

Lab3

December 6, 2020

```
[330]: #####
##          Q1          ##
#####

# Cauchy Problem
#  $y'(x) = \lambda y(x)$ 
#  $y(0) = y_0$ 

def forward_euler(h,y0,lamb):
    y0 = y0 + h*np.dot(lamb, y0)
    return y0

def backward_euler(h, y0, lamb):
    # Implement Newton's Iteration
    y1 = forward_euler(h, y0, lamb) # Initial value for Newton Iteration
    g = y1-y0-h*lamb*y1
    g_prime = 1-h*lamb**2*y1
    for i in range(0,1000):
        y0 = y1
        y1 = y0 - g/g_prime
        g = y1-y0-h*lamb*y1
        g_prime = 1-h*lamb**2*y1

    return y1
```

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[331]: #####
##          Q2          ##
#####

import numpy as np
import matplotlib.pyplot as plt

# 2a)  $\lambda = -23$ ;  $h = 0.1$ 
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lamb = -23
h = 0.1
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = forward_euler(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e1 = err[x.shape[0]-1]

# 2a) h = 0.05
h = 0.05
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = forward_euler(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e2 = err[x.shape[0]-1]

# 2a) h = 0.02
h = 0.02
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(1,x.shape[0]):
    y[i+1] = forward_euler(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e3 = err[x.shape[0]-1]

# 2a) h = 0.01
h = 0.01
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = y[i] + h*lamb*y[i]

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err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e4 = err[x.shape[0]-1]

# 2a) h = 0.005
h = 0.005
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = forward_euler(h, y[i], lamb)

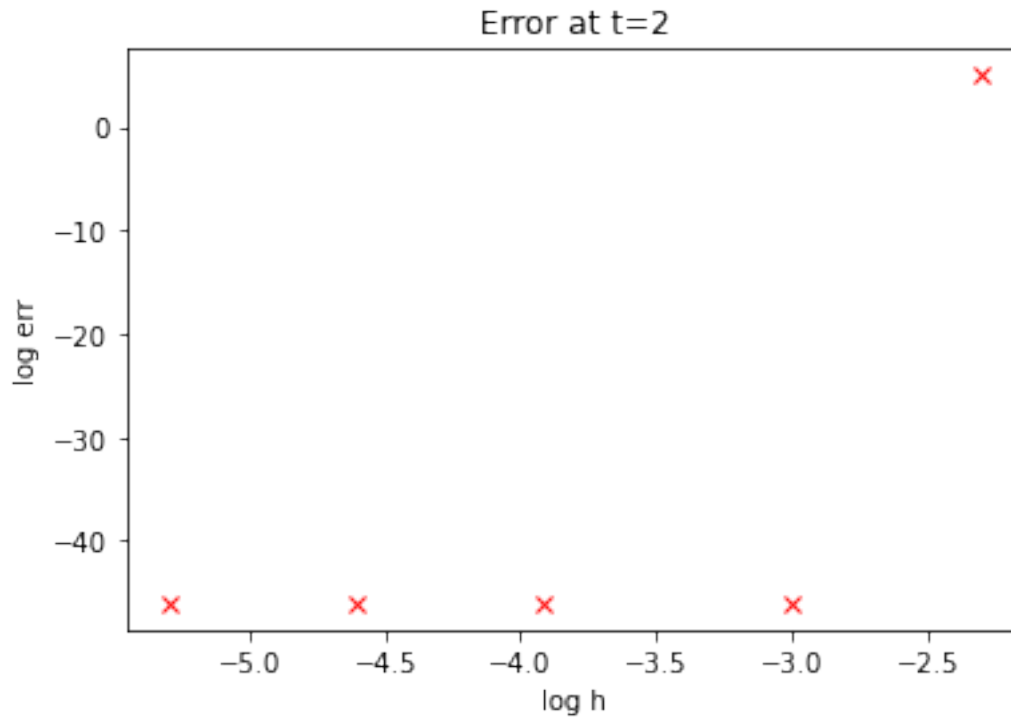
err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e5 = err[x.shape[0]-1]

plt.plot(np.log([0.1,0.05,0.02,0.01,0.005]),[e1,e2,e3,e4,e5], 'rx')
plt.xlabel("log h")
plt.ylabel("log err")
plt.title('Lambda = -23')
plt.title("Error at t=2")

## We can see that the approximations errors are getting small as
## stepsize h becomes small.

```

[331]: Text(0.5, 1.0, 'Error at t=2')



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```
[332]: # 2a) lamb = 1; h = 0.1
lamb = 1
h = 0.1
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = forward_euler(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e1 = err[x.shape[0]-1]

# 2a) lamb = 1; h = 0.05
```

```

h = 0.05
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = forward_euler(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e2 = err[x.shape[0]-1]

# 2a) lamb = 1; h = 0.02
h = 0.02
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(1,x.shape[0]):
    y[i+1] = forward_euler(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e3 = err[x.shape[0]-1]

# 2a) lamb = 1; h = 0.01
h = 0.01
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = y[i] + h*lamb*y[i]

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e4 = err[x.shape[0]-1]

# 2a) lamb = 1; h = 0.005
h = 0.005
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = forward_euler(h, y[i], lamb)

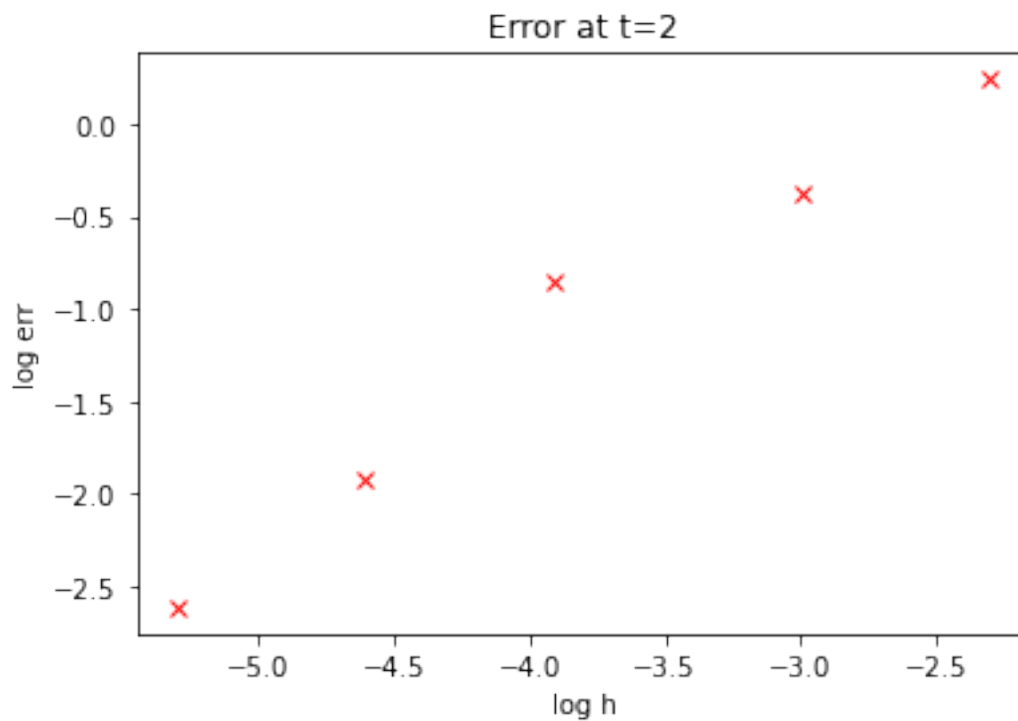
err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e5 = err[x.shape[0]-1]

```

```
plt.plot(np.log([0.1,0.05,0.02,0.01,0.005]),[e1,e2,e3,e4,e5], 'rx')
plt.xlabel("log h")
plt.ylabel("log err")
plt.title('Lambda = 1')
plt.title("Error at t=2")
```

*## We can see that the approximations errors are getting small as
stepsize h becomes small.*

[332]: Text(0.5, 1.0, 'Error at t=2')



