

Applied Mathematics TW324 Assignment 04

<https://github.com/BhekipiloNdhlela/TW324NumericalMethods>

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Question 1

Python Source Code For Both a.) and b.):

```
def question_a(steps, x=0.0, debug=False):
    fp = lambda x, h : (( f(x+2*h)+8*f(x+h) - 8*f(x-h)+f(x-2*h))/(12*h))
    f = lambda x : sqrt(1 - x**2 * sin(x))
    exact = [abs(fp(x, h) - f(x)) for h in steps]
    if debug is True:
        print "DEBUG_MODE: [ON] QUESTION_1_a.)"
        print "i", "\t", "Step_Size", "\t", "Exact_Error"
        for i, (h, err) in enumerate(zip(steps, exact)):
            print (i+1), "\t", "{:.7f}".format(h), "\t", "{:.10f}".format(err)
    return exact

def question_b(steps, M=11.0, debug=False):
    machine_eps = float(sys.float_info.epsilon)
    bound = [(18.0 * machine_eps)/(12.0*h) + M*(h**4) for h in steps]
    if debug is True:
        print "DEBUG_MODE: [ON] QUESTION_3_bii.)"
        print "i", "\t", "Step_Size", "\t", "Bound"
        for i, (h, err) in enumerate(zip(steps, bound)):
            print (i+1), "\t", "{:.7f}".format(h), "\t", "{:.10f}".format(err)
    return bound

def plot_err_funcs(steps, exact, bound):
    #loglog plot to display the error as function of the step size
    plt.title("Plot_of_the_Exact_Error_and_Bound_as_h(Step_size)_Changes")
    plt.xlabel("h_(Step_Size)")
    plt.ylabel("Exact_vs_Bound")
    plt.yscale('log')
    plt.xscale('log')
    plt.plot(steps, exact, "k", label="Exact")
    plt.plot(steps, bound, "k", label="Bound")
    plt.legend(bbox_to_anchor=(.65, .9))
    plt.show()

if __name__ == "__main__":
    from numpy import (abs, cos, sin, sqrt, logspace)
    from numpy import (float)
    import matplotlib.pyplot as plt
    from math import pow

    steps = logspace(-7, 1, num=100)
    exact, bound = question_a(steps), question_b(steps)
    plot_err_funcs(steps, exact, bound)
```

