

Computational Methods

- Truncation error & round off error
- Numerical differentiation
- Numerical Integration
- Numerical solution of system of linear algebraic equations
- Numerical solution of nonlinear algebraic equation
- Numerical solution of ODEs

Truncation Error & Round Off Error

Taylor's Series is: $f(x+h) = f(x) + hf'(x) + \frac{h^2}{2!}f''(x) + \frac{h^3}{3!}f'''(x) + \dots + \frac{h^n}{n!}f^{(n)}(x) + O(h^{n+1})$

In the above series if we consider upto the term containing h^n then this will result to a truncation error of order h^{n+1}

Which implies truncation error depends on two factors in general h (Step size) and n (depends on number of terms considered)

It is expected that if the step size is small error will be less & If the number of terms considered is more error will be less

But if the step size h is too small such that expressions depends on h may become too small even lower than machine precision then round off errors may accumulate and can increase the overall error with decreasing h .

Therefore in numerical analysis selecting h (step size) should be optimum.

Example Problem:

Find the value of e^a numerical method at $a=0.1$. Then check the variation of truncation error with $n=1$ to 10.

Solution: We know $e^a = 1 + a + \frac{a^2}{2!} + \frac{a^3}{3!} + \dots + \frac{a^n}{n!} + O(a^{n+1})$ This can be easily proved from Taylor's Series.

Let us first find out the true value of e^a at $a=0.1$

```
a=0.1;  
trueVal=exp(a)
```

```
trueVal = 1.1052
```

Now Numerically calculate e^a at $a=0.1$ for $n=1$ to 10

```
a=0.1;  
n=10;  
terms=[];
```

```
powerVec=[1:n]
```

```
powerVec =
```

```
1    2    3    4    5    6    7    8    9   10
```

```
terms=a.^powerVec./cumprod(powerVec)
```

```
terms =
```

```
0.1000    0.0050    0.0002    0.0000    0.0000    0.0000    0.0000    0.0000
```

```
numVal=1+cumsum(terms)
```

```
numVal =
```

```
1.1000    1.1050    1.1052    1.1052    1.1052    1.1052    1.1052    1.1052
```

```
trueVal=exp(a);
```

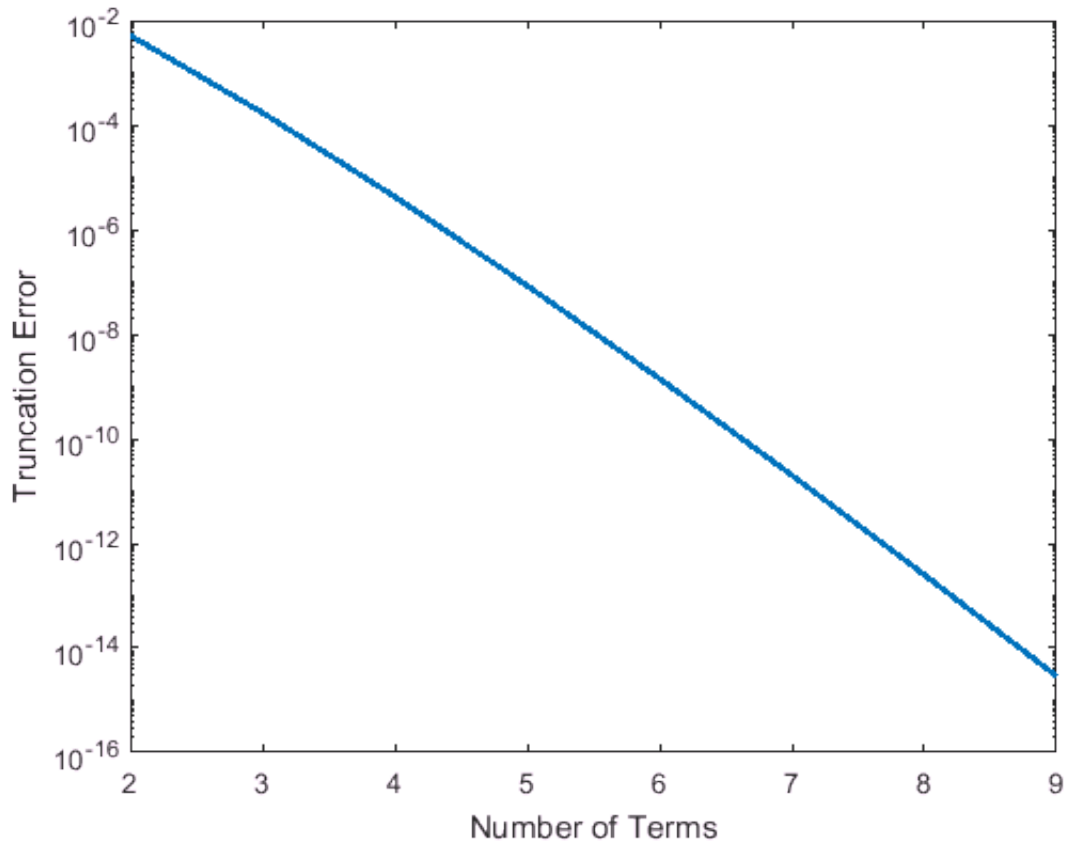
Now calculate truncation errors and plot with n

```
truncError=abs(trueVal-numVal)
```

```
truncError =
```

```
0.0052    0.0002    0.0000    0.0000    0.0000    0.0000    0.0000    0.0000
```

```
semilogy(powerVec+1,truncError,'LineWidth',2);  
xlabel('Number of Terms');  
ylabel('Truncation Error');
```