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[333]: # 2a)  $\lambda = \text{diag}(-1, -100)$ ;  $h = 0.1$ 
lamb = np.diag([+1, -100])
h = 0.1
x = np.arange(0, 2, h) + h
y = np.ones([x.shape[0] + 1, 2])

for i in range(0, x.shape[0]):
    y[i+1, :] = forward_euler(h, y[i, :], lamb)

err = np.log(np.abs(np.sum(y[0:x.shape[0], :]**2, axis=1) - (np.exp(-2*x) + np.
    ↪exp(-200*x))))
e1 = err[x.shape[0] - 1]

# 2a)  $\lambda = \text{diag}(-1, -100)$ ;  $h = 0.05$ 
lamb = np.diag([-1, -100])
h = 0.05
x = np.arange(0, 2, h) + h
y = np.ones([x.shape[0] + 1, 2])

for i in range(0, x.shape[0]):
    y[i+1, :] = forward_euler(h, y[i, :], lamb)

err = np.log(np.abs(np.sum(y[0:x.shape[0], :]**2, axis=1) - (np.exp(-2*x) + np.
    ↪exp(-200*x))))
e2 = err[x.shape[0] - 1]

# 2a)  $\lambda = \text{diag}(-1, -100)$ ;  $h = 0.02$ 
lamb = np.diag([-1, -100])
h = 0.02
x = np.arange(0, 2, h) + h
y = np.ones([x.shape[0] + 1, 2])

for i in range(0, x.shape[0]):
    y[i+1, :] = forward_euler(h, y[i, :], lamb)

err = np.log(np.abs(np.sum(y[0:x.shape[0], :]**2, axis=1) - (np.exp(-2*x) + np.
    ↪exp(-200*x))))
e3 = err[x.shape[0] - 1]

```

```

# 2a) lamb = diag(-1,-100); h = 0.01
lamb = np.diag([-1,-100])
h = 0.01
x = np.arange(0,2,h)+h
y = np.ones([x.shape[0]+1,2])

for i in range(0,x.shape[0]):
    y[i+1,:] = forward_euler(h, y[i,:], lamb)

err = np.log(np.abs(np.sum(y[0:x.shape[0],:]**2,axis=1)-(np.exp(-2*x)+np.
    ↪exp(-200*x))))
e4 = err[x.shape[0]-1]

# 2a) lamb = diag(-1,-100); h = 0.005
lamb = np.diag([-1,-100])
h = 0.005
x = np.arange(0,2,h)+h
y = np.ones([x.shape[0]+1,2])

for i in range(0,x.shape[0]):
    y[i+1,:] = forward_euler(h, y[i,:], lamb)

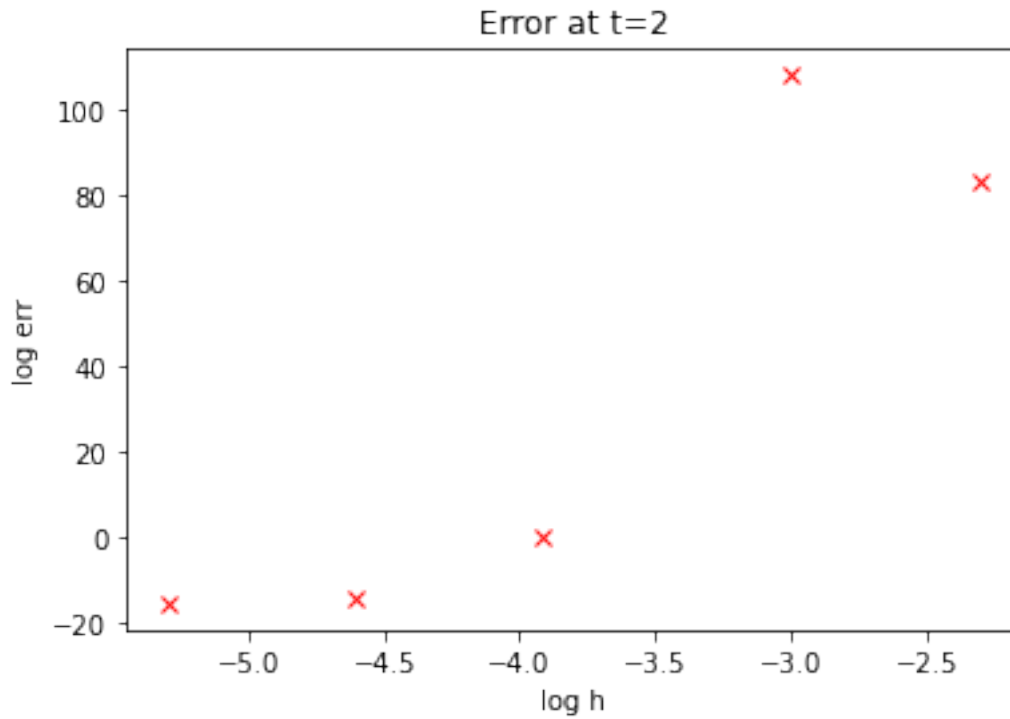
err = np.log(np.abs(np.sum(y[0:x.shape[0],:]**2,axis=1)-(np.exp(-2*x)+np.
    ↪exp(-200*x))))
e5 = err[x.shape[0]-1]

plt.plot(np.log([0.1,0.05,0.02,0.01,0.005]),[e1,e2,e3,e4,e5], 'rx')
plt.xlabel("log h")
plt.ylabel("log err")
plt.title("Error at t=2")

## We can see that the approximations errors are getting small as
## stepsize h becomes small.

```

[333]: Text(0.5, 1.0, 'Error at t=2')



```
[334]: #####
##          Q2c          ##
#####

# Let h = 0.05, lambda = -23
lamb = -23
h = 0.005
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

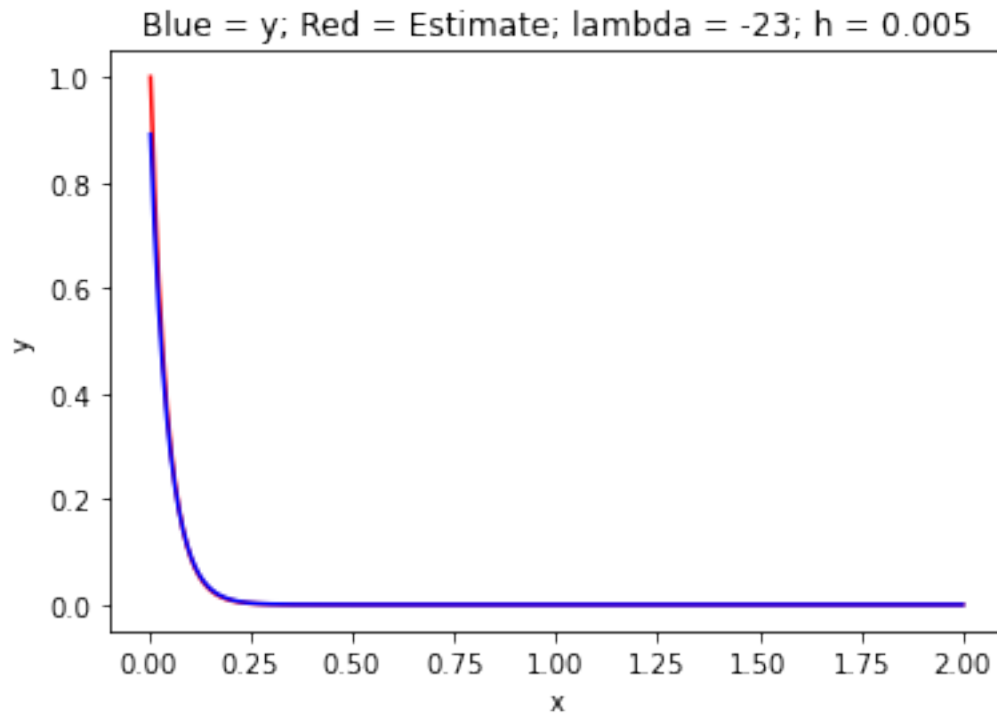
for i in range(0,x.shape[0]):
    y[i+1] = forward_euler(h, y[i], lamb)