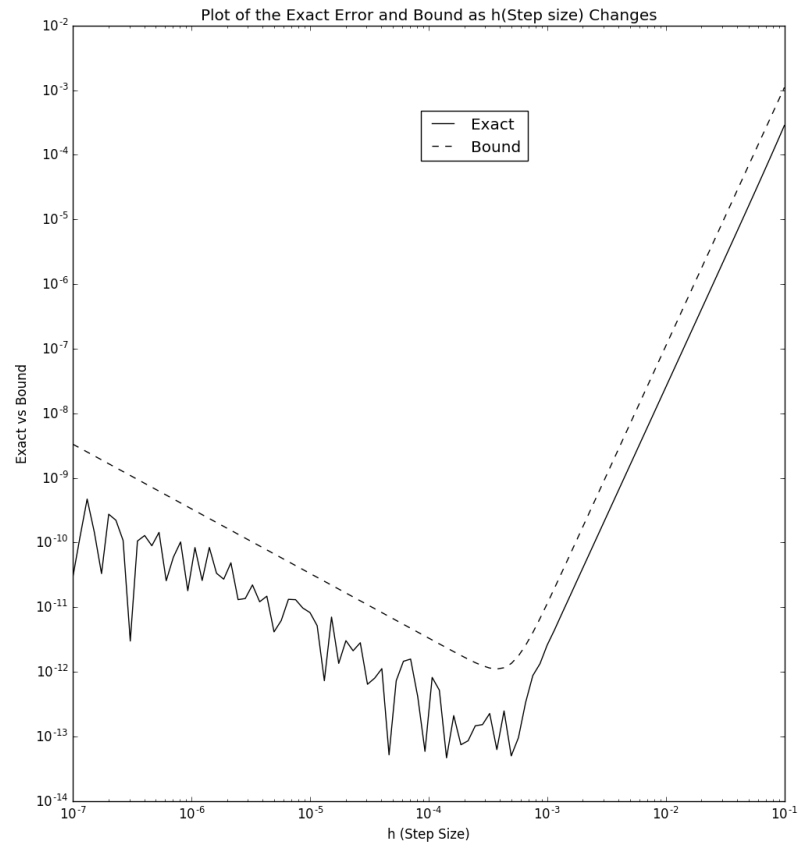


Figure 1: approximation of the first derivative of $f(x)$ with the error bound

Conclusion: The conclusion matches the $O(h^4)$ convergence predicted by the theory?

Question 2

Required To Prove That: $\int_a^b x^3 dx = \frac{h}{3}(y_0 + 4y_1 + y_2) - \frac{h^5}{90}f^{(iv)}(c)$

We Know That The Exact Integral is: $\int_a^b x^3 dx = \frac{1}{4}x^4|_a^b = \frac{1}{4}(b^4 - a^4)$

The Simpson's Rule States That:

$$\int_{x_0}^{x_2} x^3 dx = \frac{h}{3}(y_0 + 4y_1 + y_2) - \frac{h^5}{90}f^{(iv)}(c)$$

but: $y_0 = a^3$, $y_2 = b^3$ and $y_1 = (\frac{a+b}{2})^3$ **also:** $-\frac{h^5}{90}f^{(iv)}(c) = 0$ **because:**

$$f(x) = x^3, f'(x) = 3x^2, f''(x) = 6x, f^{(iv)}(x) = 6 \text{ and } f^{(iv)}(x) = 0$$

we also know that: $h = \frac{b-a}{2} \implies \frac{h}{3} = \frac{b-a}{6}$ **Then:**

$$\begin{aligned} \int_a^b f(x)dx &= \frac{b-a}{6}(b^3 + 4(\frac{a+b}{2})^3 + a^3) \\ \int_a^b f(x)dx &= \frac{b-a}{6}(b^3 + 4(\frac{a^3 + 3a^2b + 3ab^2 + b^3}{8}) + a^3) \\ \int_a^b f(x)dx &= \frac{b-a}{6}(b^3 + (\frac{a^3 + 3a^2b + 3ab^2 + b^3}{2}) + a^3) \\ \int_a^b f(x)dx &= \frac{b-a}{6}(\frac{2b^3 + b^3 + a^3 + 3a^2b + 3ab^2 + 2a^3}{2}) \\ \int_a^b f(x)dx &= \frac{b-a}{6}(\frac{3b^3 + 3a^2b + 3ab^2 + 3a^3}{2}) \\ \int_a^b f(x)dx &= \frac{(b-a)(3b^3 + 2a^2b + 2ab^2 + 3a^3)}{12} \\ \int_a^b f(x)dx &= \frac{(b-a)(3b^3 + 2a^2b + 2ab^2 + 3a^3)}{12} \\ \int_a^b f(x)dx &= \frac{3b^4 - 3a^4}{12} \\ \int_a^b f(x)dx &= \frac{3(b^4 - a^4)}{12} \\ \int_a^b f(x)dx &= \frac{1}{4}(b^4 - a^4) \end{aligned}$$

Conclusion: Since $\int_a^b f(x)dx$ (Exact Solution) = $\int_a^b f(x)dx$ (Simpsons Method) then I have proved that the Simpson's rule has polynomial degree of precision since i have shown exact for the integral

Question 3

a.)

