{max} . The program is called **Q6.py** and can be found in Section 3.

In an extension to this program we generate random numbers for Ω_m , z and f/f_0 with z small. When we plot $(f/f_0)^{-\frac{3}{2}}$ against V/V_{max} , it is clear from Figure 3 that, in the Euclidean limit, they are directly proportional.

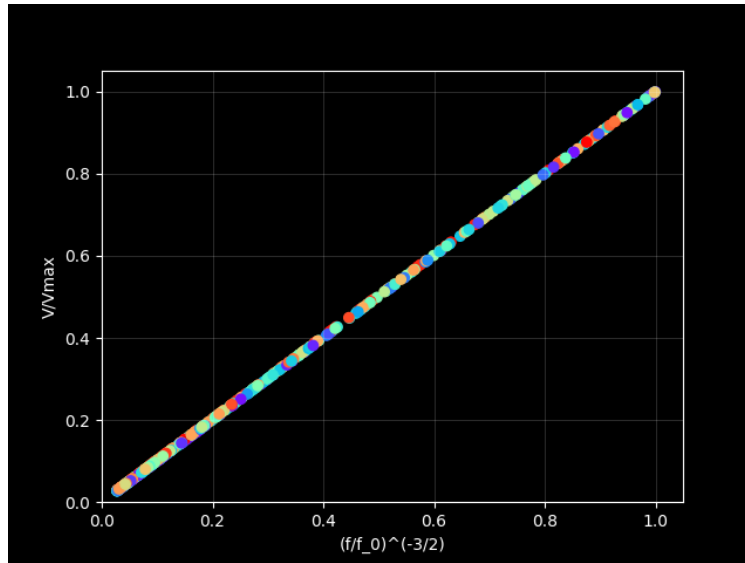


Figure 3: Plot of $(f/f_0)^{-\frac{3}{2}}$ against V/V_{max}

Computing the value of $\langle V/V_{max} \rangle$ for the popular universe ($\Omega_m = 0.27, \Omega_\lambda = 0.73$) using the quasar dataset provided, we attained a value of 0.7060645570576465. This is much higher than expected from a constant comoving population, which may be motivated by the following two explanations:

- Quasars in the early universe have higher luminosity in the early universe.
- There were a greater density of quasars when the universe was younger.

2.2.2 Question 7

For all the quasars in the dataset $z \in (0.2, 3)$, as this is the range at which an object can be recognised as a quasar. This means there is a maximum volume of space that is relevant for consideration. It makes sense then to consider V as the volume closer to the observer than the detected quasar, excluding the space $z < 0.2$. Also along the same lines, we consider V_{max} to be the maximum volume possible with the same luminosity L at minimum flux f_0 , excluding the space $z < 0.2$ and $z > 3$.

Formulating this as a probability distribution as before, first let V_0, V_1 be the volume of space with $z < 0.2$ and $z < 3$ respectively. We attain the following uniform PDF as before:

$$\frac{1}{\int_0^\infty \Phi(L) \int_0^{V_{max}(L)} dV dL}$$

But this time over the ranges $L \in (0, \infty), V \in (0, V_{max}(L)) \subseteq (0, V_1 - V_0)$.

Calculating $\langle V/V_{max} \rangle$ it is the same as before yielding $\frac{1}{2}$:

$$\langle V/V_{max} \rangle = \frac{\int_0^\infty \Phi(L) \int_0^{V_{max}(L)} V/V_{max} dV dL}{\int_0^\infty \Phi(L) \int_0^{V_{max}(L)} dV dL} = \frac{\int_0^\infty \Phi(L) \frac{1}{2} V_{max} dL}{\int_0^\infty \Phi(L) V_{max} dL} = \frac{1}{2}$$

Q7.py was written to run this edit on the quasar data. It is found in Section 3.

Running this program we attain a value of 0.689145751083584 for $\langle V/V_{max} \rangle$, which is indeed closer to the expected value of 0.5, though still significantly overshoots, again suggesting some combination of higher luminosity and greater density of quasars in the early universe.

