

# Errors in numerical approximations

Let  $y(t)$  be the exact sol. of the <sup>diff'l equation</sup> problem [e.g. of  $y' = f(t, y)$ ,  $y(t_0) = y_0$ ]

Let  $Y_n$  = numerical approximation to  $y(t_n)$ , a finite-dim'l vector  $\vec{Y} = (Y_0, Y_1, \dots, Y_N)$   
 = exact sol. of the Finite Difference scheme, after we discretize

Continuous problem  
 ODE:  $y'(t) = f(t, y) = 0$   
 $y(t_0) = y_0$

Discrete problem (e.g. Euler method)  
 (FDE:  $Y_{n+1} = Y_n + \Delta t \cdot f(t_n, Y_n) = 0$ )  
 $Y_0 = y_0$   
 better form:  $\text{FDE}[Y_n] = \frac{Y_{n+1} - Y_n}{\Delta t} - f(t_n, Y_n) = 0$

Want to approximate  $y(t_n)$ ,  $n=0, 1, \dots, N$ , up to some time  $t_N$  ( $\Delta t = \frac{t_N - t_0}{N}$ ).  
 We discretize the continuous problem, i.e. replace it by a discrete problem, the FDE, and try to compute ~~the~~ the discrete solution  $\{Y_0, Y_1, \dots, Y_N\}$  of the FDE.

Definition: The discretization error at the  $n$ -th step is  $de_n = y(t_n) - Y_n$ .

Here  $Y_n$  is the exact sol of the FDE  $\text{FDE}[Y_n] = 0$ , at  $\infty$  precision!

This would be the error if we calculate  $Y_n$  from the FDE at infinite precision!

Since we have to use a computer with finite precision (floating point numbers!) what we actually compute is only an approximation to  $Y_n$  due to rounding to machine numbers:

$\tilde{Y}_n = \text{actual computed values} \approx Y_n$   
 (floating point numbers)

Definition: The roundoff error is  $re_n = Y_n - \tilde{Y}_n$

So the actual total error is  $y(t_n) - \tilde{Y}_n = \underbrace{y(t_n) - Y_n}_{\text{discretization } de_n} + \underbrace{Y_n - \tilde{Y}_n}_{\text{roundoff } re_n}$   
 at  $n$ -th step

There is yet another kind of error, that measures how far off is the FDE from the ODE! it is called the

Definition: The local truncation error is the amount by which the exact solution  $y(t)$

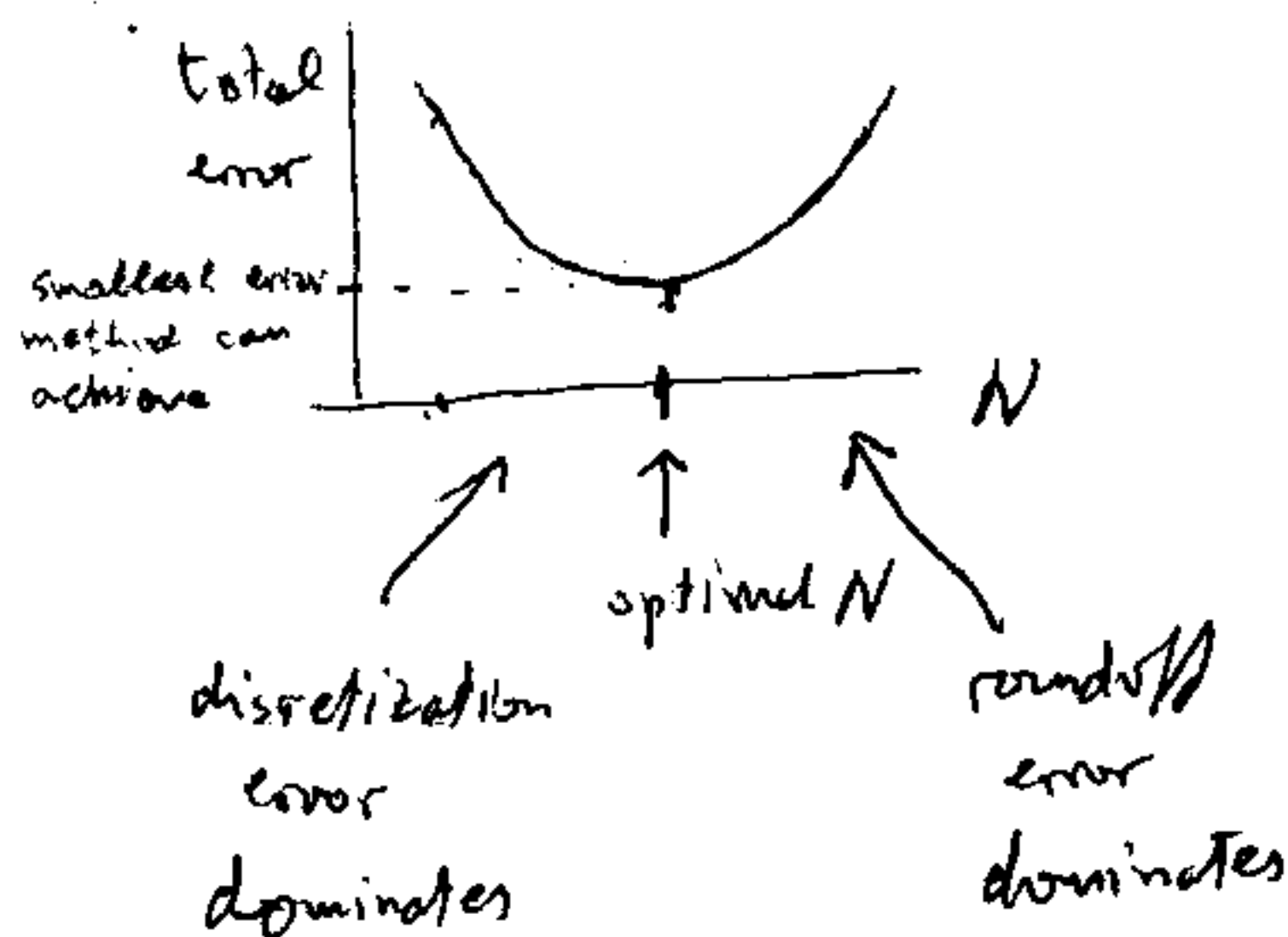
of ODE fails to satisfy the FDE!  $\frac{Y_{n+1} - Y_n}{\Delta t} = f(t_n, Y_n)$  to look like the ODE