# err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))

plt.plot(x, y[:x.shape[0]], 'r-', x, np.exp(lamb*x), 'b-')
plt.xlabel("x")
plt.ylabel("y")
plt.title("Blue = y; Red = Estimate; lambda = -23; h = 0.005")
```

```
## We can see that the approximations are getting very close to the exact
↪ values as
## stepsize h becomes small.
```

```
[334]: Text(0.5, 1.0, 'Blue = y; Red = Estimate; lambda = -23; h = 0.005')
```



```
[335]: #####
##          Q2c          ##
#####

# Let h = 0.05, lambda = 1
lamb = 1
h = 0.005
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

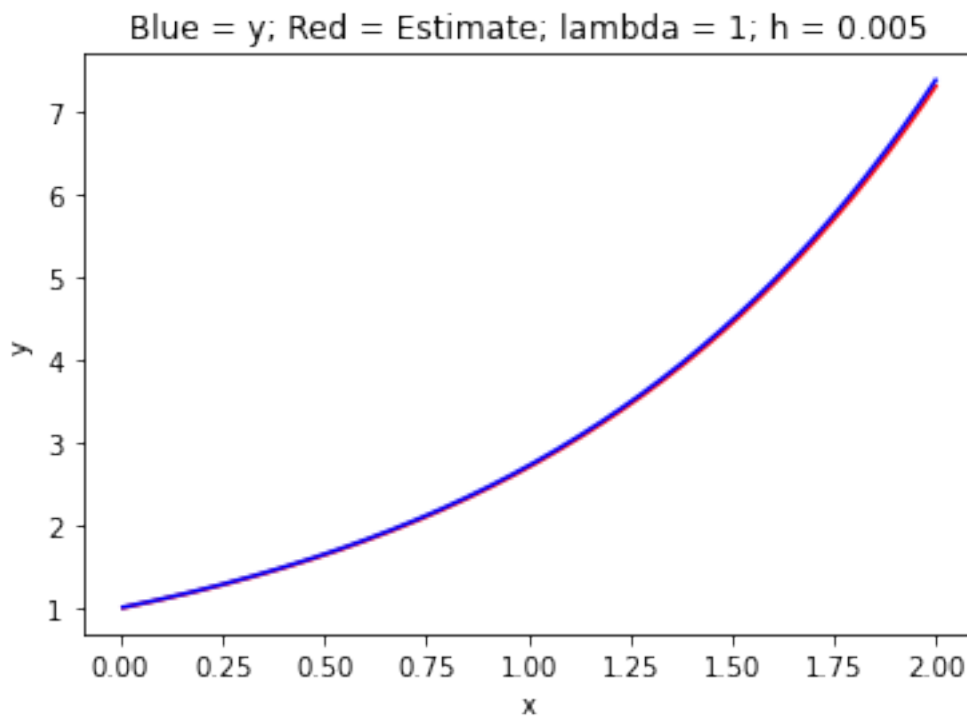
for i in range(0,x.shape[0]):
    y[i+1] = forward_euler(h, y[i], lamb)

# err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
```

```
plt.plot(x, y[:x.shape[0]], 'r-', x, np.exp(lamb*x), 'b-')
plt.xlabel("x")
plt.ylabel("y")
plt.title("Blue = y; Red = Estimate; lambda = 1; h = 0.005")

## We can see that the approximations are getting very close to the exact
↪ values as
## stepsize h becomes small.
```

[335]: Text(0.5, 1.0, 'Blue = y; Red = Estimate; lambda = 1; h = 0.005')



```
[336]: # 2c) lamb = diag(-1,-100); h = 0.005
lamb = np.diag([-1,-100])
h = 0.005
x = np.arange(0,2,h)+h
y = np.ones([x.shape[0]+1,2])

for i in range(0,x.shape[0]):
    y[i+1,:] = forward_euler(h, y[i,:], lamb)
```

```

plt.plot(x, y[:x.shape[0],0], 'r-', x, np.exp(lamb[0,0]*x), 'b-')
plt.xlabel("x")
plt.ylabel("y1")

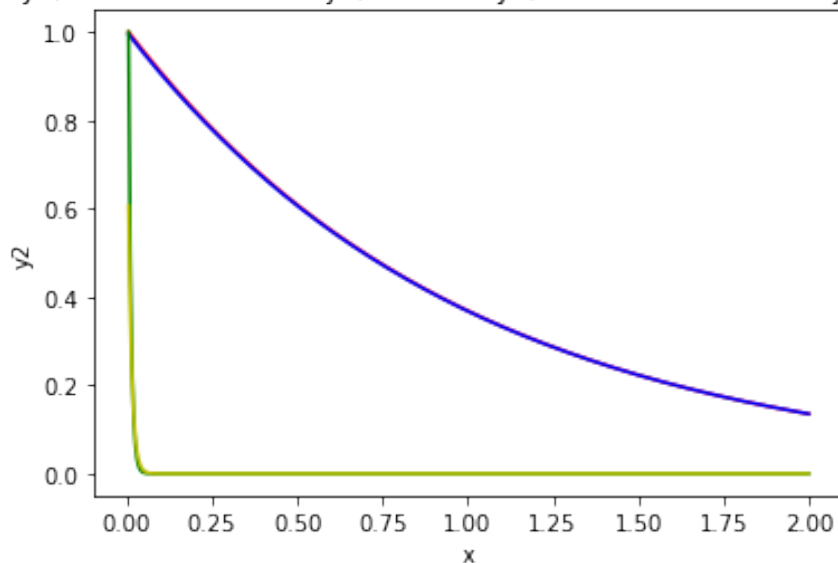
plt.plot(x, y[:x.shape[0],1], 'g-', x, np.exp(lamb[1,1]*x), 'y-')
plt.xlabel("x")
plt.ylabel("y2")
plt.title("Blue = y1; Red = Estimate of y1; Green = y2; Yellow = Estimate of y2;
↪ h = 0.005")

## We can see that the approximations errors are getting small as
## stepsize h becomes small.

```

[336]: Text(0.5, 1.0, 'Blue = y1; Red = Estimate of y1; Green = y2; Yellow = Estimate of y2; h = 0.005')

Blue = y1; Red = Estimate of y1; Green = y2; Yellow = Estimate of y2; h = 0.005



[337]:

```

#####
##          Q3          ##
#####

# Runge-Kutta

```

```

def RK(h,y0,lamb):
    b1 = 0
    c2 = 0.5
    b2 = 1
    K1 = np.dot(lamb,y0)
    K2 = np.dot(lamb,(y0+h*c2*K1))
    y1 = y0+h*(b1*K1+b2*K2)
    return y1

def RK4(h,y0,lamb):
    c1 = 0
    c2 = 0.5
    c3 = 0.5
    c4 = 1
    b1 = 1/6
    b2 = 1/3
    b3 = 1/3
    b4 = 1/6

    K1 = np.dot(lamb,y0)
    K2 = np.dot(lamb,(y0+h*c2*K1))
    K3 = np.dot(lamb,(y0+h*c3*K2))
    K4 = np.dot(lamb,(y0+h*c4*K3))
    y1 = y0+h*(b1*K1+b2*K2+b3*K3+b4*K4)
    return y1

```

[338]: *# 2-Stage Runge Kutta for Lambda = -23 with varying step size*

