Project 1 Colab

February 11, 2025

Basins of Attraction

Step One:

Here is some code to help you plot the basins of attraction for polynomials (a) - (c) in Project 1.

First we need to write our Newton's Method Function.

```
[1]: \#Goal to find a solution to f(x) = 0 given an initial approximation z0
     #INPUT: function f; function f'; init. approx. z0; tolerance TOL; max iterations
      \hookrightarrow MAX IT
     #OUTPUT: approximate solution z or FALSE if no convergence
     import numpy as np
     def my_newton(f,f_prime,z0,TOL,MAX_IT):
       #init guess
       z n minus one = z0;
       for i in range(MAX_IT):
         #The range() function returns a sequence of numbers, starting from 0,
         #and increments by 1 until stopping before the specified number.
         #the newtons method step
         z_n = z_n_minus_one - f(z_n_minus_one)/f_prime(z_n_minus_one);
         #check if we've converged
         if np.absolute(z n-z_n_minus_one)/np.absolute(z n_minus_one) < TOL:
           #if so retutn nth term in sequence as root approx
          return z n
         #else keep iterating
         z_n_minus_one = z_n;
       #if we exceed the number of iterations return bool False
       return False
```

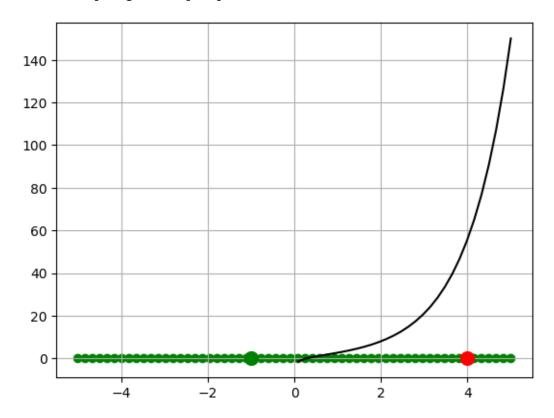
Now we write the code that will call Newton's Method to make the plot.

```
[2]: import numpy as np
import matplotlib.pyplot as plt
  #define the function
f = lambda x: np.log(x) + np.exp(x)
  #define derivative
f_prime = lambda x: (1 / np.abs(x)) + np.exp(x)
#list actual roots
```

```
root1 = 4;
root2 = -1;
#make a list of x-values
x = np.linspace(-5,5,60)
#make an array to hold the root that
#each x value in our list converges to
basins = [];
for curr x in x:
  #find the root curr x converges to
 root = my_newton(f,f_prime,curr_x,1e-4,20);
 #add it to the list
 basins.append(root);
#At this point we have a list of x-values (x) and
#a list of the root each x-value converges to (basins)
#For example, x[3] = -4.491525423728813
#and basins[3] = -1, which means the starting value -4.49
#converges to the root -1.
#Our goal is to plot the function and each starting value
#in the "x" array, but we want to color each starting
#value in the "x" array according to the root it converges to
#let root1 = 4 be red and root2 = -1 be green
#we will make an array of color vals so that
#for example for x[3] = -4.49, since it converges
#to -1 we want the color in the 3rd spot of the
#colors array to be green
#make colors array corresponding to x vals
colors = [];
#iterate through the basins array
for i in range(0,len(basins)):
  #if the root in the ith spot of basins is close to root1
  if abs(basins[i]-root1)< 1e-3:</pre>
    #put the color red in the ith spot of colors
    colors.append('r');
 else:
    #if not then put the color green
    colors.append('g');
#############PLOTTING RESULTS################
#we need this vector to plot each x value
#in the x array as a point on the x-axis
zeros = np.zeros(len(x));
#plot the function evaluated at those x-values
plt.plot(x,f(x),'k-')
```

/tmp/ipykernel_2010082/3045087413.py:4: RuntimeWarning: invalid value
encountered in log

f = lambda x: np.log(x) + np.exp(x)