Required To Prove:

$$f''(x) = \frac{-f(x-2h)+16f(x+h)-30f(x)+16f(x-h)-f(x-2h)}{12h^2} + O(h^4)$$

by the aid of Extrapolation

Consider Case 1: use h

$$f''(x) = \frac{f(x+h)-2f(x)+f(x-h)}{h^2} - \frac{h^2}{12} f^{(iv)}(c) + O(h^4)$$

Consider Case 2: use $2h$

$$f''(x) = \frac{f(x+2h)-2f(x)+f(x-2h)}{4h^2} - \frac{4h^2}{12} f^{(iv)}(c) + O(h^4)$$

now we use: 4*case 1 - case 2

$$4f''(x) - f''(x) = \frac{4f(x+h)-8f(x)+4f(x-h)}{h^2} - \frac{4h^2}{12} f^{(iv)}(c) + O(h^4) - \left(\frac{f(x+2h)-2f(x)+f(x-2h)}{4h^2} + \frac{4h^2}{12} f^{(iv)}(c) + O(h^4) \right)$$

$$3f''(x) = \frac{16f(x+h)-32f(x)+16f(x-h)-f(x+2h)-2f(x)-f(x-2h)}{4h^2} + O(h^4)$$

$$f''(x) = \frac{-f(x-2h)+16f(x+h)-30f(x)+16f(x-h)-f(x-2h)}{12h^2} + O(h^4)$$

I have used the method of extrapolation to derive the second derivative approximation

b.)

Python Source Code For:

```
def exact(steps, x=0.0, debug=False):
    fpp = lambda x, h : (( f(x+2*h)+16*f(x+h) 30*f(x)+16*f(x-h) f(x-2*h))\
                        /(12*h*h))

    f = lambda x : sqrt(1 - x**2 * sin(x))
    exact = [abs(fpp(x, h) + 1.0) for h in steps]
    if debug is True:
        print "DEBUG MODE: [ON] QUESTION 3 bi.)"
        print "i", "\t", "Step Size", "\t", "Exact Error"
        for i, (h, err) in enumerate(zip(steps, exact)):
            print (i+1), "\t", "{:.7f}".format(h), "\t", "{:.10f}".format(err)
    return exact

def bound(steps, M=11.0, debug=False):
    machine_eps = finfo(float).eps
    bound = [(18.0 * machine_eps)/(12.0*(h**2)) + M*(h**4) for h in steps]
    if debug is True:
        print "DEBUG MODE: [ON] QUESTION 3 bii.)"
        print "i", "\t", "Step Size", "\t", "Bound"
        for i, (h, err) in enumerate(zip(steps, bound)):
            print (i+1), "\t", "{:.7f}".format(h), "\t", "{:.10f}".format(err)
    return bound

def plot_error_functions(steps, exact, bound):
    #loglog plot to display the error as function of the step size
    plt.title("Plot of the Exact Error and Bound as h(Step size) Changes")
    plt.xlabel("h(Step Size)"); plt.ylabel("Exact vs Bound")
    plt.yscale('log'); plt.xscale('log')
    plt.plot(steps, exact, "k ", label="Exact")
    plt.plot(steps, bound, "k ", label="Bound")
    plt.legend(bbox_to_anchor=(.65, .9))
    plt.show()

if __name__ == "__main__":
    from numpy import (abs, cos, sin, sqrt, logspace)
    from numpy import (finfo, float)
    import matplotlib.pyplot as plt
    from math import pow

    steps = logspace(-7, 1, num=100)
    exact, bound = exact(steps), bound(steps)
    plot_error_functions(steps, exact, bound)
```

