

Introductory Scientific Computing with Python

Basic SciPy

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Outline

1 Solving linear systems

2 Finding Roots

3 ODEs

4 FFTs

Solution of equations

Consider,

$$\begin{aligned}3x + 2y - z &= 1 \\2x - 2y + 4z &= -2 \\-x + \frac{1}{2}y - z &= 0\end{aligned}$$

Solution:

$$\begin{aligned}x &= 1 \\y &= -2 \\z &= -2\end{aligned}$$

Solving using Matrices

Let us now look at how to solve this using **matrices**

```
In []: A = array([[3, 2, -1],  
                 [2, -2, 4],  
                 [-1, 0.5, -1]])
```

```
In []: b = array([1, -2, 0])
```

```
In []: x = solve(A, b)
```

Solution:

```
In []: x
```

```
Out []: array([ 1., -2., -2.])
```

Let's check!

```
In []: Ax = dot(A, x)
```

```
In []: Ax
```

```
Out []: array([ 1.00000000e+00, -2.00000000e+00,  
-1.11022302e-16])
```

The last term in the matrix is actually 0!

We can use `allclose()` to check.

```
In []: allclose(Ax, b)
```

```
Out []: True
```

10 m

Problem

Solve the set of equations:

$$x + y + 2z - w = 3$$

$$2x + 5y - z - 9w = -3$$

$$2x + y - z + 3w = -11$$

$$x - 3y + 2z + 7w = -5$$

Solution

Use `solve()`

$$x = -5$$

$$y = 2$$

$$z = 3$$

$$w = 0$$

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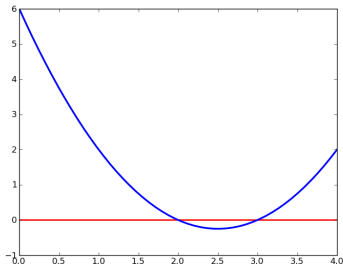
SciPy: roots

- Calculates the roots of polynomials
- To calculate the roots of $x^2 - 5x + 6$

```
In []: coeffs = [1, -5, 6]
```

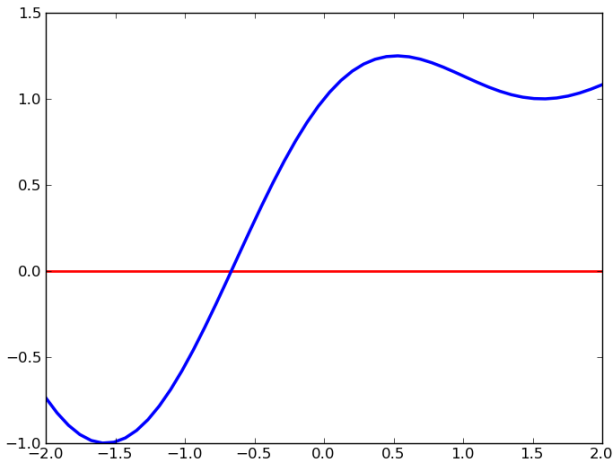
```
In []: roots(coeffs)
```

```
Out []: array([3., 2.])
```



SciPy: `fsolve`

Find the root of $\sin(z) + \cos^2(z)$ nearest to 0



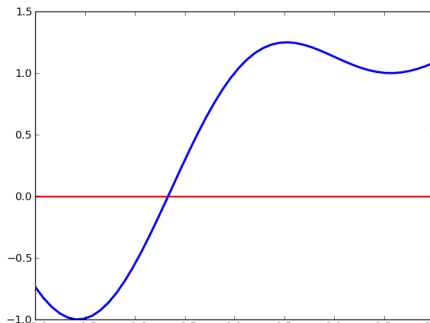
fsolve

```
In []: from scipy.optimize import fsolve
```

- Finds the roots of a system of non-linear equations
- Input arguments - **Function** and initial estimate
- Returns the solution

fsolve ...

```
In []: def g(z):  
      ....:     return sin(z)+cos(z)*cos(z)  
In []: fsolve(g, 0)  
Out []: -0.66623943249251527
```

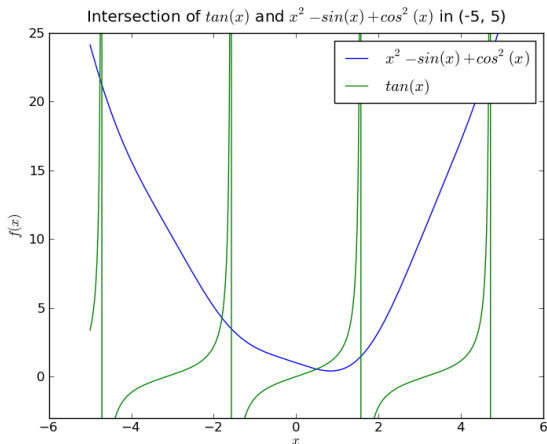


Exercise Problem

Find the root of the equation
 $x^2 - \sin(x) + \cos^2(x) = \tan(x)$ nearest to 0

Solution

```
def g(x):
    return x**2 - sin(x) + cos(x)*cos(x) - tan(x)
fsolve(g, 0)
```