From Newton's Method to Newton's Fractal

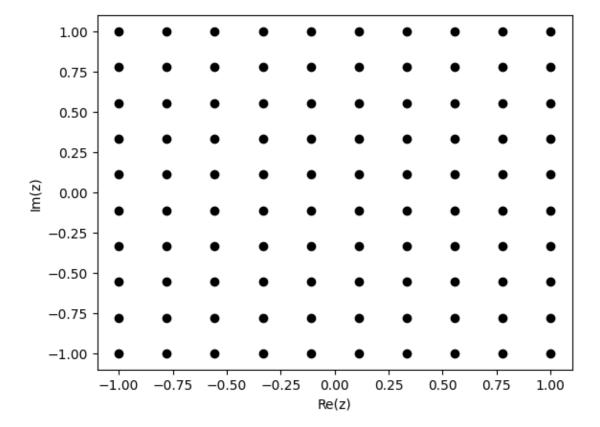
Let us plot the basins of attraction for $f(z) = z^3 - 1$ on the domain $\{x + iy \mid (x, y) \in [-2, 2] \times [-2, 2]\}$ in the complex plane.

We begin by creating an $n \times m$ grid of points in this domain. We will discretize the real and imaginary axes separately, and then use np.meshgrid() to turn them into a single grid of complex numbers.

```
[3]: import numpy as np
  min_real = -1;
  max_real = 1;
  min_imag = -1;
  max_imag = 1;
  n = 10;
  m = 10;
  xreal = np.linspace(min_real, max_real, m)
  ximag = np.linspace(min_imag, max_imag, n)
  Xreal, Ximag = np.meshgrid(xreal, ximag)
```

To get an idea of what this code just did lets plot, Xreal and Ximag below.

```
[4]: import matplotlib.pyplot as plt
plt.plot(Xreal, Ximag, marker='o', color='k', linestyle='none')
plt.xlabel('Re(z)')
plt.ylabel('Im(z)')
plt.show()
```



Recall that 1j is the complex number i in NumPy. The array Xinit will contain $n \times m$ complex points evenly spaced in the given domain.

```
[5]: Xinit = Xreal+1j*Ximag;
```

How can we extract the imaginary numbers from the Xinit array we just created?