3 Code

3.1 Q2.py

```
import numpy as np
import matplotlib.pyplot as plt
import matplotlib as mpl

def SetupAxes (x, y, showGrid=True):

    x = np.array(x)
    y = np.array(y)
    xMax = np.max(x)
    xMin = 0
    yMax = np.max(y)
    yMin = 0
    dx = (xMax - xMin) / 20
    dy = (yMax - yMin) / 20

    fig, ax = plt.subplots()
    plt.xlabel('Redshift', color='white')
    plt.ylabel('Lookback Time', color='white')
    fig.set_facecolor("black")
    ax.set_facecolor("black")
    ax.spines['bottom'].set_color('white')
    ax.spines['top'].set_color('white')
    ax.spines['left'].set_color('white')
    ax.spines['right'].set_color('white')
    ax.tick_params(colors='white')
    ax.set_xlim(xMin, xMax+dx)
    ax.set_ylim(yMin, yMax+dy)
    if (showGrid):
        ax.grid(color='white', linewidth=0.4, alpha=0.3, zorder=0)
    return fig, ax

def ComputeLookbackTime (z, h = 0.72, Omega_m = 0.27, Omega_Lambda = 0.73, n = 10000):
    Omega_k = 1 - Omega_m - Omega_Lambda
    tH = 3.0856 * 10**17 / (10**8 * 60 * 60 * 24 * 365 * h)

    def E(x):
        return np.sqrt(Omega_m * np.power((1+x),3) + Omega_k * np.power(1+x, 2) + Omega_Lambda)

    x = np.linspace(0, z, n)
    y = 1/ ((x + 1) * E(x))
    integral = tH * np.trapz(y, dx=z/n)
    return integral

zs = np.array([0.1, 1.0, 2.0, 4.0, 6.7])
times = [[0 for j in range(5)] for i in range(4)]
```

```

for i in range(5):
    times[0][i] = ComputeLookbackTime(zs[i], Omega_m = 1, Omega_Lambda = 0)
    times[1][i] = ComputeLookbackTime(zs[i], Omega_m = 2, Omega_Lambda = 0)
    times[2][i] = ComputeLookbackTime(zs[i], Omega_m = 0.04, Omega_Lambda = 0)
    times[3][i] = ComputeLookbackTime(zs[i], Omega_m = 0.27, Omega_Lambda = 0.73)
print(times)

n = 100
zs = np.linspace(0, 8, n)
times = [[0 for j in range(n)] for i in range(4)]

for i in range(n):
    times[0][i] = ComputeLookbackTime(zs[i], Omega_m = 1, Omega_Lambda = 0)
    times[1][i] = ComputeLookbackTime(zs[i], Omega_m = 2, Omega_Lambda = 0)
    times[2][i] = ComputeLookbackTime(zs[i], Omega_m = 0.04, Omega_Lambda = 0)
    times[3][i] = ComputeLookbackTime(zs[i], Omega_m = 0.27, Omega_Lambda = 0.73)

fig, ax = SetupAxes(zs, times)

for i in range(4):
    plt.plot(zs, times[i])
ax.legend(['Einstein-de-Sitter', 'Classical Closed', 'Baryon Dominated', 'Currently Popular'])
plt.show()

print(ComputeLookbackTime(10000, Omega_m = 1, Omega_Lambda = 0, n= 100000))
print(ComputeLookbackTime(10000, Omega_m = 2, Omega_Lambda = 0, n= 100000))
print(ComputeLookbackTime(10000, Omega_m = 0.04, Omega_Lambda = 0, n= 100000))
print(ComputeLookbackTime(10000, Omega_m = 0.27, Omega_Lambda = 0.73, n= 100000))