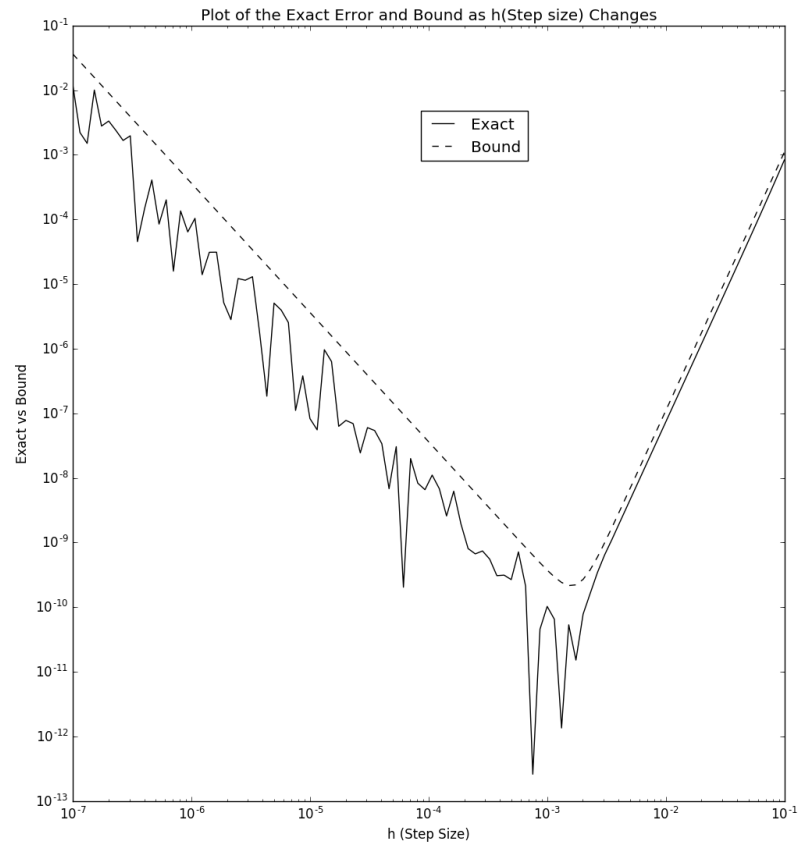


Figure 2: approximation of the second derivative of $f(x)$ from Question 1(a) with the error bound of $f(x)$

Conclusion: The conclusion matches the $O(h^4)$ convergence predicted by the theory?

Question 4

Python Source Code:

```
def trapezium(exact_I, H, x0=0., debug=True):
    appr_x_I = array([h/2. * (exp(x0) + exp(h)) for h in H])
    return array([abs(apr_x_I - ex_I) for apr_x_I, ex_I in zip(appr_x_I, exact_I)])

def midpoint(exact_I, H, x0=0., debug=True):
    W = array([x0 + (h / 2.0) for h in H])
    appr_x_I = array([h * exp(w) for h, w in zip(H, W)])
    return array([abs(apr_x_I - ex_I) for apr_x_I, ex_I in zip(appr_x_I, exact_I)])

def simpson(exact_I, H, x0=0., debug=True):
    appr_x_I = array([h/6.*(exp(x0)+(4.*exp(h/2.))+exp(h)) for h in H])
    return array([abs(apr_x_I - ex_I) for apr_x_I, ex_I in zip(appr_x_I, exact_I)])

def debug(abs_err_s, abs_err_m, abs_err_t, debug=True):
    if debug is True:
        print "DEBUG_MODE: [ON] [Question_4_Simpson's_method]"
        print "SIMPSONS_METHOD\t\tMIDPOINT_METHOD\t\tTRAPEZIUM_METHOD"
        for s, m, t in zip(abs_err_s, abs_err_m, abs_err_t):
            print "{:.20f}".format(s), "{:.20f}".format(m), "{:.20f}".format(t)
    else:
        print "DEBUG_MODE: [OFF] [Question_4_Simpson's_method]"

def plot_abs_errs(abs_err_t, abs_err_m, abs_err_s):
    #loglog plot to display the error as function of the step size
    plt.title("|x_c - x|_of:_The_Midpoint,_Simpson_&_Trapezium_Methods_against_h")
    plt.ylabel("Midpoint_vs_Simpson_vs_Trapezium")
    plt.xlabel("h"); plt.yscale('log'); plt.xscale('log')
    plt.plot([1., .1, .01], abs_err_t, "k", label="Trapezium")
    plt.plot([1., .1, .01], abs_err_m, "r", label="Midpoint")
    plt.plot([1., .1, .01], abs_err_s, "g", label="Simpson")
    plt.legend(bbox_to_anchor=(.65, .9))
    plt.show()

if __name__ == "__main__":
    from numpy import exp, abs, array
    import matplotlib.pyplot as plt
    H, exact_I = array([1., .1, .01]), array([exp(h) - 1 for h in H])
    abs_err_t = trapezium(exact_I, H)
    abs_err_m = midpoint(exact_I, H)
    abs_err_s = simpson(exact_I, H)
    debug(abs_err_s, abs_err_m, abs_err_t)
    plot_abs_errs(abs_err_t, abs_err_m, abs_err_s)
```