```

lamb = -23

# 3a) h = 0.1
h = 0.1
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e1 = err[x.shape[0]-1]

```

```

# 3a)  $h = 0.05$ 
h = 0.05
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e1 = err[x.shape[0]-1]

# 3a)  $h = 0.02$ 
h = 0.02
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e3 = err[x.shape[0]-1]

# 3a)  $h = 0.01$ 
h = 0.001
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e4 = err[x.shape[0]-1]

# 3a)  $h = 0.005$ 
h = 0.005
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK(h, y[i], lamb)

```

```

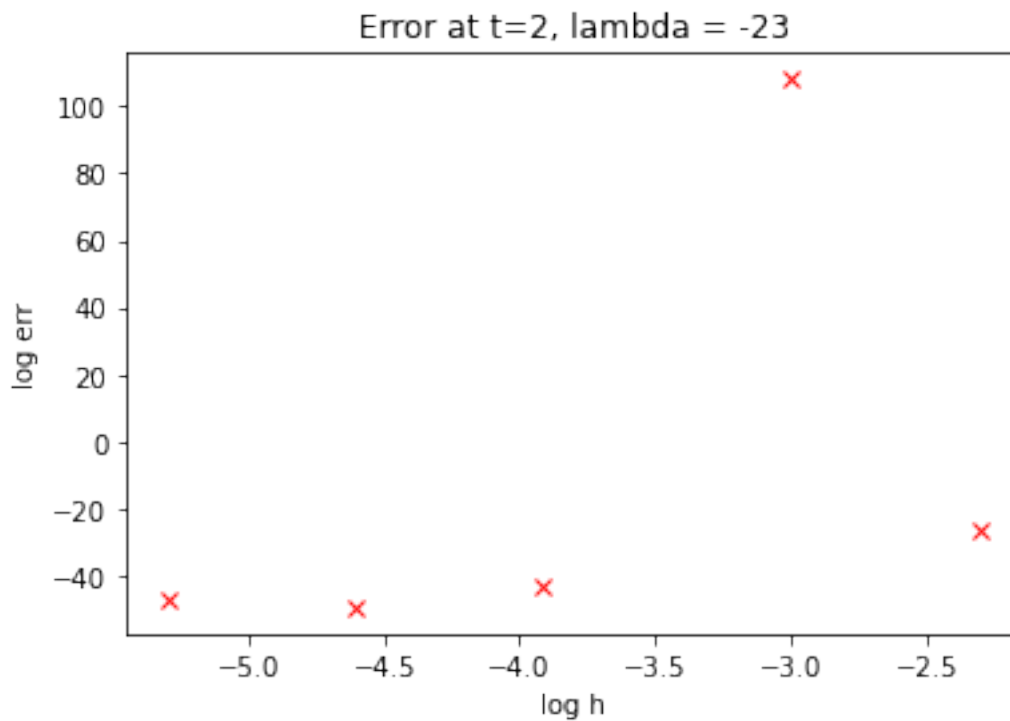
err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e5 = err[x.shape[0]-1]

plt.plot(np.log([0.1,0.05,0.02,0.01,0.005]),[e1,e2,e3,e4,e5], 'rx')
plt.xlabel("log h")
plt.ylabel("log err")
plt.title("Error at t=2, lambda = -23")

## We can see that the approximations errors are getting small as
## stepsize h becomes small.

```

[338]: Text(0.5, 1.0, 'Error at t=2, lambda = -23')



```

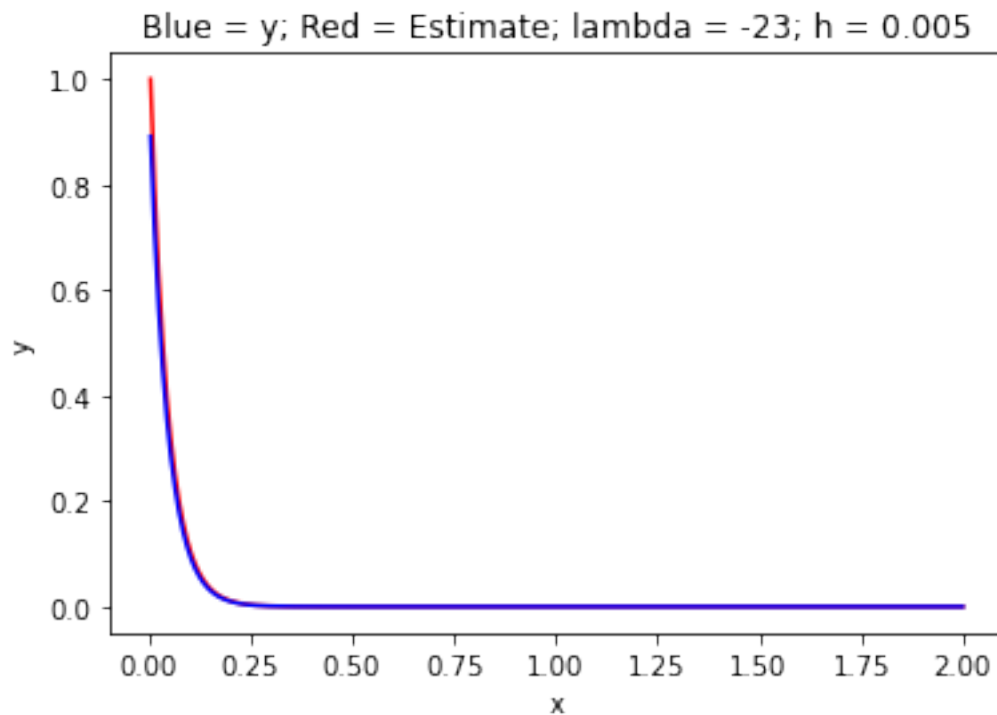
[339]: plt.plot(x, y[:x.shape[0]], 'r-', x, np.exp(lamb*x), 'b-')
plt.xlabel("x")
plt.ylabel("y")

plt.title("Blue = y; Red = Estimate; lambda = -23; h = 0.005")

## We can see that the approximations are getting very close to the exact
↪ values as
## stepsize h becomes small.

```

```
[339]: Text(0.5, 1.0, 'Blue = y; Red = Estimate; lambda = -23; h = 0.005')
```



```
[ ]:
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[ ]:
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```
[340]: # 2-Stage Runge Kutta for Lambda = 1 with varying step size
```

```
lamb = 1

# 3a) h = 0.1
h = 0.1
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e1 = err[x.shape[0]-1]
```



```

# 3a)  $h = 0.05$ 
h = 0.05
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e1 = err[x.shape[0]-1]

# 3a)  $h = 0.02$ 
h = 0.02
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e3 = err[x.shape[0]-1]

# 3a)  $h = 0.01$ 
h = 0.01
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e4 = err[x.shape[0]-1]

# 3a)  $h = 0.005$ 
h = 0.005
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK(h, y[i], lamb)

```

```

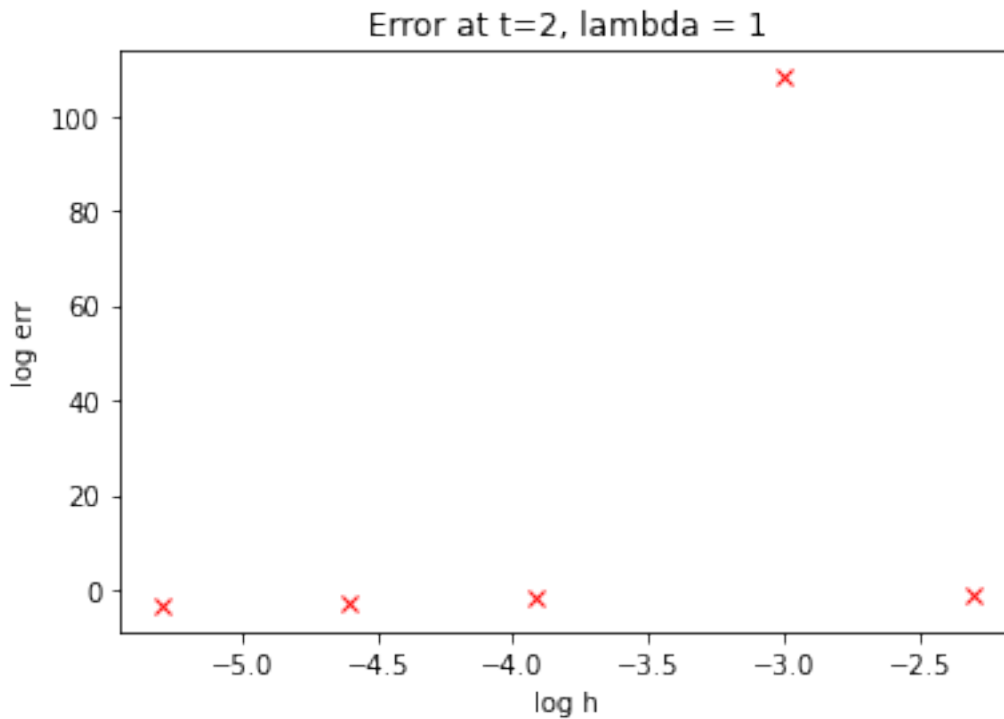
err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e5 = err[x.shape[0]-1]

plt.plot(np.log([0.1,0.05,0.02,0.01,0.005]),[e1,e2,e3,e4,e5], 'rx')
plt.xlabel("log h")
plt.ylabel("log err")
plt.title("Error at t=2, lambda = 1")