Below is one way to iterate through all the numbers in Xinit.

```
[6]: # Recall we will have n*m numbers
    num = 1 #num will keep track of how many numbers we've printed
    for i in Xinit:
      print(i)
      for j in i:
        print("Coordinate point is :" , j)
        print("This is the", num, "coordinate point")
        num = num+1;
    Γ-1.
                -1.j -0.77777778-1.j -0.55555556-1.j -0.33333333-1.j
     -0.11111111-1.j 0.11111111-1.j 0.33333333-1.j 0.55555556-1.j
      0.77777778-1.j 1.
                                -1.j]
    Coordinate point is : (-1-1j)
    This is the 1 coordinate point
    Coordinate point is : (-0.77777777777778-1j)
    This is the 2 coordinate point
    Coordinate point is : (-0.555555555555556-1j)
    This is the 3 coordinate point
    Coordinate point is : (-0.3333333333333337-1j)
    This is the 4 coordinate point
    Coordinate point is : (-0.11111111111111116-1j)
    This is the 5 coordinate point
    Coordinate point is : (0.11111111111111116-1j)
    This is the 6 coordinate point
    Coordinate point is : (0.33333333333333326-1j)
    This is the 7 coordinate point
    Coordinate point is : (0.555555555555554-1j)
    This is the 8 coordinate point
    Coordinate point is : (0.777777777777777-1j)
    This is the 9 coordinate point
    Coordinate point is: (1-1j)
    This is the 10 coordinate point
    [-1.
                -0.77777778j -0.77777778-0.77777778j -0.55555556-0.77777778j
     -0.33333333-0.77777778j -0.111111111-0.77777778j 0.11111111-0.77777778j
      0.33333333-0.77777778j 0.55555556-0.77777778j 0.77777778-0.77777778j
                -0.7777778j]
      1.
    Coordinate point is : (-1-0.77777777777778j)
    This is the 11 coordinate point
    Coordinate point is: (-0.7777777777778-0.7777777777778j)
    This is the 12 coordinate point
```

```
Coordinate point is: (-0.55555555555556-0.777777777777778j)
This is the 13 coordinate point
Coordinate point is : (-0.333333333333337-0.777777777777777)
This is the 14 coordinate point
Coordinate point is: (-0.111111111111111116-0.777777777777778j)
This is the 15 coordinate point
Coordinate point is : (0.1111111111111116-0.777777777777778j)
This is the 16 coordinate point
Coordinate point is : (0.33333333333336-0.777777777777778j)
This is the 17 coordinate point
Coordinate point is: (0.555555555555554-0.777777777777777)
This is the 18 coordinate point
Coordinate point is: (0.7777777777777-0.7777777777778j)
This is the 19 coordinate point
Coordinate point is : (1-0.777777777777778j)
This is the 20 coordinate point
[-1.
         -0.5555556j -0.77777778-0.55555556j -0.55555556-0.55555556j
-0.33333333-0.55555556j -0.111111111-0.55555556j 0.11111111-0.55555556j
 0.33333333-0.55555556j 0.55555556-0.55555556j 0.77777778-0.55555556j
         -0.5555556j]
Coordinate point is : (-1-0.55555555555555555)
This is the 21 coordinate point
This is the 22 coordinate point
This is the 23 coordinate point
This is the 24 coordinate point
This is the 25 coordinate point
This is the 26 coordinate point
This is the 27 coordinate point
This is the 28 coordinate point
This is the 29 coordinate point
Coordinate point is : (1-0.5555555555555555)
This is the 30 coordinate point
        -0.3333333j -0.77777778-0.33333333j -0.55555556-0.33333333j
[-1.
-0.3333333-0.3333333j -0.11111111-0.3333333j 0.11111111-0.3333333j
 0.33333333-0.33333333j 0.55555556-0.33333333j 0.77777778-0.33333333j
         -0.33333333j]
Coordinate point is : (-1-0.33333333333333333)
This is the 31 coordinate point
Coordinate point is : (-0.7777777777778-0.3333333333333333333)
This is the 32 coordinate point
```

```
Coordinate point is: (-0.555555555555556-0.333333333333333333333)
This is the 33 coordinate point
Coordinate point is : (-0.3333333333333337-0.33333333333333333)
This is the 34 coordinate point
Coordinate point is : (-0.1111111111111116-0.333333333333333337j)
This is the 35 coordinate point
Coordinate point is: (0.11111111111111116-0.33333333333333333333)
This is the 36 coordinate point
This is the 37 coordinate point
Coordinate point is: (0.555555555555554-0.333333333333333333)
This is the 38 coordinate point
Coordinate point is : (0.7777777777777-0.333333333333333333)
This is the 39 coordinate point
Coordinate point is : (1-0.3333333333333333)
This is the 40 coordinate point
[-1.
          -0.11111111j -0.77777778-0.11111111j -0.55555556-0.11111111j
-0.33333333-0.11111111j -0.11111111-0.11111111j 0.11111111-0.11111111j
 0.33333333-0.11111111j 0.55555556-0.11111111j 0.77777778-0.11111111j
          -0.11111111j]
Coordinate point is : (-1-0.11111111111111111)
This is the 41 coordinate point
Coordinate point is: (-0.7777777777778-0.111111111111111111)