```

3.2 Q4.py

```
import numpy as np
import matplotlib.pyplot as plt
import matplotlib as mpl

def SetupAxes (x, y, ytext = 'amogus', showGrid=True):

    x = np.array(x)
    y = np.array(y)
    xMax = np.max(x)
    xMin = 0
    yMax = np.max(y)
    yMin = 0
    dx = (xMax - xMin) / 20
    dy = (yMax - yMin) / 20

    fig, ax = plt.subplots()
    plt.xlabel('Redshift', color='white')
    plt.ylabel(ytext, color='white')
    fig.set_facecolor("black")
    ax.set_facecolor("black")
    ax.spines['bottom'].set_color('white')
    ax.spines['top'].set_color('white')
    ax.spines['left'].set_color('white')
    ax.spines['right'].set_color('white')
    ax.tick_params(colors='white')
    ax.set_xlim(xMin, xMax+dx)
    ax.set_ylim(yMin, yMax+dy)
    if (showGrid):
        ax.grid(color='white', linewidth=0.4, alpha=0.3, zorder=0)
    return fig, ax

def ComputeValues(z, Omega_m = 0.27, Omega_Lambda = 0.73):
    Omega_k = 1 - Omega_m - Omega_Lambda

    DADH = 0

    def E(x):
        return np.sqrt(Omega_m * np.power((1+x),3) + Omega_k * np.power(1+x, 2) + Omega_Lambda)

    x = np.linspace(0, z, 1000)
    y = 1/ E(x)
    DCDH = np.trapz(y, dx=z * 0.001)
    if (Omega_k == 0):
        DADH = DCDH / (1+z)
    elif (Omega_k > 0):
        DADH = 1/ (np.sqrt(Omega_k) * (1+z)) * np.sinh(np.sqrt(Omega_k) * DCDH)
    else:
        DADH = 1/ (np.sqrt(Omega_k) * (1+z)) * np.sin(np.sqrt(Omega_k) * DCDH)

    DLDH = (1+z)**2 * DADH
```



```

    return DADH, DLDH

n=50
z = np.array(np.linspace(0, 7, n))

DADHs = [[0 for j in range(n)] for i in range(3)]
DLDHs = [[0 for j in range(n)] for i in range(3)]

for i in range(n):
    DADHs[0][i], DLDHs[0][i] = ComputeValues(z[i], Omega_m = 1, Omega_Lambda = 0)
    DADHs[1][i], DLDHs[1][i] = ComputeValues(z[i], Omega_m = 0.04, Omega_Lambda = 0)
    DADHs[2][i], DLDHs[2][i] = ComputeValues(z[i], Omega_m = 0.27, Omega_Lambda = 0.73)

fig1, ax1 = SetupAxes(z, DADHs, ytext='DA/DH')
for i in range(3):
    plt.plot(z, DADHs[i])
ax1.legend(['Einstein-de-Sitter', 'Baryon Dominated', 'Currently Popular'])

fig2, ax2 = SetupAxes(z, DLDHs, ytext='DL/DH')
for i in range(3):
    plt.plot(z, DLDHs[i])
ax2.legend(['Einstein-de-Sitter', 'Baryon Dominated', 'Currently Popular'])
plt.show()

z = [1, 1.25, 2, 4]

DADHs = [[0 for j in range(4)] for i in range(3)]
DLDHs = [[0 for j in range(4)] for i in range(3)]

for i in range(4):
    DADHs[0][i], DLDHs[0][i] = ComputeValues(z[i], Omega_m = 1, Omega_Lambda = 0)
    DADHs[1][i], DLDHs[1][i] = ComputeValues(z[i], Omega_m = 0.04, Omega_Lambda = 0)
    DADHs[2][i], DLDHs[2][i] = ComputeValues(z[i], Omega_m = 0.27, Omega_Lambda = 0.73)

for i in range(3):
    print(DADHs[i])
    print(DLDHs[i])
    print("\n")

```

3.3 Q6.py

```
import numpy as np
import csv
import matplotlib as mpl
import matplotlib.pyplot as plt

def SetupAxes (x, y, showGrid=True):

    x = np.array(x)
    y = np.array(y)
    xMax = np.max(x)
    xMin = 0
    yMax = np.max(y)
    yMin = 0
    dx = (xMax - xMin) / 20
    dy = (yMax - yMin) / 20

    fig, ax = plt.subplots()
    plt.xlabel('(f/f_0)^(-3/2)', color='white')
    plt.ylabel('V/Vmax', color='white')
    fig.set_facecolor("black")
    ax.set_facecolor("black")
    ax.spines['bottom'].set_color('white')
    ax.spines['top'].set_color('white')
    ax.spines['left'].set_color('white')
    ax.spines['right'].set_color('white')
    ax.tick_params(colors='white')
    ax.set_xlim(xMin, xMax+dx)
    ax.set_ylim(yMin, yMax+dy)
    if (showGrid):
        ax.grid(color='white', linewidth=0.4, alpha=0.3, zorder=0)
    return fig, ax

def ComputeValues(z, Omega_m = 0.27, Omega_Lambda = 0.73):
    Omega_k = 1 - Omega_m - Omega_Lambda

    DADH = 0

    def E(x):
        return np.sqrt(Omega_m * np.power((1+x),3) + Omega_k * np.power(1+x, 2) + Omega_Lambda)

    x = np.linspace(0, z, 1000)
    y = 1/ E(x)
    DCDH = np.trapz(y, dx=z * 0.001)
    if (Omega_k == 0):
        DADH = DCDH / (1+z)
    elif (Omega_k > 0):
        DADH = 1/ (np.sqrt(Omega_k) * (1+z)) * np.sinh(np.sqrt(Omega_k) * DCDH)
    else:
        DADH = 1/ (np.sqrt(Omega_k) * (1+z)) * np.sin(np.sqrt(Omega_k) * DCDH)

    DLDH = (1+z)**2 * DADH
    return DCDH, DADH, DLDH
```

```

def GetVolumes(z, ff0, h = 0.72, Omega_m = 0.27, Omega_Lambda = 0.73):
    # Using Giga-Lightyears
    DH = h * 9.26 * 1.057

    DCDH, DADH, DLDH = ComputeValues(z, Omega_m=Omega_m, Omega_Lambda=Omega_Lambda)
    DC = DH * DCDH
    DL = DH * DLDH

    V = 4 * np.pi / 3 * DC**3

    DLO = DL * np.sqrt(ff0)

    def E(x):
        return np.sqrt(Omega_m * np.power((1+x),3) + 0 * np.power(1+x, 2) + Omega_Lambda)

    # Find z0 (or z_max)

    # Use a bit of root finding methods to get z0

    a = DLO / DH
    def BinarySearch(zmin, zmax):
        zmid = (zmax + zmin) / 2
        if (zmax - zmin < 10**-8): return zmid

        x = np.linspace(0,zmid, 1000)
        y = 1/E(x)
        b = (1+zmid) * np.trapz(y, dx = zmid/1000)

        if (a < b):
            return BinarySearch(zmin, zmid)
        elif (a > b):
            return BinarySearch(zmid, zmax)
        else:
            return zmid

    z0 = BinarySearch(z, 20)

    DCODH, DAODH, DLODH = ComputeValues(z0, Omega_m=Omega_m, Omega_Lambda=Omega_Lambda)
    DC0 = DH * DCODH

    Vmax = 4 * np.pi / 3 * DC0**3

    return V, Vmax

def SmallRedShift():
    n = 500
    z = [np.random.rand() * 0.01 for i in range(n)]
    ff0 = [(1 + (np.random.rand() ** 2)*10) for i in range(n)]
    Omega_m = [np.random.rand() for i in range(n)]
    VVmax = [0 for i in range(n)]

