# Math 4329: Numerical Analysis Lecture 01 

Natasha S. Sharma, PhD

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Math 4329:
Numerical
Analysis
Lecture 01
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Evaluation of "complicated" functions at a point using "simpler" functions

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Problem: What is the value of $e^{0}, e^{-1}, e^{-0.5}$ ?

Solution:
■ Use the simpler function Taylor Polynomial to find these values. This has to be based on a evaluation at a known point for example at 0 since we know $e^{0}=1$.

- Error in Taylor Polynomial
- Practice Problems for you

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## Taylor Polynomial

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Taylor series is a representation of a function $f(x)$ as an infinite sum of terms that are calculated from the values of the function's derivatives at a single point $a$.

■ $f(x)=f(a) / 0!+f^{\prime}(a)(x-a) / 1!+f^{\prime \prime}(a) \frac{(x-a)^{2}}{2!}+$

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## UEP <br> Taylor Polynomial

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Idea: Take $x=-1,-0.5$ and obtain approximations to $e^{x}$ using the "finite" Taylor series at $a=0$.

## UE <br> Finite Taylor Series: Taylor Polynomial

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- $f(x)=f(a) / 0!+f^{\prime}(a)(x-a) / 1!+f^{\prime \prime}(a) \frac{(x-a)^{2}}{2!}+\cdots$
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■ Example Taylor Polynomial of Degree 1 at $a=0$ is


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Taylor Polynomials of degree $n$

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Evaluate $e^{-1}$ and $e^{-0.5}$

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Exercise: Evaluate $e^{-0.5}$

## Error in Taylor Polynomial

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## Error $=$ True Value - Approximated Value

■ $e(x)=f(x)-p_{n}(x)$ where, $e(x)$ denotes the error at $x$ $f(x)$ is the function at $x$, $p_{n}(x)$ denotes the degree $n$ polynomial

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$$
f(x)-p_{n}(x)=\frac{(x-a)^{n+1}}{(n+1)!} f^{(n+1)}\left(c_{x}\right)
$$

$c_{x}$ an unknown point between $a$ and $x$.

