

PHYS-512, PS3

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Problem 1

The differential equation we have here is

$$\frac{dy}{dx} = \frac{y}{1+x^2} \quad (1)$$

This is a first-order linear ordinary differential equation, with solution

$$y = c_0 \exp(\arctan(x)) \quad (2)$$

Given the boundary condition $y(-20) = 1$, then $c_0 = 1/\exp(\arctan(-20))$. So,

$$y = \frac{1}{\exp(\arctan(-20))} \exp(\arctan(x)) \quad (3)$$

Use the following code:

```
1 #=====
2 # Course: PHYS 512
3 # Problem: PS3 P1
4 #=====
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7 # Department of Physics, McGill University
8 # September 2022
9
10 #=====
11 # Libraries
12 #=====
13 import numpy as np # For math
14 import matplotlib.pyplot as plt # For graphs
15
16 #=====
17 # Derivative Function
18 #=====
19 def fun(x,y):
20     global counter
21     counter +=1
22
23     dydx = y / (1 + x**2)
24     return dydx
25
26 #=====
27 # RK4 (Step)
28 #=====
29 def rk4_step(fun, x, y, h):
30     k1 = h * fun(x, y)
```

```

31     k2 = h * fun(x + h/2, y + k1/2)
32     k3 = h * fun(x + h/2, y + k2/2)
33     k4 = h * fun(x + h, y + k3)
34     dy = (k1 + 2 * k2 + 2 * k3 + k4) / 6
35     return y + dy
36
37 #=====
38 # Parameters & Definitions
39 #=====
40 steps = 201
41 x = np.linspace(-20, 20, steps)
42 h = np.median(np.diff(x))
43 y = np.zeros(steps)
44 y[0] = 1 # boundary condition
45
46 #=====
47 # Numerical Solution
48 #=====
49 counter = 0
50 for i in range(steps-1):
51     y[i+1] = rk4_step(fun, x[i], y[i], h)
52
53 #=====
54 # Analytical Solution
55 #=====
56 c0 = 1 / np.exp(np.arctan(-20)) # true solution amplitude
57 y_true = c0 * np.exp(np.arctan(x)) # true solution
58
59 #=====
60 # Plot
61 #=====
62 plt.plot(x, y, linewidth=5, label="Numerical RK4")
63 plt.plot(x, y_true, linewidth=5, ls=":", label="Analytical")
64 plt.title("Given Function Integration, step")
65 plt.xlabel("x")
66 plt.ylabel("y")
67 plt.legend()
68 plt.savefig('3.1.1.pdf', format='pdf', dpi=1200)
69 plt.show()
70 plt.close()
71
72 #=====
73 # Error & Function Evaluations
74 #=====
75 print("In rk4_step, the difference mean is", np.mean(abs(y_true-y)), "with",
76       counter, "function evaluations.")
77
78 #=====
79 # RK4 (Stepd)
80 #=====
81 def rk4_stepd(fun, x, y, h):
82     # Step size h
83     y1 = rk4_step(fun, x, y, h)
84
85     # Step size h/2
86     y2i = rk4_step(fun, x, y, h/2)

```

```

86     y2 = rk4_step(fun, x + h/2, y2i, h/2)
87
88     return y2 + (y2 - y1) / 15
89
90 #=====
91 # Parameters & Definitions
92 #=====
93 y = np.zeros(steps)
94 y[0] = 1 # boundary condition
95
96 #=====
97 # Numerical Solution
98 #=====
99 counter = 0
100 for i in range(steps-1):
101     y[i+1] = rk4_stepd(fun, x[i], y[i], h)
102
103 #=====
104 # Plot
105 #=====
106 plt.plot(x, y, linewidth=5, label="Numerical RK4")
107 plt.plot(x, y_true, linewidth=5, ls=":", label="Analytical")
108 plt.title("Given Function Integration, stepd")
109 plt.xlabel("x")
110 plt.ylabel("y")
111 plt.legend()
112 plt.savefig('3.1.2.pdf', format='pdf', dpi=1200)
113 plt.show()
114 plt.close()
115
116 #=====
117 # Error & Function Evaluations
118 #=====
119 print("In rk4_stepd, the difference mean is", np.mean(abs(y_true-y)), "with",
      counter, "function evaluations.")

