```
In [1]:
```

```
%matplotlib notebook
```

```
from matplotlib.pylab import *
from numpy import *
```

# Homework #7

# Problem #1 (TB 11.2, page

Find the best-fit coefficients  $\mathbf{c}=(c_0,c_1,c_2)$  so that

$$g(x) = c_0 e^x + c_1 \sin(x) + c_2 \Gamma(x)$$
 " (1)

approximates the function f(x)=1/x as closely as possible. To find  $\overline{{f c}}$  that minimizes the function

$$\mathbf{F}(c) = \|f(\mathbf{x}) - g(\mathbf{x})\|_2^2 \tag{2}$$

over an interval  $x \in [a,b]$ .

#### Task

We solve this problem by discretizing the interval [a,b] using discrete nodes  $\mathbf{x} = [x_0, x_1, \dots x_{m-1}]$ . We then solve the system of equations

$$c_0 e^{x_i} + c_1 \sin(x_i) + c_2 \Gamma(x_i) = f(x_i), \qquad i = 0, 1, \dots m-1$$

This will in general be an overdetermined system that can be expressed as the linear system

$$A\mathbf{c} = \mathbf{F} \tag{4}$$

where  $A \in \mathbb{R}^{m imes 3}$  and  $\mathbf{F} \in \mathbb{R}^{m imes 1}$ .

- Solve this resulting linear system using Algorithm 11.2 in TB (page 83).
- Choose m so that the relative norm satisfies

$$\frac{\|\mathbf{f} - \mathbf{g}\|_2}{\|\mathbf{f}\|_2} \le 10^{-2} \tag{5}$$

where vectors  $\mathbf{f}$  and  $\mathbf{g}$  are defined as  $\mathbf{f} = f(\mathbf{x})$  and  $\mathbf{g} = g(\mathbf{x})$ . Your value of m should not be very large.

- Display the coefficients  $\mathbf{c}=(c_0,c_1,c_2)$  you obtain for each interval (a,b).
- Plot the function f(x) and your approximation g(x) on the same graph.

#### Hints

- Use linspace to construct discrete points  $x_i, i=0,1,\ldots m-1$ .
- Use the SciPy function scipy.special.gamma to get the function  $\Gamma(x)$ .
- Use the QR function provided below.
- For the interval (0,1), you can use an interval  $(\varepsilon,1)$ , where  $\varepsilon\ll 1$ .
- Use the notebook "Hmwk7\_exact" to compare the coefficients you get to the exact solution computed using SymPy.

```
In [2]:

def display_mat(msg,A):
    print(msg)
    fstr = {'float' : "{:>16.8f}".format}
    with printoptions(formatter=fstr):
        display(A)
    print("")
```

```
In [3]:
         # Use this QR algorithm, or you may use your own from Homework #6
         def QR House(A):
             m,n = A.shape
             R = A.copy()
             Qt = eye(m)
             p = min([m,n])
             for j in range(p):
                 x = R[j:m,j:j+1]
                 I = eye(m-j)
                 s = 1 if x[0] >= 0 else -1 # sign function, with sign(0) = 1
                 v = s*linalg.norm(x,2)*I[:,0:1] + x
                 v = v/linalg.norm(v, 2)
                 F = I - 2*(v@v.T)
                 R[j:m,j:n] = F@R[j:m,j:n]
                 Qt[j:m,:] = F@Qt[j:m,:] # Solution to Homework #6 !!!
             Qt = Qt.T
             return Qt, R
```

```
In [4]:
    from scipy.special import gamma

def f(x):
        return 1/x

def g(c,x):
    return c[0]*exp(x)+c[1]*sin(x)+c[2]*gamma(x)
```

```
In [5]: # a=1
    # b=2
    # m=150

# x = reshape(linspace(a,b,m),(m,1))
    # V = zeros((m,3))

# V[:,0:1] = exp(x)
    # V[:,1:2] = sin(x)
    # V[:,2:3] = gamma(x)

# Q,R = QR_House(V)

# p = linalg.matrix_rank(V)
    # F = f(x)
    # f1 = Q.T@F
    # c = linalg.inv(R[0:p,0:p])@Q[:,0:p].T@F
    # #c = linalg.lstsq(R,f1,rcond=None)[0]

# G = g(c,x)
```

### Problem 1a

Compute the coefficients c for the interval (a, b).

```
In [13]:
          def fn(a,b,m):
              x = reshape(linspace(a,b,m),(m,1))
              V = zeros((m,3))
              for i in range(0,m):
                  V[i:,0:1] = \exp(x[i])
                  V[i:,1:2] = sin(x[i])
                  V[i:,2:3] = gamma(x[i])
              Q,R = QR_House(V)
              p = linalg.matrix rank(V)
              F = f(x)
              f1 = Q.T@F
              \#c = linalg.inv(R[0:p,0:p])@Q[:,0:p].T@F
              c = linalg.lstsq(R,f1,rcond=None)[0]
              G = g(c,x)
              return x,c,p,F,G
          a=1
          b=2
          m=50
          x,c,p,F,G=fn(a,b,m)
         array([[-0.10774242],
Out[13]:
                [ 0.00959252],
```

[ 1.28659552]])

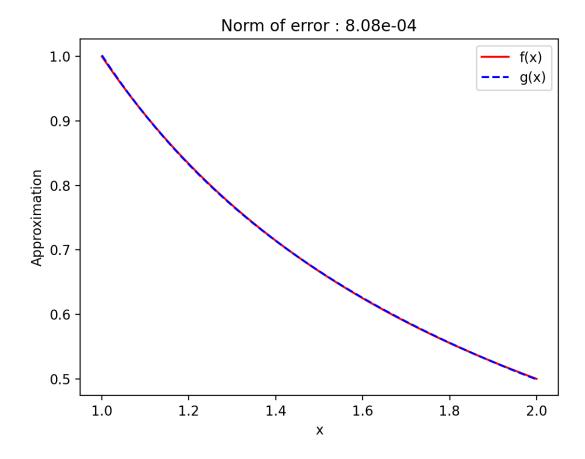
```
In [7]: figure(1)
    clf()

plot(x,F,'r',label='f(x)')
    plot(x,G,'b--',label='g(x)')

rel_norm = linalg.norm(G-F,2)/ linalg.norm(F,2)

str = "Norm of error : {:.2e}".format(rel_norm)
    xlabel('x')
    ylabel('Approximation')
    title(str)

legend()
    show()
```



## **Problem 1b**

Compute the coefficients c for the interval (0,1).

### Question:

Is there one function used to define g(x) that seems to be the closest match to f(x)?

```
In [12]:
          # Repeat the above for interval (0,1)
          figure(2)
          a1=0.1
          b1=1
          m1=50
          x1,c1,p1,F1,G1= fn(a1,b1,m1)
          plot(x1,F1,'r',label='f(x)')
          plot(x1,G1,'b--',label='g(x)')
          rel_norm = linalg.norm(G1-F1,2)/ linalg.norm(F1,2)
                                                                      Compute relative norm
          str = "Norm of error : {:.2e}".format(rel_norm)
          xlabel('x')
          ylabel('Approximation')
          title(str)
          legend()
          show()
```