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Solving ODEs using SciPy

- Consider the spread of an epidemic in a population
- $\frac{dy}{dt} = ky(L - y)$ gives the spread of the disease
- L is the total population.
- Use $L = 2.5E5, k = 3E - 5, y(0) = 250$

Solving ODEs using SciPy

Define a function as below

```
In []: from scipy.integrate import odeint
In []: def epid(y, t):
...:     k = 3.0e-5
...:     L = 2.5e5
...:     return k*y*(L-y)
...:
```

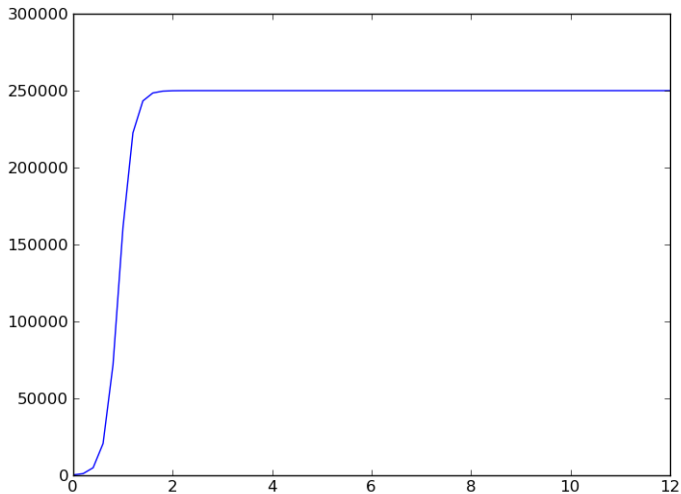
Solving ODEs using SciPy ...

```
In []: t = linspace(0, 12, 61)
```

```
In []: y = odeint(epid, 250, t)
```

```
In []: plot(t, y)
```

Result



35 m



ODEs - Simple Pendulum

We shall use the simple ODE of a simple pendulum.

$$\ddot{\theta} = -\frac{g}{L}\sin(\theta)$$

- This equation can be written as a system of two first order ODEs

$$\dot{\theta} = \omega \quad (1)$$

$$\dot{\omega} = -\frac{g}{L}\sin(\theta) \quad (2)$$

At $t = 0$:

$$\theta = \theta_0(10^\circ) \quad \& \quad \omega = 0 \quad (\text{Initial values})$$

ODEs - Simple Pendulum ...

- Use `odeint` to do the integration

```
In []: def pend_rhs(state, t):  
.....     theta = state[0]  
.....     omega = state[1]  
.....     g = 9.81  
.....     L = 0.2  
.....     F=[omega, -(g/L)*sin(theta)]  
.....     return F  
.....
```

ODEs - Simple Pendulum ...

- **t** is the time variable
- **initial** has the initial values

```
In []: t = linspace(0, 20, 101)
```

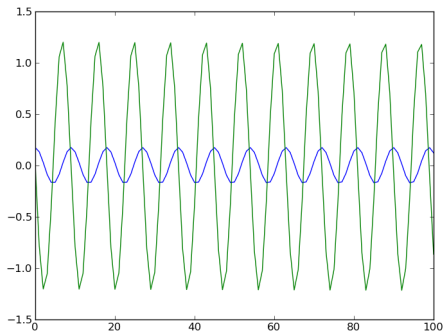
```
In []: initial = [10*2*pi/360, 0]
```

ODEs - Simple Pendulum ...

```
In []: from scipy.integrate import odeint
```

```
In []: pend_sol = odeint(pend_rhs,  
                        initial,t)
```


Result



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The FFT

- We have a simple signal $y(t)$
- Find the FFT and plot it

```
In []: t = linspace(0, 2*pi, 500)
```

```
In []: y = sin(4*pi*t)
```

```
In []: f = fft.fft(y)
```

```
In []: freq = fft.fftfreq(500,  
    ...:                    t[1] - t[0])
```

```
In []: plot(freq[:250], abs(f)[:250])
```

```
In []: grid()
```

FFTs cont...

```
In []: y1 = fft.ifft(f) # inverse FFT  
In []: allclose(y, y1)  
Out []: True
```

FFTs cont...

Let us add some noise to the signal

```
In []: yr = y +  
      ...:      random.random(size=500)*0.2
```

```
In []: yn = y +  
      ...:      random.normal(size=500)*0.2
```

```
In []: plot(t, yr)
```

```
In []: figure()
```

```
In []: plot(freq[:250],  
      ...:      abs(fft.fft(yr))[:250])
```

- **random**: produces uniform deviates in $[0, 1)$
- **normal**: draws random samples from a Gaussian

FFTs cont...

Filter the noisy signal:

```
In []: from scipy import signal
In []: yc = signal.wiener(yn, 5)
In []: clf()
In []: plot(t, yc)
In []: figure()
In []: plot(freq[:250],
...:      abs(fft.fft(yc))[:250])
```

Only scratched the surface here ...

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Things we have learned

- Solving Linear Equations
- Defining Functions
- Finding Roots
- Solving ODEs
- FFTs and basic signal processing

Further reading

- ipython.github.com/ipython-doc
- matplotlib.sf.net/contents.html
- scipy.org/Tentative_NumPy_Tutorial
- docs.scipy.org/doc/scipy/reference/tutorial