```

Where we have the errors and functions evaluations as the following:

In rk4_step, the difference mean is 0.00011382485934170593 with 800 function evaluations.

In rk4_stepd, the difference mean is 2.0613363261088876e-07 with 2400 function evaluations.

As you see, the rk4_stepd is more accurate than rk4_step, but it has 3 times more evaluations.

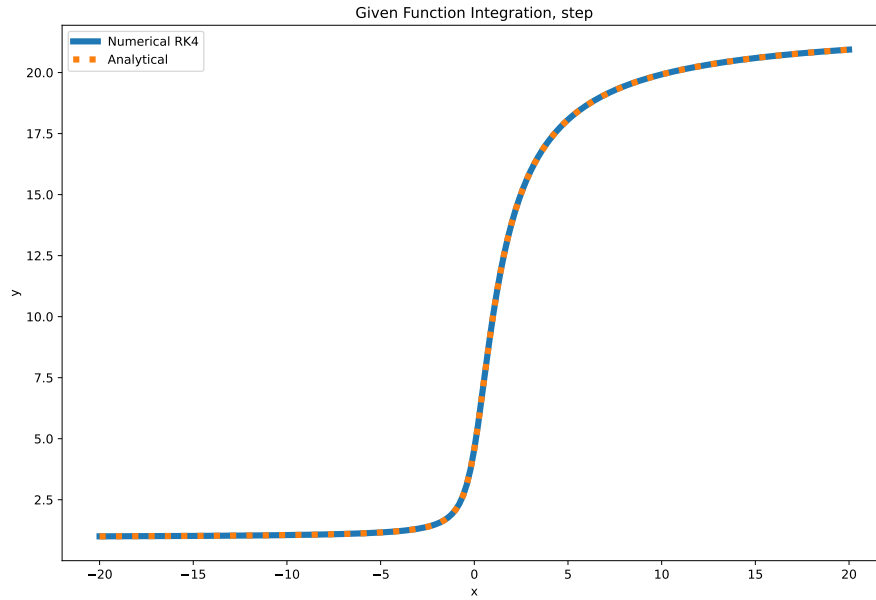


Figure 1: Given Function Integration, rk4_step.

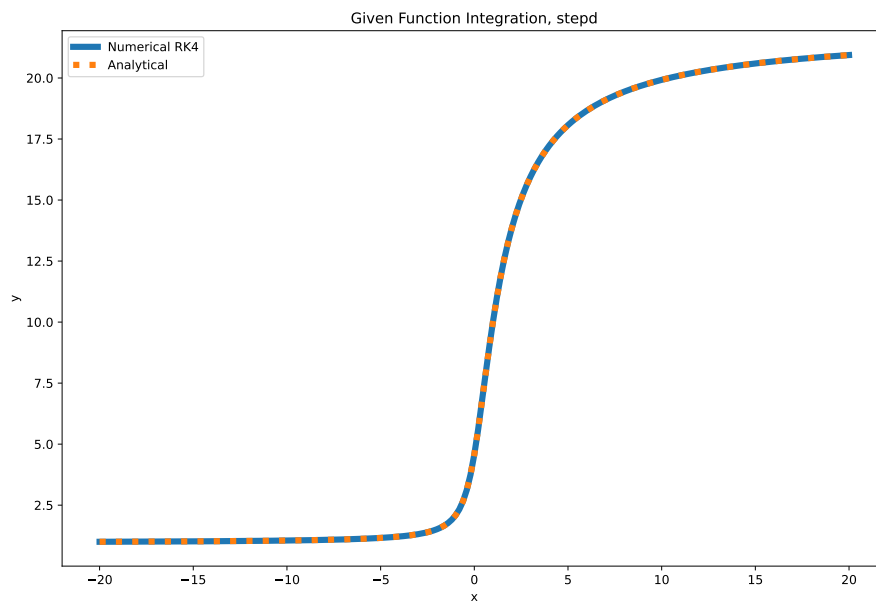


Figure 2: Given Function Integration, rk4_stepd.