```

```

xData = [ff0[i] ** (-1.5) for i in range(n)]
colours = [mpl.cm.rainbow(z[i]*100) for i in range(n)]

for i in range(n):
    V, Vmax = GetVolumes(z[i], ff0[i], Omega_m=Omega_m[i], Omega_Lambda=(1-Omega_m[i]))
    VVmax[i] = V/Vmax

fig, ax = SetupAxes(xData, VVmax)

plt.scatter(xData, VVmax, c=colours)

plt.show()

def AveragePerUniverse(n, z, ff0, Omega_m):
    Omega_Lambda = 1 - Omega_m

    tot = 0
    for i in range(n):
        V, Vmax = GetVolumes(z[i], ff0[i], Omega_m=Omega_m, Omega_Lambda=Omega_Lambda)
        VVmax = V/Vmax
        tot += VVmax

    avg = tot/n
    return avg

if __name__ == "__main__":
    SmallRedShift()

    n = 1

    z = [5]
    ff0 = [10]
    avg = AveragePerUniverse(n, z, ff0, 1)

    n = 114

    z = []
    ff0 = []
    with open("quasar.csv", 'r') as file:
        csvreader = csv.reader(file)

        for row in csvreader:
            z.append(float(row[0]))
            ff0.append(float(row[1]))

    n = len(z)

    avgEin = AveragePerUniverse(n, z, ff0, 1)
    avgPop = AveragePerUniverse(n, z, ff0, 0.27)
    print("Einstein De-Sitter: ", avgEin, "Popular: ", avgPop)

```

3.4 Q7.py

```
from Q6 import *

def UpdatedGetVolumes(z, ff0, h = 0.72, Omega_m = 0.27, Omega_Lambda = 0.73):
    # Using Giga-Lightyears
    DH = h * 9.26 * 1.057

    DCODH, DAODH, DLODH = ComputeValues(0.2, Omega_m=Omega_m, Omega_Lambda=Omega_Lambda)
    DCO = DH * DCODH
    DC1DH, DA1DH, DL1DH = ComputeValues(3, Omega_m=Omega_m, Omega_Lambda=Omega_Lambda)
    DC1 = DH * DC1DH

    V0 = 4 * np.pi / 3 * DCO**3
    V1 = 4 * np.pi / 3 * DC1**3

    V, Vmax = GetVolumes(z, ff0, h = 0.72, Omega_m = Omega_m, Omega_Lambda = Omega_Lambda)
    V -= V0
    Vmax -= V0
    Vmax = min(Vmax, V1 - V0)

    if (V > Vmax):
        print(z, ff0, V, Vmax)

    return V, Vmax

def UpdatedAveragePerUniverse(n, z, ff0, Omega_m):
    Omega_Lambda = 1 - Omega_m

    tot = 0
    for i in range(n):
        V, Vmax = UpdatedGetVolumes(z[i], ff0[i], Omega_m=Omega_m, Omega_Lambda=Omega_Lambda)
        VVmax = V/Vmax
        tot += (VVmax)

    avg = tot/n
    return avg

if __name__ == "__main__":
    n = 114

    z = []
    ff0 = []
    with open("quasar.csv", 'r') as file:
        csvreader = csv.reader(file)

        for row in csvreader:
            z.append(float(row[0]))
            ff0.append(float(row[1]))

    n = len(z)
```

```
avgEin = UpdatedAveragePerUniverse(n, z, ff0, 1)
avgPop = UpdatedAveragePerUniverse(n, z, ff0, 0.27)
print("AVERAGE: ", avgEin, "Popular: ", avgPop)
```