## We can see that the approximations errors are getting small as
## stepsize h becomes small.

```

[340]: Text(0.5, 1.0, 'Error at t=2, lambda = 1')



```

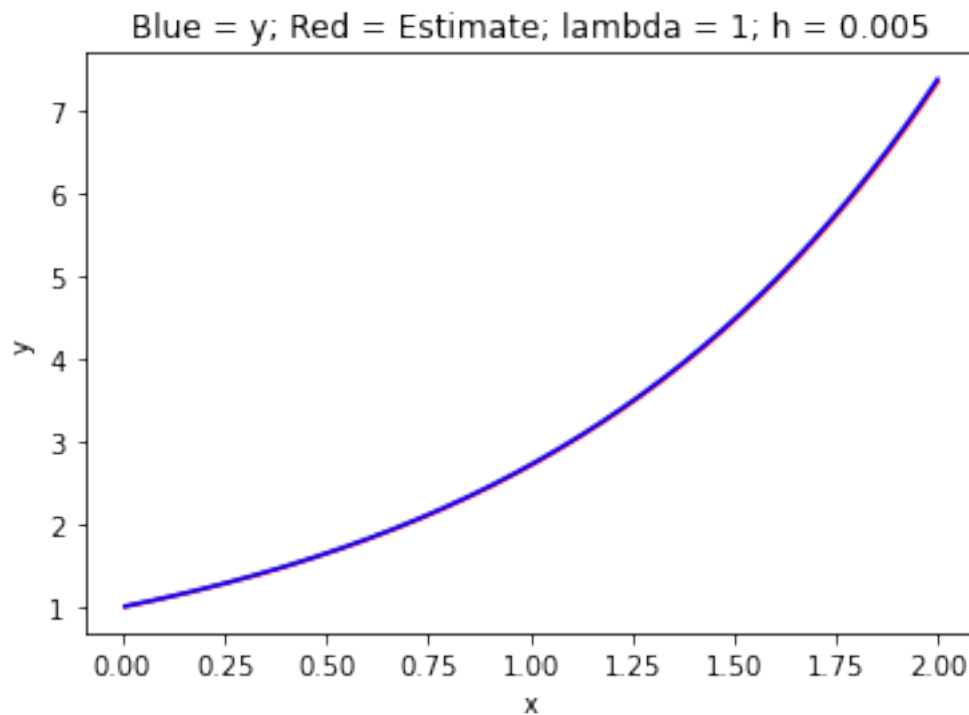
[341]: plt.plot(x, y[:x.shape[0]], 'r-', x, np.exp(lamb*x), 'b-')
plt.xlabel("x")
plt.ylabel("y")

plt.title("Blue = y; Red = Estimate; lambda = 1; h = 0.005")

## We can see that the approximations are getting very close to the exact
↪ values as
## stepsize h becomes small.

```

```
[341]: Text(0.5, 1.0, 'Blue = y; Red = Estimate; lambda = 1; h = 0.005')
```



```
[ ]:
```

```
[342]: # 3a) lamb = diag(-1,-100); h = 0.1
lamb = np.diag([-1,-100])
h = 0.1
x = np.arange(0,2,h)+h
y = np.ones([x.shape[0]+1,2])

for i in range(0,x.shape[0]):
    y[i+1,:] = RK(h, y[i,:], lamb)

err = np.log(np.abs(np.sum(y[0:x.shape[0],:]**2,axis=1)-(np.exp(-2*x)+np.
    ↪exp(-200*x))))
e1 = err[x.shape[0]-1]

# 3a) h = 0.05
lamb = np.diag([-1,-100])
h = 0.05
x = np.arange(0,2,h)+h
```

```

y = np.ones([x.shape[0]+1,2])

for i in range(0,x.shape[0]):
    y[i+1,:] = RK(h, y[i,:], lamb)

err = np.log(np.abs(np.sum(y[0:x.shape[0],:]**2,axis=1)-(np.exp(-2*x)+np.
    ↪exp(-200*x))))
e2 = err[x.shape[0]-1]

# 3a) h = 0.02
lamb = np.diag([-1,-100])
h = 0.02
x = np.arange(0,2,h)+h
y = np.ones([x.shape[0]+1,2])

for i in range(0,x.shape[0]):
    y[i+1,:] = RK(h, y[i,:], lamb)

err = np.log(np.abs(np.sum(y[0:x.shape[0],:]**2,axis=1)-(np.exp(-2*x)+np.
    ↪exp(-200*x))))
e3 = err[x.shape[0]-1]

# 3a) h = 0.01
lamb = np.diag([-1,-100])
h = 0.01
x = np.arange(0,2,h)+h
y = np.ones([x.shape[0]+1,2])

for i in range(0,x.shape[0]):
    y[i+1,:] = RK(h, y[i,:], lamb)

err = np.log(np.abs(np.sum(y[0:x.shape[0],:]**2,axis=1)-(np.exp(-2*x)+np.
    ↪exp(-200*x))))
e4 = err[x.shape[0]-1]

# 3a) h = 0.005
lamb = np.diag([-1,-100])
h = 0.005

```

```

x = np.arange(0,2,h)+h
y = np.ones([x.shape[0]+1,2])

for i in range(0,x.shape[0]):
    y[i+1,:] = RK(h, y[i,:], lamb)

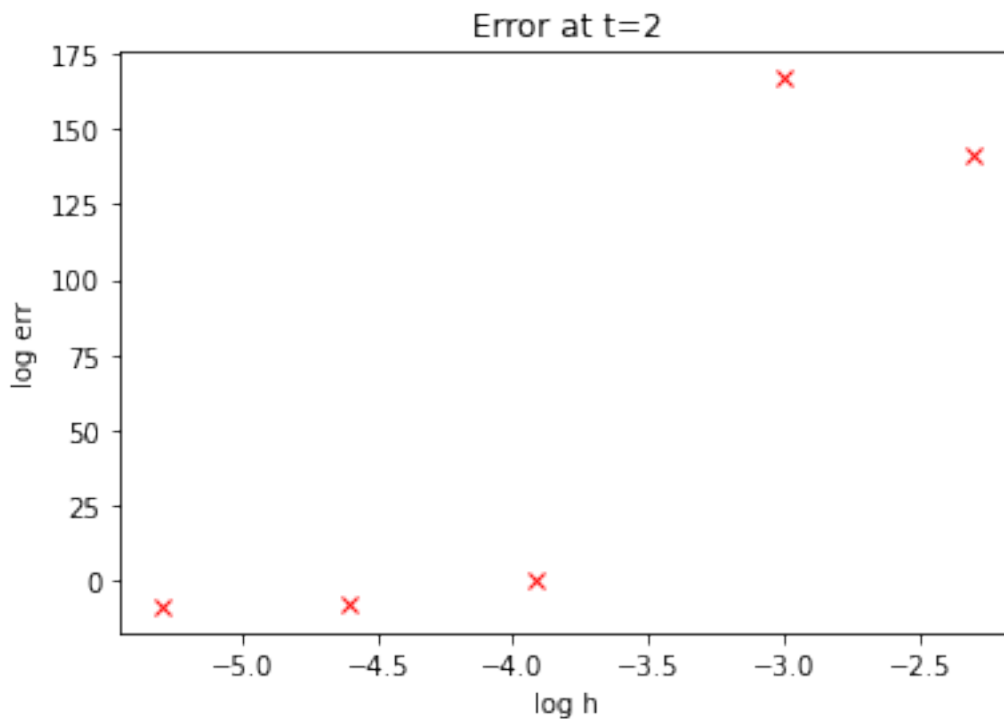
err = np.log(np.abs(np.sum(y[0:x.shape[0],:]**2,axis=1)-(np.exp(-2*x)+np.
    ↪exp(-200*x))))
e5 = err[x.shape[0]-1]

plt.plot(np.log([0.1,0.05,0.02,0.01,0.005]),[e1,e2,e3,e4,e5], 'rx')
plt.xlabel("log h")
plt.ylabel("log err")
plt.title("Error at t=2")