Problem 2

a.

In this problem, we will see the number of atoms or their share of the complete sample. This share is represented by a number from 0 to 1. We will use "scipy.integrate.solve_ivp" function.

Now, use the code:

```
1 # Course: PHYS 512
2 # Problem: PS3 P2
3 #=====
4 # By: Muath Hamidi
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6 # Department of Physics, McGill University
7 # September 2022
8
9 #=====
10 # Libraries
11 #=====
12 import numpy as np # For math
13 import matplotlib.pyplot as plt # For graphs
14 from scipy.integrate import solve_ivp # For math
15
16 #=====
17 # Times
18 #=====
19 minutes = 60 # minutes to seconds
20 hours = 60 * minutes # hours to seconds
21 days = 24 * hours # days to seconds
22 years = 365.25 * days # years to seconds
23
24 #=====
25 # Half Lives
26 #=====
27 U238 = 4.468e9 * years
28 Th234 = 24.1 * days
29 Pr234 = 6.7 * hours
30 U234 = 245500 * years
31 Th230 = 75380 * years
32 Ra226 = 1600 * years
33 Rn222 = 3.8235 * days
34 Po218 = 3.1 * minutes
35 Pb214 = 26.8 * minutes
36 Bi214 = 19.9 * minutes
37 Po214 = 164.3e-6
38 Pb210 = 22.3 * years
39 Bi210 = 5.015 * years
40 Po210 = 138.376 * days
41
42 half_life = [U238, Th234, Pr234, U234, Th230, Ra226, Rn222, Po218, Pb214, Bi214,
43             Po214, Pb210, Bi210, Po210]
44
45 #=====
46 # Parameters
47 #=====
48 steps = len(half_life)
49
50 #=====
51 # Decay Solver
52 #=====
53 def Decay(x, y, half_life=half_life):
54     dydx = np.zeros(steps+1) # active elements + Pb206
```

```

55     dydx[0] = -y[0] / half_life[0] # for U238
56
57     for i in range(1, steps):
58         dydx[i] = y[i-1] / half_life[i-1] - y[i] / half_life[i]
59
60     dydx[steps] = y[steps-1] / half_life[steps-1] # for Pb206
61
62     return dydx
63
64 #=====
65 # Solve
66 #=====
67 t0 = 0 # initial time
68 tf = half_life[0] # final time (U238 half life)
69 y0 = np.zeros(steps+1)
70 y0[0] = 1 # initial value
71
72 ans = solve_ivp(Decay, [t0, tf], y0, method='Radau')
73
74 #print(ans)
75 np.savetxt("anst.txt", ans.t) # save times
76 np.savetxt("ansy.txt", ans.y) # save values
77
78 #=====
79 # Ratio of Pb206 to U238 (Numerical)
80 #=====
81 plt.plot(ans.t / years, ans.y[14,:] / ans.y[0,:], linewidth=5)
82 plt.title("Ratio of Pb206 to U238, Numerical")
83 plt.xlabel("Time (years)")
84 plt.ylabel("Pb206/U238")
85 plt.savefig('3.2.1.pdf', format='pdf', dpi=1200)
86 plt.show()
87 plt.close()
88
89 #=====
90 # Ratio of Pb206 to U238 (Analytical)
91 #=====
92 N_U238 = np.exp(-ans.t/U238) # remained U238 share
93 N_Pb206 = 1 - N_U238 # remained Pb206 share
94 Ratio_Pb206_U238 = N_Pb206 / N_U238 # Pb206/U238 ratio
95
96 plt.plot(ans.t / years, Ratio_Pb206_U238, linewidth=5, label="Analytical")
97 plt.plot(ans.t / years, ans.y[14,:] / ans.y[0,:], linewidth=5, ls=":", label="
    Numerical")
98 plt.title("Ratio of Pb206 to U238, Analytical")
99 plt.xlabel("Time (years)")
100 plt.ylabel("Pb206/U238")
101 plt.legend()
102 plt.savefig('3.2.2.pdf', format='pdf', dpi=1200)
103 plt.show()
104 plt.close()
105
106 #=====
107 # Ratio of Th230 to U234
108 #=====
109 tf = 10**6 * years # final time (of order 10 U234 half life)