This is the 42 coordinate point
Coordinate point is : (-0.555555555555556-0.111111111111111111111)
This is the 43 coordinate point
Coordinate point is : (-0.33333333333337-0.1111111111111111111111)
This is the 44 coordinate point
This is the 45 coordinate point
This is the 46 coordinate point
Coordinate point is: (0.333333333333326-0.111111111111111111)
This is the 47 coordinate point
Coordinate point is: (0.555555555555554-0.111111111111111111)
This is the 48 coordinate point
Coordinate point is: (0.7777777777777-0.11111111111111116j)
This is the 49 coordinate point
Coordinate point is : (1-0.11111111111111111)
This is the 50 coordinate point
          +0.11111111j -0.77777778+0.11111111j -0.55555556+0.11111111j
0.33333333+0.11111111j 0.55555556+0.11111111j 0.77777778+0.11111111j
          +0.11111111j]
Coordinate point is : (-1+0.11111111111111111)
This is the 51 coordinate point
Coordinate point is: (-0.7777777777778+0.111111111111111111)
This is the 52 coordinate point
```

```
Coordinate point is: (-0.555555555555556+0.1111111111111111111111)
This is the 53 coordinate point
Coordinate point is : (-0.333333333333337+0.111111111111111111111)
This is the 54 coordinate point
This is the 55 coordinate point
This is the 56 coordinate point
Coordinate point is: (0.333333333333326+0.1111111111111111111111)
This is the 57 coordinate point
This is the 58 coordinate point
Coordinate point is : (0.7777777777777+0.1111111111111111111)
This is the 59 coordinate point
Coordinate point is : (1+0.11111111111111111)
This is the 60 coordinate point
[-1.
         +0.3333333j -0.77777778+0.3333333j -0.55555556+0.33333333j
-0.3333333+0.3333333j -0.11111111+0.3333333j 0.11111111+0.3333333j
 0.33333333+0.33333333j 0.55555556+0.33333333j 0.77777778+0.33333333j
         +0.33333333j]
Coordinate point is : (-1+0.333333333333333333)
This is the 61 coordinate point
Coordinate point is : (-0.7777777777778+0.33333333333333333333)
This is the 62 coordinate point
Coordinate point is : (-0.555555555555556+0.333333333333333333333)
This is the 63 coordinate point
Coordinate point is : (-0.333333333333337+0.33333333333333333)
This is the 64 coordinate point
This is the 65 coordinate point
Coordinate point is: (0.11111111111111116+0.333333333333333333333)
This is the 66 coordinate point
This is the 67 coordinate point
Coordinate point is: (0.555555555555554+0.3333333333333333333333)
This is the 68 coordinate point
Coordinate point is: (0.7777777777777+0.33333333333333333333)
This is the 69 coordinate point
Coordinate point is : (1+0.333333333333333333)
This is the 70 coordinate point
[-1.
         +0.5555556j -0.77777778+0.55555556j -0.55555556+0.55555556j
-0.3333333+0.55555556j -0.111111111+0.55555556j 0.11111111+0.55555556j
 0.33333333+0.55555556j 0.55555556+0.55555556j 0.77777778+0.55555556j
         +0.5555556i]
This is the 71 coordinate point
This is the 72 coordinate point
```

```
This is the 73 coordinate point
This is the 74 coordinate point
This is the 75 coordinate point
This is the 76 coordinate point
This is the 77 coordinate point
This is the 78 coordinate point
This is the 79 coordinate point
Coordinate point is: (1+0.55555555555555555)
This is the 80 coordinate point
[-1.
         +0.77777778j -0.77777778+0.77777778j -0.55555556+0.77777778j
-0.33333333+0.77777778j -0.11111111+0.7777778j 0.11111111+0.7777778j
 0.33333333+0.77777778j 0.55555556+0.77777778j 0.77777778+0.77777778j
         +0.7777778j]
Coordinate point is : (-1+0.77777777777777)
This is the 81 coordinate point
Coordinate point is : (-0.7777777777778+0.7777777777777)
This is the 82 coordinate point
Coordinate point is : (-0.555555555555556+0.777777777777777)
This is the 83 coordinate point
Coordinate point is: (-0.333333333333337+0.777777777777777)
This is the 84 coordinate point
Coordinate point is: (-0.1111111111111116+0.7777777777777777)
This is the 85 coordinate point
Coordinate point is : (0.11111111111111116+0.777777777777777)
This is the 86 coordinate point
Coordinate point is : (0.33333333333336+0.777777777777777)
This is the 87 coordinate point
Coordinate point is: (0.55555555555554+0.777777777777777))
This is the 88 coordinate point
Coordinate point is: (0.7777777777777+0.77777777777777)
This is the 89 coordinate point
Coordinate point is : (1+0.777777777777777)
This is the 90 coordinate point
         +1.j -0.77777778+1.j -0.55555556+1.j -0.33333333+1.j
-0.11111111+1.j 0.11111111+1.j 0.33333333+1.j 0.55555556+1.j
 0.77777778+1.j 1.
                     +1.j]
Coordinate point is : (-1+1j)
This is the 91 coordinate point
Coordinate point is : (-0.77777777777778+1j)
This is the 92 coordinate point
Coordinate point is : (-0.555555555555556+1j)
```