## We can see that the approximations errors are getting small as
## stepsize h becomes small.

```

[342]: Text(0.5, 1.0, 'Error at t=2')



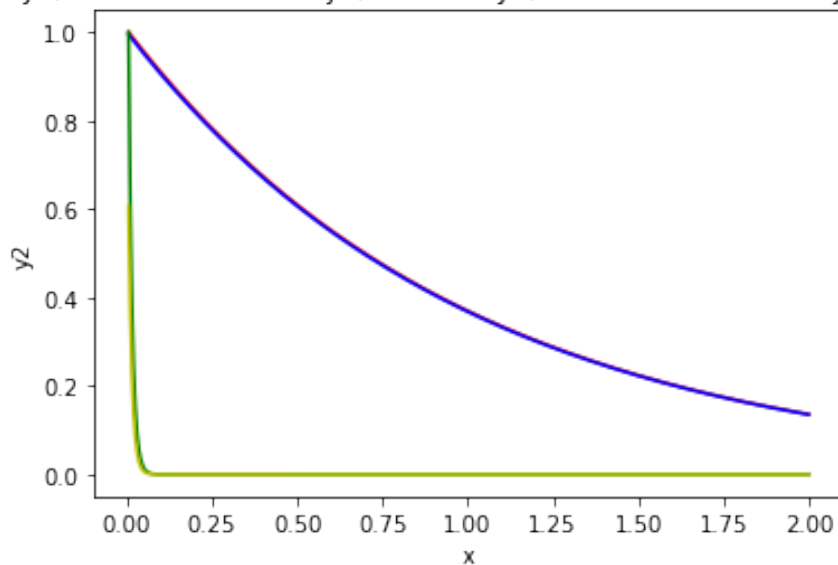
```
[343]: plt.plot(x, y[:x.shape[0],0], 'r-', x, np.exp(lamb[0,0]*x), 'b-')
plt.xlabel("x")
plt.ylabel("y1")

plt.plot(x, y[:x.shape[0],1], 'g-', x, np.exp(lamb[1,1]*x), 'y-')
plt.xlabel("x")
plt.ylabel("y2")
plt.title("Blue = y1; Red = Estimate of y1; Green = y2; Yellow = Estimate of y2;
↪ h = 0.005")

## We can see that the approximations are getting very close to the exact
↪ values as
## stepsize h becomes small.
```

```
[343]: Text(0.5, 1.0, 'Blue = y1; Red = Estimate of y1; Green = y2; Yellow = Estimate
of y2; h = 0.005')
```

Blue = y1; Red = Estimate of y1; Green = y2; Yellow = Estimate of y2; h = 0.005



```
[ ]:
```

```
[344]: # 4-Stage Runge Kutta for Lambda = -23 with varying step size
```

```

lamb = -23

# 3a)  $h = 0.1$ 
h = 0.1
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK4(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e1 = err[x.shape[0]-1]

# 3a)  $h = 0.05$ 
h = 0.05
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK4(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e1 = err[x.shape[0]-1]

# 3a)  $h = 0.02$ 
h = 0.02
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK4(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e3 = err[x.shape[0]-1]

# 3a)  $h = 0.01$ 
h = 0.001
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK4(h, y[i], lamb)

```

```

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e4 = err[x.shape[0]-1]

# 3a) h = 0.005
h = 0.005
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK4(h, y[i], lamb)

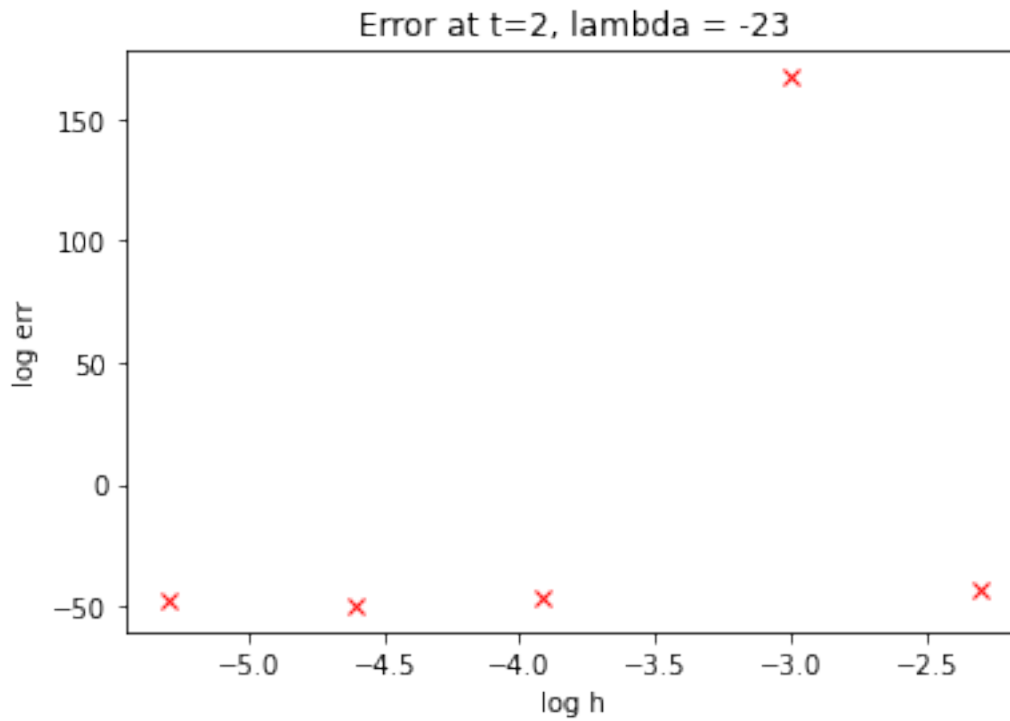
err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e5 = err[x.shape[0]-1]

plt.plot(np.log([0.1,0.05,0.02,0.01,0.005]),[e1,e2,e3,e4,e5], 'rx')
plt.xlabel("log h")
plt.ylabel("log err")
plt.title("Error at t=2, lambda = -23")