```

```

110 ans = solve_ivp(Decay, [t0, tf], y0, method='Radau')
111
112 plt.plot(ans.t / years, ans.y[4,:] / ans.y[3,:], linewidth=5)
113 plt.title("Ratio of Th230 to U234")
114 plt.xlabel("Time (years)")
115 plt.ylabel("Th230/U234")
116 plt.savefig('3.2.3.pdf', format='pdf', dpi=1200)
117 plt.show()
118 plt.close()

```

Times:

```

1 0.0000000000000000e+00
2 9.99999999999999124e-05
3 1.100000000000000066e-03
4 1.110000000000000049e-02
5 1.111000000000000043e-01
6 1.11109999999999977e+00
7 1.111110000000000042e+01
8 1.111110999999999933e+02
9 1.111111100000000079e+03
10 1.111111110000000019e+04
11 1.111111111000000092e+05
12 1.111111111100000096e+06
13 1.111111111110000126e+07
14 1.111111111111000180e+08
15 1.111111111111100197e+09
16 1.111111111111110306e+10
17 1.111111111111111298e+11
18 1.111111111111111328e+12
19 7.806995782095624023e+12
20 1.973830379741707422e+13
21 3.991286183778035156e+13
22 7.463820897839914062e+13
23 1.615799280210896250e+14
24 5.723379524784597500e+14
25 3.959287074183670000e+15
26 3.782877829123576800e+16
27 1.207580455609994880e+17
28 1.409993568000000000e+17

```

Values:

```

1 1.0000000000000000e+00 1.0000000000000000e+00 1.0000000000000000e+00
  1.0000000000000000e+00 1.0000000000000000e+00 1.0000000000000000e+00
  9.999999999999998890e-01 9.999999999999992228e-01 9.999999999999921174e-01
  9.9999999999999211742e-01 9.99999999999992119637e-01 9.999999999999921197480e-01
  9.9999999999999211974799e-01 9.99999999999992119743553e-01 9.999999999999921197434416e-01
  9.9999999211974371915e-01 9.9999992119746511365e-01 9.9999921197744555679e-01
  9.999446325158467541e-01 9.998600211891672807e-01 9.997169688274828436e-01
  9.994707886671511110e-01 9.988546942000359197e-01 9.959490742942525010e-01
  9.723104055146319924e-01 7.646856796007812651e-01 4.246718018430449271e-01
  3.678813939284799606e-01
2 0.0000000000000000e+00 7.092230934034922930e-22 7.801454025565082162e-21
  7.872376315984778271e-20 7.879468357693541879e-19 7.880175688532696049e-18
  7.880227688332687336e-17 7.880045558802150938e-16 7.878154383572887939e-15
  7.859268881852139830e-14 7.673696465060417917e-13 6.106707793026649210e-12
  1.454882508545967492e-11 1.475815947616202790e-11 1.476766913952306419e-11