SIMPSONS METHOD	MIDPOINT METHOD	TRAPEZIUM METHOD
0.00057932341754773908	0.06956055775891689663	0.14085908577047745460
0.00000000365068135444	0.00004380843804530077	0.00008762782813467873
0.00000000000003500325	0.00000004187557393898	0.00000008375125289117

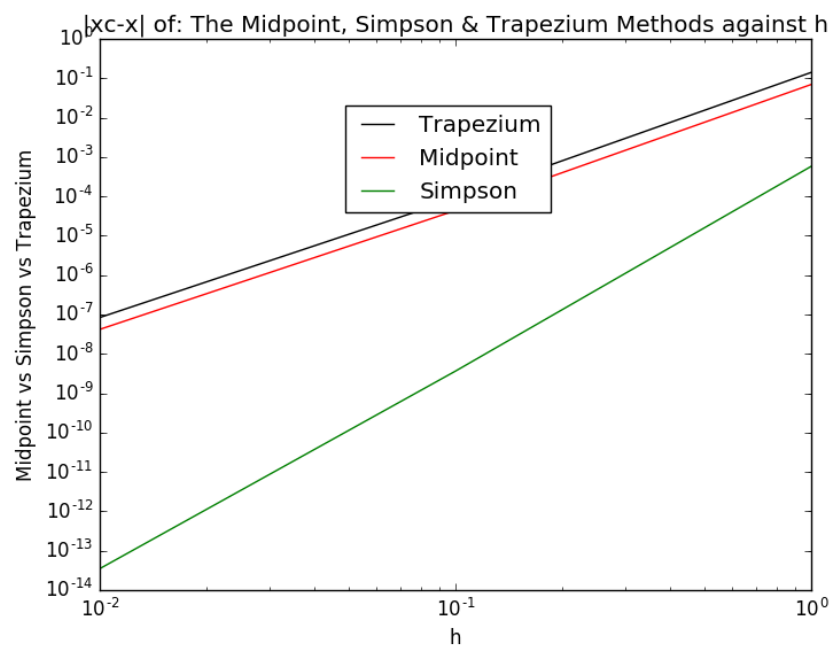


Figure 3: $|x_c - x|$ Absolute Errors for the SIMPSONS, MIDPOINT and the TRAPEZIUM METHOD

Conclusion: The rates of convergence agree with the theoretical approximations derived in lectures

Question 5

Python Source Code:

```
def question_a(n=8.0, debug=True):
    h = (1.0 / (n - 1.0))
    f = array([exp(x) for x in linspace(0.0, 1.0, 8.0)])
    A = matrix([[1, 2, 1, 0, 0, 0, 0, 0],\
                [0, 1, 2, 1, 0, 0, 0, 0],\
                [0, 0, 1, 2, 1, 0, 0, 0],\
                [0, 0, 0, 1, 2, 1, 0, 0],\
                [0, 0, 0, 0, 1, 2, 1, 0],\
                [0, 0, 0, 0, 0, 1, 2, 1]])
    f_ = (1.0 / h**2.0) * matmul(A, f).T

    if debug is True:
        print "DEBUG_MODE: _[ON] _\t_[QUESTION_5_A.)]"
        print "f\"(x) _=_",
        for i in f_:
            print i,

if __name__ == "__main__":
    from numpy import (linspace, exp, array, shape, matrix, matmul)
    import matplotlib.pyplot as plt
    question_a()
```

Answer/ Result:

$$f''(x) = \begin{bmatrix} 1.15552818 \\ 1.33297685 \\ 1.53767544 \\ 1.77380856 \\ 2.04620346 \\ 2.36042868 \end{bmatrix}$$