## We can see that the approximations errors are getting small as
## stepsize h becomes small.

```

[344]: Text(0.5, 1.0, 'Error at t=2, lambda = -23')

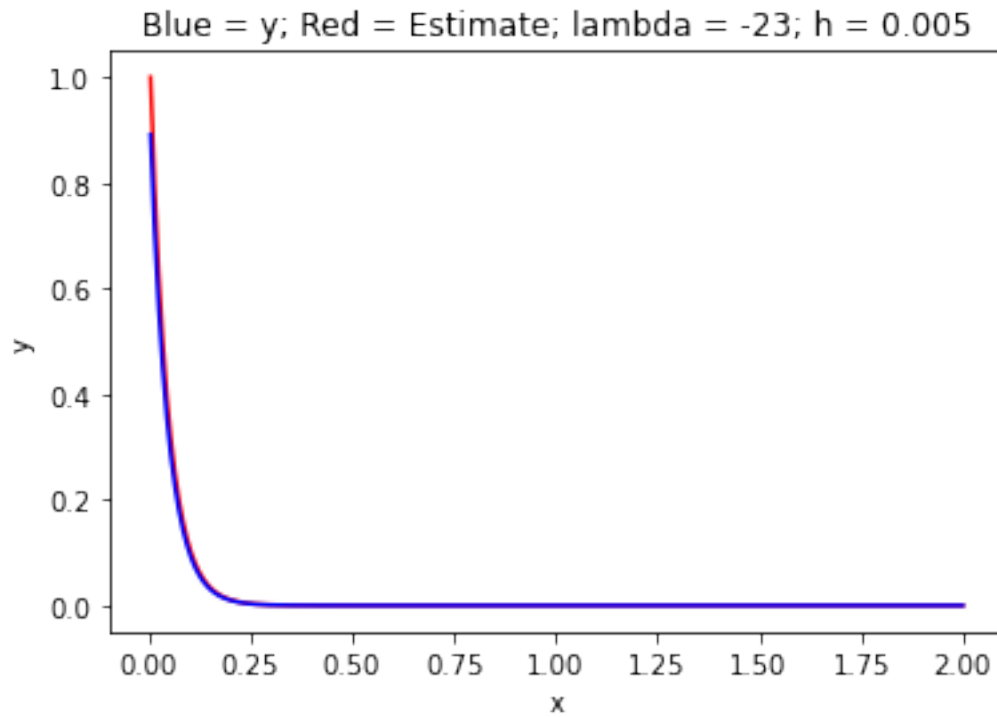


```
[345]: plt.plot(x, y[:x.shape[0]], 'r-', x, np.exp(lamb*x), 'b-')
plt.xlabel("x")
plt.ylabel("y")

plt.title("Blue = y; Red = Estimate; lambda = -23; h = 0.005")

## We can see that the approximations are getting very close to the exact
→ values as
## stepsize h becomes small.
```

```
[345]: Text(0.5, 1.0, 'Blue = y; Red = Estimate; lambda = -23; h = 0.005')
```



[]:

[]:

[350]: *# 4-Stage Runge Kutta for Lambda = 1 with varying step size*

```

lamb = 1

# 3a) h = 0.1
h = 0.1
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK4(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e1 = err[x.shape[0]-1]

# 3a) h = 0.05
h = 0.05

```

```

x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK4(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e1 = err[x.shape[0]-1]

# 3a) h = 0.02
h = 0.02
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK4(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e3 = err[x.shape[0]-1]

# 3a) h = 0.01
h = 0.001
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK4(h, y[i], lamb)

err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e4 = err[x.shape[0]-1]

# 3a) h = 0.005
h = 0.005
x = np.arange(0,2,h)+h
y = np.ones(x.shape[0]+1)

for i in range(0,x.shape[0]):
    y[i+1] = RK4(h, y[i], lamb)

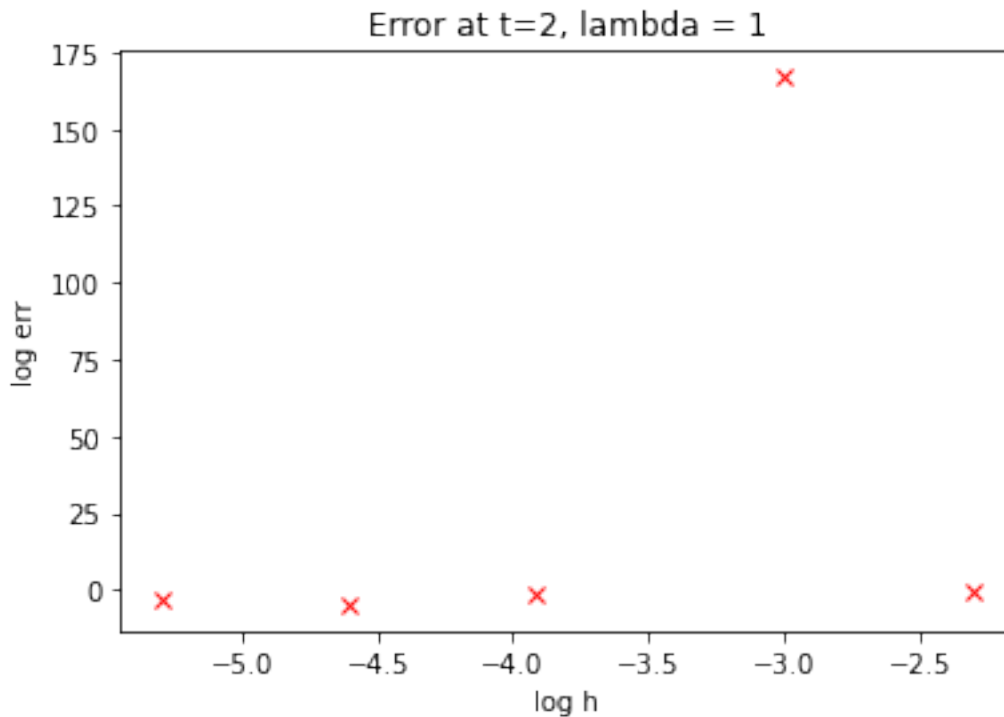
err = np.log(np.abs(y[0:x.shape[0]]-np.exp(lamb*x)))
e5 = err[x.shape[0]-1]

```

```
plt.plot(np.log([0.1,0.05,0.02,0.01,0.005]),[e1,e2,e3,e4,e5], 'rx')
plt.xlabel("log h")
plt.ylabel("log err")
plt.title("Error at t=2, lambda = 1")

## We can see that the approximations errors are getting small as
## stepsize h becomes small.
```

[350]: Text(0.5, 1.0, 'Error at t=2, lambda = 1')

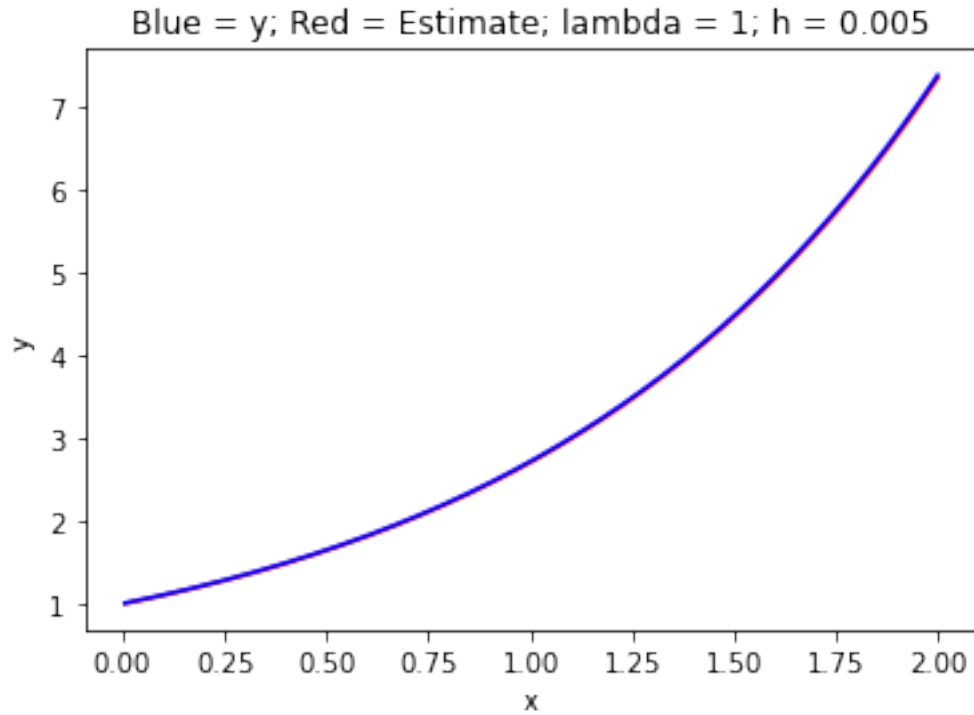


```
[351]: plt.plot(x, y[:x.shape[0]], 'r-', x, np.exp(lamb*x), 'b-')
plt.xlabel("x")
plt.ylabel("y")

plt.title("Blue = y; Red = Estimate; lambda = 1; h = 0.005")