```

1.476772574101613202e-11 1.476771530331216094e-11 1.476761056763850841e-11
 1.476690928877021270e-11 1.476565977180172291e-11 1.476354721358615240e-11
 1.475991169220016507e-11 1.475081337734015470e-11 1.470790397597820513e-11
 1.435881457020012546e-11 1.129266931177550751e-11 6.271437209015131084e-12
 5.432771972084276403e-12
 3 0.000000000000000000e+00 1.703029171538913218e-32 2.060665268754244370e-30
 2.098301919579122687e-28 2.102081408103300628e-26 2.102430445831488696e-24
 2.102174400382396829e-22 2.099242629736514945e-20 2.070219217701588426e-18
 1.810327461554213250e-16 7.023415087825284174e-15 6.956405057484188022e-14
 1.684992160937186736e-13 1.709524848838443532e-13 1.710639327548455300e-13
 1.710645962344495223e-13 1.710644753323101817e-13 1.710632621078750107e-13
 1.710551387184946736e-13 1.710406647148831985e-13 1.710161935184026928e-13
 1.709740808052523999e-13 1.708686888454287115e-13 1.703716401090436170e-13
 1.663279004501336084e-13 1.308106576571729859e-13 7.264631621785713408e-14
 6.293148722851120043e-14
 4 0.000000000000000000e+00 2.353550541921111253e-41 3.132575738452239261e-38
 3.218788309962499245e-35 3.227492193507637799e-32 3.228329933211482247e-29
 3.228078633657557669e-26 3.224705764297112088e-23 3.191196817395493212e-20
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 6.408520259135098487e-11 7.730911065135007686e-10 7.864754911576600367e-09
 7.873116413260100086e-08 7.823867100343429344e-07 7.341203629082692909e-06
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 2.021482653328221909e-05
 5 0.000000000000000000e+00 7.594655423909445880e-59 1.111933491287768148e-54
 1.152922060941437695e-50 1.157081382280991148e-46 1.157488320557744717e-42
 1.157432906106262040e-38 1.156466995830706780e-34 1.146843609501139009e-30
 1.057692505677180980e-26 5.674284489378231140e-23 8.310744626182830755e-20
 3.903947229501656887e-17 5.440487858275754938e-15 5.628303940749809672e-13
 5.637211089274540178e-11 5.537053524632521197e-09 4.632132972634793115e-07
 8.280447018885588660e-06 1.496894976773721656e-05 1.672131870857804407e-05
 1.685960674815576240e-05 1.685276056817257357e-05 1.680393790713749180e-05
 1.640510790433112354e-05 1.290200234334538279e-05 7.165187904929428693e-06
 6.207003391289794694e-06
 6 0.000000000000000000e+00 6.385250942078950746e-76 1.028351041910200632e-70
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 1.081254009113019976e-50 1.080463631388037930e-45 1.072581120715875310e-40
 9.999456971721490861e-36 5.859398974883894502e-31 9.748312606017899391e-27
 5.323537221727716008e-23 8.311519170354216227e-20 8.699090063358690631e-17
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 8 0.000000000000000000e+00 1.658827393512713108e-101 2.587327525072834187e-94

