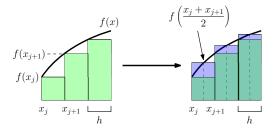
## Numerical Integration II

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Numerical Methods I

### Midpoint method

Rectangle method can be improved: compute function at the midpoints of the intervals



Better coverage of area under the curve

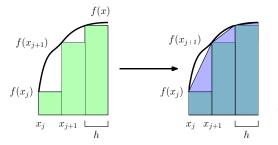
$$\int_{a}^{b} f(x) dx \simeq I_{M} \equiv \sum_{k=0}^{N-1} f\left(\frac{x_{k} + x_{k+1}}{2}\right) \cdot h$$

$$\begin{cases} h \equiv \frac{b - a}{N} \\ x_{k} \equiv a + k \cdot h \\ k = 0, \dots, N \end{cases}$$

Higher accuracy for given 
$$h$$
: 
$$\int_{a}^{b} f(x) dx = I_{M} + O(h^{2})$$

## Trapezoidal method I

# Another way of improving the rectangle method: approximate the area below the curve with trapezes



Area of trapeze starting in  $x = x_j$ :

$$A_j = \frac{h}{2} \left( f(x_j) + f(x_{j+1}) \right)$$

#### Summing all trapezes together:

$$\int_{a}^{b} f(x) dx \simeq I_{T1} \equiv \sum_{k=0}^{N-1} [f(x_{k}) + f(x_{k+1})] \cdot \frac{h}{2}$$

$$\begin{cases} h \equiv \frac{b-a}{N} \\ x_{k} \equiv a + k \cdot h \\ k = 0, \dots, N \end{cases}$$

### Trapezoidal method II

Equivalent formulation: sum the trapezes beforehand

$$\frac{h}{2} \left[ \underbrace{f(x_0) + f(x_1)}_{A_0} + \underbrace{f(x_1) + f(x_2)}_{A_1} + \underbrace{f(x_2) + f(x_3)}_{A_2} + \dots \right]$$

In the end,

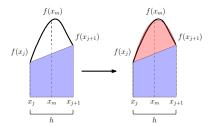
$$\int_{a}^{b} f(x) dx \simeq I_{T2} \equiv \frac{h}{2} \left[ f(x_0) + \sum_{k=1}^{N-1} 2f(x_k) + f(x_N) \right]$$

Equivalent but preferred: each  $f(x_i)$  evaluated once instead of twice (evaluation may be numerically expensive for complicated f)

Same precision as midpoint rule: 
$$\int_{a}^{b} f(x) dx = I_{T(1,2)} + O(h^{2})$$

# Simpson Method

2nd-order improvement (higher order also possible): use parabolic arcs



Each arc passes for

- $\bullet$   $(x_i, f(x_i))$
- $\bullet \left(\frac{x_j + x_{j+1}}{2}, f\left(\frac{x_j + x_{j+1}}{2}\right)\right)$
- $(x_{i+1}, f(x_{i+1}))$

Integrate exactly each arc, then sum: algebra yields

$$\int_{a}^{b} f(x) \ dx \simeq I_{S} \equiv \frac{h}{3} \left[ f(x_{0}) + 2 \sum_{\text{even } k}^{k>0} f(x_{k}) + 4 \sum_{\text{odd } k'} f(x_{k'}) + f(x_{N}) \right] \quad \begin{cases} h \equiv \frac{b-a}{N} \\ x_{k} \equiv a + k \cdot h \\ k = 0, \dots, N \end{cases}$$

High accuracy: 
$$\int_a^b f(x) \ dx = I_S + O(h^4)$$

## Advanced integration methods

Beyond the basic approaches, many advanced techniques available, such as:

#### **Adaptive integration:**

thicker grid where function changes faster



#### Gauss quadrature:

mathematically optimal grid



Monte Carlo integration (Alex): randomized grid, best in high dimension



#### Assignment

Write a program to computes the integral of  $f(x) = e^x$ 

#### Steps:

- ullet Ask for integration interval bound [a,b] and the desired precision  $\epsilon$
- Integrate with the rectangle method with increasing N until the precision is achieved
- Output the result at each step with its number of points, and the final result once more (more readability)
- Compute the integral  $\int_0^1 e^x dx$  with precision  $10^{-5}$
- Do the same for midpoint, trapeze, and Simpson methods
- Comment (in the email) about the required number of points for each method

#### Hints:

You can recycle the previous assignment, adding new functions

Submit to umorzan@ictp.it by wednesday Filename: <your surname>-assignment-int-2.f90