Cool, so we learned how to create a bunch of poit in the complex plane. Now we need to write a couple of different python functions in order to plot the basins of attraction for the given complex function.

In this example, it's not as easy to compute the exact roots. So, we will write a function that stores all the unique roots found when using Newton's Method on the set of initial points in Xinit.

Moreover, for each point in Xinit, our function will use a matrix to record the root it converges to.

```
[]:
```

```
[7]: #This function keeps track of what root each point in Xinit converges to
     #and creates a list of all the unique roots
     #INPUT: function f, function fprime, Xinit, n, m
     #OUTPUT: matrix of size m,n where the entries are the index
     #of the root that initial guess m,n in Xinit converges to
     TOL = 1.e-8;
     MAX_IT = 1000;
     def my_newton_find_roots(f,fprime, Xinit,n,m):
       #this array will store the unique roots of f as we find them
       #this n xm matrix will store the root each intial guess converges to
       convergence_mat = np.zeros((n,m));
       #rows of Xinit
       for i in range(0, Xinit.shape[0]):
         #cols of Xinit
         for j in range(0,Xinit.shape[1]):
           z0 = Xinit[i,j];
           r = my_newton(f,fprime,z0,TOL,MAX_IT)
           if r is not False:
             #find the index of the root within TOL of r in the roots array
             #or add r to the roots array
             #get_root_index(roots,r) is a new function defined in the next code cell
```

```
my_root = get_root_index(roots,r)
    #add the index of r to the correct spot in convergence matrix for_
plotting
    convergence_mat[i,j] = my_root;
return convergence_mat,roots
```

```
[8]: #This function keeps track of unique roots found
     #For a root r, if r is already in the roots array this function returns
     #the index of r in the roots array so we can store it in the convergence mat
     #for coloring the complex plane later
     #INPUTS: roots array, r current root returned by Newtons Method
     def get_root_index(roots,r):
       #first we're gonna see if r has already been added to the roots array
       #we have a root approximation r, and we check to see if any other value in
       #the roots array is within TOL of our current root r
       try:
         #if we can find a value, call it R, in the roots array that is within TOL
        #of the current root approximation, r, then we return the index of R
        #in the roots array.
        return np.where(np.isclose(roots, r, atol=TOL))[0][0]
       #if we dont find a value close to r that means we havent added it to the
       #roots array yet
       except IndexError:
         #we add it here
        roots.append(r)
        #this is taking the length of the roots array and subtracting one
        #so that we return the last index of the roots array, indexing starts
         #at 0 so that is why we do len(root)-1
        return len(roots) - 1
```

Now we use all our functions to make the Newton's Fractal!

```
[9]: #define and Xinit
min_real = -1;
max_real = 1;
min_imag = -1;
max_imag = 1;
n = 200;
m = 200;
xreal = np.linspace(min_real, max_real, m)
ximag = np.linspace(min_imag, max_imag, n)
Xreal, Ximag = np.meshgrid(xreal, ximag)
Xinit = Xreal+1j*Ximag;
#pick the function you want to plot
f = lambda z: z**3 - 2
fprime = lambda z: 3*(z**2)
#call the functions we just made, make sure you compiled
```

```
#my_newton at top of notebook
convergence_mat,roots = my_newton_find_roots(f,fprime,Xinit,n,m)
```

We've run our code, now we need to plot the results!

```
[10]: import numpy as np
      import matplotlib.pyplot as plt
      from matplotlib import cm
      from matplotlib.colors import ListedColormap, LinearSegmentedColormap
      plt.figure(figsize=(10,10))
      #let's check and see how many roots we found.
      #How can we check if it's the right number?
      nroots = len(roots)
      print("Total number of roots is:", nroots)
      #Recall, we are going to color the complex plane in the following way:
      #Xinit contains a bunch of points in the complex plain.
      #We use Newton's Method to find out what root each of those points converges to.
      #We stored the roots in an array.
      #Now for point (i,j) in Xinit, convergence mat(i,j) returned by our function
      #holds the index of the root in the roots array that the point (i,j) converged
       \hookrightarrow to.
      #Lets make a list of colors.
      colors = cm.get_cmap('Spectral', nroots)
      #each index in the roots array corresponds to a color in colors array
      #this next line will take an n x m square, and color each pixel
      #corresponding to the root index in the convergence_mat
      plt.imshow(convergence_mat, cmap=colors, origin='lower')
      plt.axis('off')
      plt.show()
```

Total number of roots is: 3

```
/tmp/ipykernel_2010082/868738006.py:18: MatplotlibDeprecationWarning: The
get_cmap function was deprecated in Matplotlib 3.7 and will be removed in 3.11.
Use ``matplotlib.colormaps[name]`` or ``matplotlib.colormaps.get_cmap()`` or
    ``pyplot.get_cmap()`` instead.
    colors = cm.get_cmap('Spectral', nroots)
```