2.709824895772168632e-87 2.722029470183345198e-80 2.719309177898640449e-73
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 3.063533470792830072e-22 1.990497150467447499e-19 3.334334404792682876e-17
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 9.770050834889260227e-98 9.795315735239347308e-89 9.777687920891465060e-80
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 8.234239096659714072e-15 6.475920350096804730e-15 3.596432935832923728e-15
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 11 0.000000000000000000e+00 1.684074672306155585e-123 9.027098239394695239e-114
 1.285906675782262953e-104 1.341733053085584562e-95 1.344839028920742951e-86
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 5.560840474992358824e-53 9.425296545024371270e-47 1.317859452287201699e-41
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 2.706119222178018471e-28 1.758272368260447588e-25 2.945328710138372270e-23
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 1.164459617533061860e-21 1.163988351799789108e-21 1.160616352843759924e-21
 1.133069919247228678e-21 8.911170129990830594e-22 4.948860396627716731e-22
 4.287060391501420530e-22
 12 0.000000000000000000e+00 2.889145649605530182e-124 1.766472507469623993e-113
 2.621240859862683194e-103 2.744109342519344199e-93 2.752018686928002568e-83
 2.704177322685962219e-73 2.275131479565872885e-63 6.427152201796331594e-54
 9.019138730520223327e-46 1.057054019179808838e-38 1.552558809084745595e-32
 2.278457307518736748e-27 4.303081847530604672e-23 3.595598026452033578e-19
 9.677444168119778202e-16 7.408887210367839739e-13 1.260036076821610128e-10
 2.434090469052879897e-09 4.424626402884112384e-09 4.946457592797285482e-09
 4.987646810858350736e-09 4.985628366670328638e-09 4.971185329192103609e-09
 4.853197653101644222e-09 3.816858009080932460e-09 2.119710112717979202e-09
 1.836246031892635397e-09
 13 0.000000000000000000e+00 1.004630320161697714e-137 6.901553139234404536e-126
 1.079855068101911623e-114 1.138377818255150313e-103 1.142718581461253485e-92
 1.125420346543401213e-81 9.672679997646335879e-71 3.127597506844408160e-60
 4.890618875698469429e-51 3.745684740205029633e-43 4.079098380843649745e-36
 6.243629355355336713e-30 1.192571760146778685e-24 5.079695830729783353e-20
 2.082362273129719226e-16 1.660002029890719612e-13 2.832902160525665656e-11
 5.473866637458213527e-10 9.950423307289133623e-10 1.112398225080370582e-09

```

1.121661375395671564e-09 1.121207456527835920e-09 1.117959392538943939e-09
1.091425392718452737e-09 8.583651541267196095e-10 4.766971402337419018e-10
4.129495004608849282e-10
14 0.000000000000000000e+00 1.451481325444621096e-150 1.059601844307657010e-137
1.734835890090768308e-125 1.842073386558337505e-113 1.850706583252921676e-101
1.824987350478761905e-89 1.588059617377494810e-77 5.704172383921928124e-66
1.145625142226107320e-55 8.523376285880507858e-47 6.370092533203784625e-39
6.158413076517610730e-32 5.692340686801571531e-26 3.671330341780377970e-21
1.567747266802261375e-17 1.253678988276082538e-14 2.140042065320770926e-12
4.135168155365558360e-11 7.516939974505877343e-11 8.403493952209118091e-11
8.473471546583785356e-11 8.470042467514744106e-11 8.445505313762371791e-11
8.245057034542574123e-11 6.484428252682627452e-11 3.601157839695285424e-11
3.119583075857746713e-11
15 0.000000000000000000e+00 2.936259161605844844e-162 2.057413551960968298e-148
3.426602477060327817e-135 3.654623294776613978e-122 3.673437426699245411e-109
3.621617373598194679e-96 3.149340078118592299e-83 1.187726234867972375e-70
3.001983967933352300e-59 2.637123695934813163e-49 1.941544876299556669e-40
1.204372900709233822e-32 8.635566317083085336e-26 6.360665660448736908e-20
3.433697456548261236e-15 3.169164941911068794e-11 6.658565012930239751e-08
1.202391292729417557e-05 7.405258777707455901e-05 2.113457517681151699e-04
4.570759637973645460e-04 1.073203224541161276e-03 3.979032211182991635e-03
2.761940734219757790e-02 2.352591208424584246e-01 5.752975428225401977e-01
6.320920502062449264e-01

```

b.

The ratio of Pb206 to U238 appears in Fig.(3)