## We can see that the approximations are getting very close to the exact
↪ values as
## stepsize h becomes small.
```

[351]: Text(0.5, 1.0, 'Blue = y; Red = Estimate; lambda = 1; h = 0.005')



[]:

[]:

[]:

```
[352]: # 4-Step Runge-Kutta Method

# 3a) lamb = diag(-1,-100); h = 0.1
lamb = np.diag([-1,-100])
h = 0.1
x = np.arange(0,2,h)+h
y = np.ones([x.shape[0]+1,2])

for i in range(0,x.shape[0]):
    y[i+1,:] = RK(h, y[i,:], lamb)

err = np.log(np.abs(np.sum(y[0:x.shape[0],:]**2,axis=1)-(np.exp(-2*x)+np.
    ↪exp(-200*x))))
e1 = err[x.shape[0]-1]
```

```

# 3a)  $h = 0.05$ 
lamb = np.diag([-1,-100])
h = 0.05
x = np.arange(0,2,h)+h
y = np.ones([x.shape[0]+1,2])

for i in range(0,x.shape[0]):
    y[i+1,:] = RK(h, y[i,:], lamb)

err = np.log(np.abs(np.sum(y[0:x.shape[0],:]**2,axis=1)-(np.exp(-2*x)+np.
    ↪exp(-200*x))))
e2 = err[x.shape[0]-1]

# 3a)  $h = 0.02$ 
lamb = np.diag([-1,-100])
h = 0.02
x = np.arange(0,2,h)+h
y = np.ones([x.shape[0]+1,2])

for i in range(0,x.shape[0]):
    y[i+1,:] = RK(h, y[i,:], lamb)

err = np.log(np.abs(np.sum(y[0:x.shape[0],:]**2,axis=1)-(np.exp(-2*x)+np.
    ↪exp(-200*x))))
e3 = err[x.shape[0]-1]

# 3a)  $h = 0.01$ 
lamb = np.diag([-1,-100])
h = 0.01
x = np.arange(0,2,h)+h
y = np.ones([x.shape[0]+1,2])

for i in range(0,x.shape[0]):
    y[i+1,:] = RK(h, y[i,:], lamb)

err = np.log(np.abs(np.sum(y[0:x.shape[0],:]**2,axis=1)-(np.exp(-2*x)+np.
    ↪exp(-200*x))))
e4 = err[x.shape[0]-1]

```

```

# 3a)  $h = 0.005$ 
lamb = np.diag([-1,-100])
h = 0.005
x = np.arange(0,2,h)+h
y = np.ones([x.shape[0]+1,2])

for i in range(0,x.shape[0]):
    y[i+1,:] = RK(h, y[i,:], lamb)

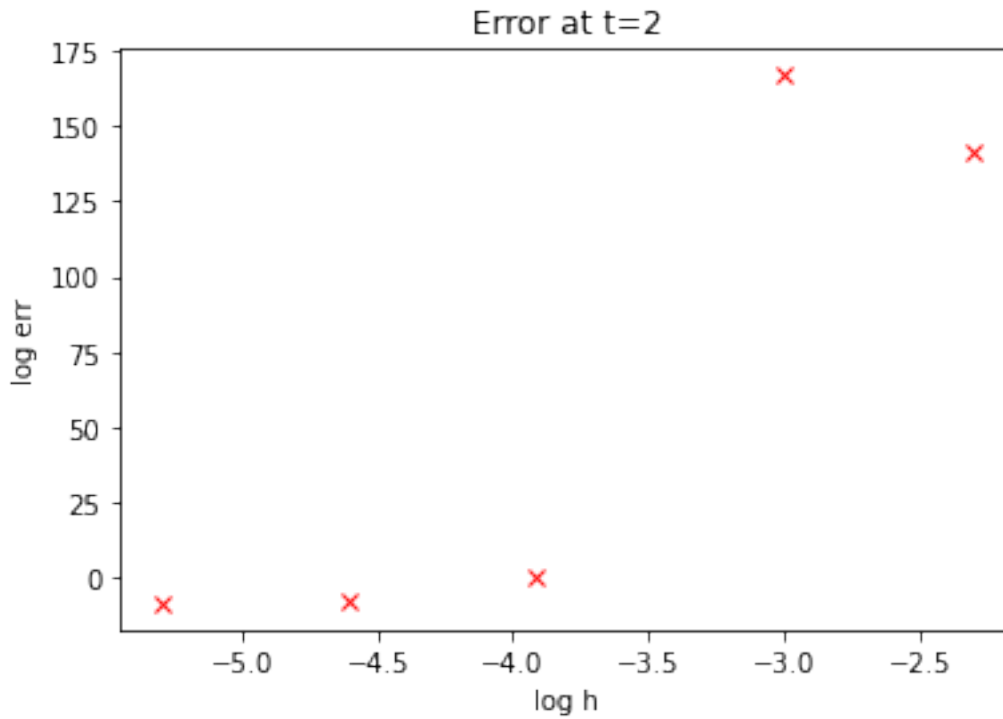
err = np.log(np.abs(np.sum(y[0:x.shape[0],:]**2,axis=1)-(np.exp(-2*x)+np.
    ↪exp(-200*x))))
e5 = err[x.shape[0]-1]

plt.plot(np.log([0.1,0.05,0.02,0.01,0.005]),[e1,e2,e3,e4,e5], 'rx')
plt.xlabel("log h")
plt.ylabel("log err")
plt.title("Error at t=2")

## We can see that the approximations errors are getting small as
## stepsize h becomes small.

```

[352]: Text(0.5, 1.0, 'Error at t=2')



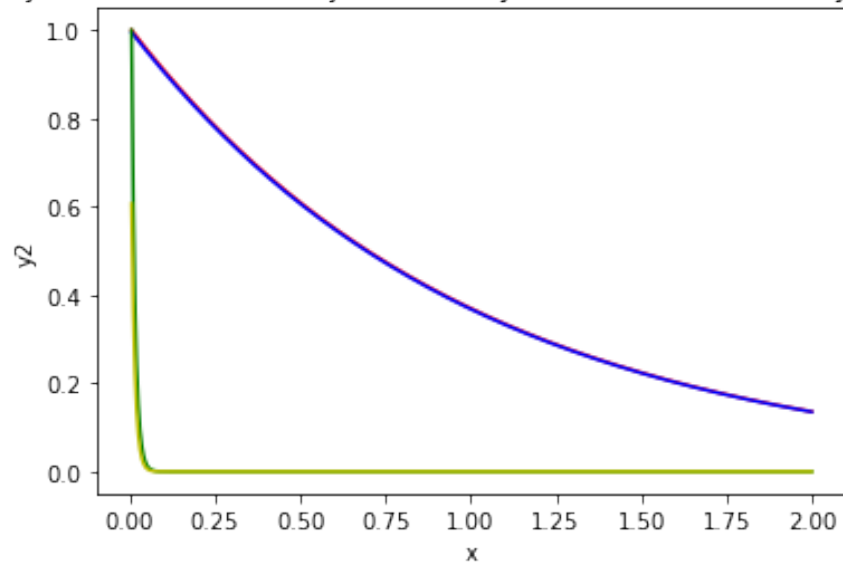
```
[353]: plt.plot(x, y[:x.shape[0],0], 'r-', x, np.exp(lamb[0,0]*x), 'b-')
plt.xlabel("x")
plt.ylabel("y1")

plt.plot(x, y[:x.shape[0],1], 'g-', x, np.exp(lamb[1,1]*x), 'y-')
plt.xlabel("x")
plt.ylabel("y2")
plt.title("Blue = y1; Red = Estimate of y1; Green = y2; Yellow = Estimate of y2;
↪ h = 0.005")

## We can see that the approximations are getting very close to the exact
↪ values as
## stepsize h becomes small.
```

```
[353]: Text(0.5, 1.0, 'Blue = y1; Red = Estimate of y1; Green = y2; Yellow = Estimate
of y2; h = 0.005')
```


Blue = y_1 ; Red = Estimate of y_1 ; Green = y_2 ; Yellow = Estimate of y_2 ; $h = 0.005$



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