Assignment Problem:

Make a loglog plot in the same graph of the error with the variation of $a = [0.1, 0.07, 0.04, 0.01]$ for $n=1, 2, 3$ and 4

Numerical Differentiation:

From Taylor's Series : $f(x+h) = f(x) + hf'(x) + \frac{h^2}{2!} f''(x) + \frac{h^3}{3!} f'''(x) + \dots + \frac{h^n}{n!} f^{(n)}(x) + O(h^{n+1})$

$$\frac{f(x+h)}{h} = \frac{f(x) + hf'(x) + \frac{h^2}{2!} f''(x) + \frac{h^3}{3!} f'''(x) + \dots + \frac{h^n}{n!} f^{(n)}(x) + O(h^{n+1})}{h}$$

$$\frac{f(x+h)}{h} = \frac{f(x)}{h} + f'(x) + \frac{h}{2!} f''(x) + O(h^2)$$

$$f'(x) = \frac{f(x+h) - f(x)}{h} + O(h)$$

For first derivative

Forward Difference Formula: $f'(x) = \frac{f(x+h) - f(x)}{h} + O(h)$

Backward Difference Formula: $f'(x) = \frac{f(x) - f(x-h)}{h} + O(h)$

Central Difference Formula: $f'(x) = \frac{f(x+h) - f(x-h)}{2h} + O(h^2)$

For 2nd derivative

Central difference formula: $f''(x) = \frac{f(x+h) - 2f(x) + f(x-h)}{h^2} + O(h^2)$

Example:

Find out Numerical differentiation of $\tan^{-1}x$ with respect to x at $x=1$. Take step size $h=10^{-4}$. Also check the error associated in the numerical method with respect to true value.

Solution: we know $f(x) = \tan^{-1}x$, $f'(x) = \frac{1}{1+x^2}$

Let us find out true value of $f'(x)$ at $x=1$

```
x=1;
trueVal_d=1/(1+x^2)
```

```
trueVal_d = 0.5000
```

Now do it Numerically

Case-1: Using forward difference formula

```
x=1;
h=1.0e-4;
fwd_d=(atan(x+h)-atan(x))/h;
fwd_err=abs(fwd_d-trueVal_d)
```

```
fwd_err = 2.4999e-05
```

Case-2: Using backward difference formula

```
bck_d=(atan(x)-atan(x-h))/h;
bck_err=abs(bck_d-trueVal_d)
```

```
bck_err = 2.5001e-05
```

Case-3: Using central difference formula

```
ctr_d=(atan(x+h)-atan(x-h))/(2*h);
ctr_err=abs(ctr_d-trueVal_d)
```

```
ctr_err = 8.3317e-10
```

Assignment Problem:

1. Repeat the same problem in the example for $h = [10^{-1}, 10^{-2}, 10^{-3}, 10^{-4}, 10^{-5}]$ and make a loglog plot of error with h for forward, backward & central difference method in a single graph. Make comment on the graph.
2. If Temperature field in a rod (assume 1-D) is $T = -5x^3 + 3x^2 + 1$, and thermal conductivity is varying as $k = 30 + \sqrt{x}$, Plot the heat flux variation with x . Take x from 0 to 1m.
3. Find second derivative of $f(x) = 2 - x + \ln x$ at $x=1$. Also find the error in numerical calculation using central difference method.

Solution 2.

$$\text{heat flux} = q''_x = -k \frac{\partial T}{\partial x}$$

$$\text{True heat flux } q''_x = (30 + \sqrt{x}) * (-15x^2 + 6x)$$

Let make $n=11$ grid points equally spaced on the rod including two ends.

for any interior grid points we can use central difference formula because of high accuracy & linear profile (less computation)

for left end point we are using forward difference & for right end point we are using backward difference formula.

```
n=101;
x=linspace(0,1,n);
k=30+x.^0.5;
h=x(2)-x(1);
T=-5*x.^3+3*x.^2+1;
% True Heat Flux
q_flux_true=-k.*(-15*x.^2+6*x);
% Numerical Calculation of Heat Flux

%central difference
for i=2:n-1
dTdx(i)=(T(i+1)-T(i-1))/(2*h);
end
%Forward difference
dTdx(1)=(T(2)-T(1))/h;
%Backward Difference
dTdx(n)=(T(n)-T(n-1))/h;
%Heat Flux
q_flux_num=-k.*dTdx;

% Plot
plot(x,q_flux_num,x,q_flux_true,'LineWidth',2);
xlabel('x');
ylabel('q''');
legend('Numerical','True');
title('Heat flux calculation by Numerical & Analytical Method');
```