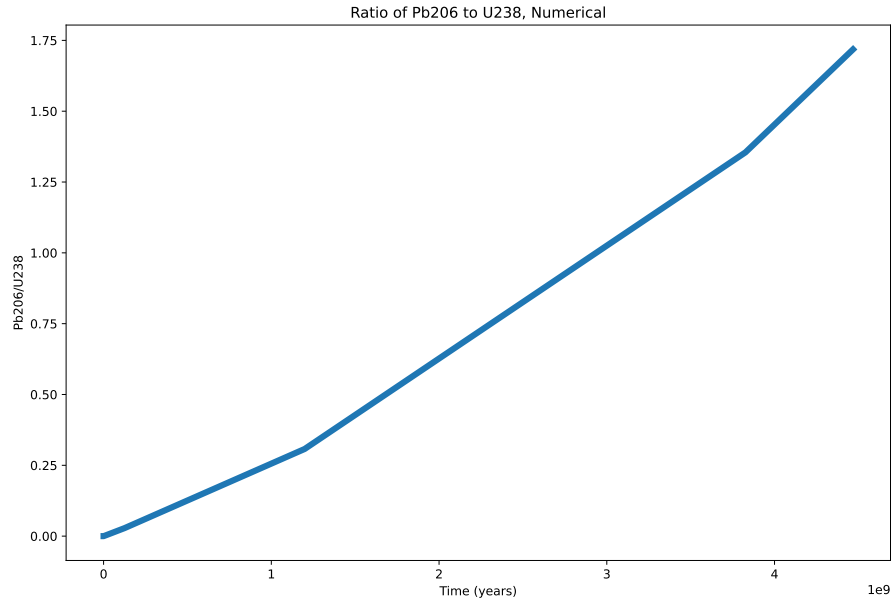


Figure 3: Ratio of Pb206 to U238, numerical

Looking to it analytically, while making the assumption that U238 decaying instantly to lead directly since all the half-lives are short compared to U238,

$$N_R(Element) = N_0 \times \exp\left(-\frac{t}{t_{1/2}}\right) \quad (4)$$

Where N_R is the remained amount of the element and N_0 is the initial amount of the element. Here is what we found from the code:

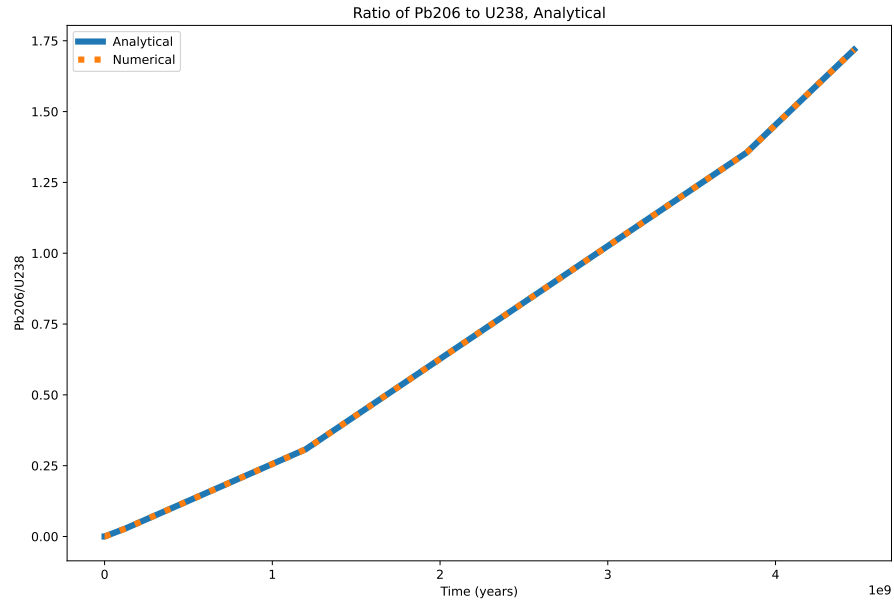


Figure 4: Ratio of Pb206 to U238, analytical

They're pretty identical.

Now, the ratio of Th230 to U234:

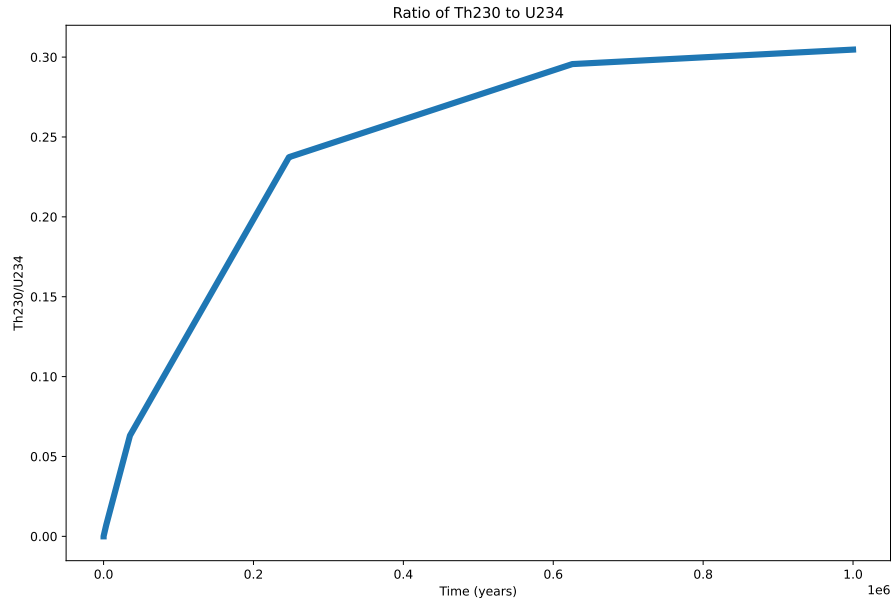


Figure 5: Ratio of Th230 to U234

Problem 3

a.

Simplify the function:

$$z = z_0 + a(x^2 + y^2) + a(x_0^2 + y_0^2) - 2axx_0 - 2ayy_0 \quad (5)$$

Rewrite it as:

$$z = a(x^2 + y^2) + bx + cy + d \quad (6)$$

Where $b = -2ax_0$, $c = -2ay_0$, and $d = a(x_0^2 + y_0^2) + z_0$

b.

Use the code:

```

1 # Course: PHYS 512
2 # Problem: PS3 P3
3 #=====
4 # By: Muath Hamidi
5 # Email: muath.hamidi@mail.mcgill.ca
6 # Department of Physics, McGill University
7 # September 2022
8
9 #=====
10 # Libraries
11 #=====
12 import numpy as np # For math

```

```

13 import matplotlib.pyplot as plt # For graphs
14
15 #=====
16 # Data
17 #=====
18 data = np.loadtxt('dish_zenith.txt')
19 x = np.array(data[:,0])
20 y = np.array(data[:,1])
21 z = np.array(data[:,2])
22
23 #=====
24 # Matrix
25 #=====
26 A = np.zeros([len(x),4])
27 A[:,0] = x**2 + y**2 # with a
28 A[:,1] = x # with b
29 A[:,2] = y # with c
30 A[:,3] = 1 # with d
31
32 #=====
33 # Fit
34 #=====
35 lhs = A.T@A
36 rhs = A.T@z
37 v = np.linalg.inv(lhs)@rhs
38 z_pred = A@v
39
40 #=====
41 # Parameters
42 #=====
43 a, b, c, d = np.linalg.inv(lhs)@rhs
44
45 # Our parameters
46 x0 = b/(-2*a)
47 y0 = c/(-2*a)
48 z0 = d - a * (x0**2 + y0**2)
49 print("The best-fit parameters: a = {}, x0 = {}, y0 = {}, z0 = {}".format(a, x0, y0
    , z0))
50
51 #=====
52 # Error
53 #=====
54 Noise = np.mean((z - z_pred)**2) # noise
55 uncertainty = np.sqrt(Noise * np.diag(np.linalg.inv(lhs)))
56 print("The uncertainty in a is {}".format(uncertainty[0]))
57
58 #=====
59 # Error Bar
60 #=====
61 focal_length = 1/(4*a) # focal length
62 print("Focal length =", focal_length)
63
64 Error = 1/4 * 1/(a)**2 * uncertainty[0]
65 print("Focal length error =", Error)

```

The best-fit parameters:
 $a = 0.00016670445477401358$,

$x_0 = -1.360488622197728,$
 $y_0 = 58.22147608157934,$
 $z_0 = -1512.8772100367878$

c.

From the code, the uncertainty in a is $6.451899757263455e-08$.

Considering the equation in the question, the focal length is,

$$Focal = \frac{1}{4a} \quad (7)$$

With error,

$$Error(Focal) = \frac{\Delta a}{4a^2} \quad (8)$$

So, we had the results:

Focal length = 1499.659984125216

Focal length error = 0.5804077581892833