$te_n := \frac{y(t_{n+1}) - y(t_n)}{\Delta t} - f(t_n, y(t_n))$   
 $= \text{FDE}[y(t_n)] - \text{ODE}[y(t_n)]$  can be estimated by Taylor expansion

But, the more steps the more computations must be done,  
so the longer the run will take and worse more roundoff  
errors <sup>may</sup> pile up!

The total error won't reduce as much, or it can even get worse  
due to roundoff!

The result is



as  $N$  grows, roundoff grows,  
it eventually takes over  
and we end up with worse total error!  
the roundoff takes over and  
accuracy cannot improve further,  
~~is better~~ with this method!

To reduce roundoff: careful coding  
double precision computation (arithmetic with more digits)

If the total error is still too large for our purposes, the only alternative is  
to use a higher order method! there are many, eg. Runge-Kutta,  
multistep.

Accuracy of Euler Method (convergence estimate): The discretization error of Euler scheme satisfies

$$|y(t_n) - Y_n| \leq e^{K(t_n - t_0)} \cdot |y_0 - Y_0| + M_2 \frac{e^{K(t_n - t_0)} - 1}{2K} \cdot \Delta t$$

where  $K = \text{Lipschitz const. of } F \leq \sup \left| \frac{\partial F}{\partial y} \right| < \infty$ ,  $M_2 = \sup |y''|$  <sup>assumed</sup>  $< \infty$

Remarks: 1. Even a small initial error can become big for large  $t_n$  (long term computation) or large  $K$  but always remains bounded.

2. Apart from the initial error,  $|\text{error}| \leq (\text{const.}) \Delta t = \mathcal{O}(\Delta t)$   
( $\Rightarrow$  first order method)

So convergent  $\therefore$  also stable.

3. 1<sup>st</sup> order accuracy means error is proportional to  $\Delta t$ .  
Halving  $\Delta t$  we expect half the error.

Big O notation:  $f(x) = \mathcal{O}(g(x))$  as  $x \rightarrow x_0$  means  $\left| \frac{f(x)}{g(x)} \right| \leq M$  for  $x$  near  $x_0$   
i.e.  $|f(x)| \leq (\text{const.}) |g(x)|$  near  $x_0$

Excellent ODE solvers are available: VODE, rksuite, ... in netlib.org  
GSL

There is no best method for all ODEs or even for classes of ODEs.

Types of ODE integrators:

- explicit - implicit - BDF for "stiff"
- single step - multistep
- Taylor type - RK
- symplectic - nonsymplectic
- non-adaptive - adaptive

Matlab has 8 integrators: rk4, rk45, ode113, ode15i, ode23, ode23s, ode23t, ode23tb, ode113s, 15s