10.34, Numerical Methods Applied to Chemical Engineering Professor William H. Green Lecture #13: Stiffness. MATLAB® Ordinary Differential Equation (ODE) Solvers.

### From Last Lecture: Numerical Integration

 $\frac{dY}{dt} = \underline{F}(\underline{Y}) \qquad \underline{Y}(t_{0}) = \underline{Y}_{0} \qquad \underline{G}: \text{ estimated time average slope from } t \rightarrow t + \Delta t$ General Algorithm:  $\underline{Y}(t + \Delta t) = \underline{Y}(t) + \Delta t^{*}\underline{G}(\underline{Y}) \qquad \underline{G} = (\text{time avg. slope}) + \delta$ error
Rectangle Rule: Explicit Euler  $\underline{G} = \underline{F}(\underline{Y}(t))$  EXPLICIT
Trapezoid Rule:  $\underline{G} = \frac{1}{2}(\underline{F}(\underline{Y}(t)) + \underline{F}(\underline{Y}(t + \Delta t)))$  IMPLICIT  $\int_{unknown}^{\delta} \nabla O((\Delta t)^{m})$ want  $\Delta t \downarrow$ Requirement for accuracy sets ceiling on  $\Delta t$ 

Figure 1. Linear approximation to a function.

## MATLAB

ode45

Runge-Kutta: G formula where error scales  $(\Delta t)^5$ 

If  $\Delta t$  is small, error is small, but takes many steps

(tradeoff)

\* new t  $\leftarrow$  t+ $\Delta$ t

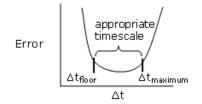
Adding big numbers and small numbers  $\rightarrow$  lose log<sub>10</sub>(N<sub>timesteps</sub>) sig figs

as  $\Delta t$  decreases. This can be a significant problem.

If computer has 14 sig figs

If you want 6 sig figs in  $\underline{Y}(t_f)$ :  $N_{timesteps} < 10^8$ 

 $(t_f - t_0)/<\Delta t > < 10^8$  {FLOOR}



**Figure 2.** If  $\Delta t_{floor}$  is larger than  $\Delta t_{maximum}$ , then a solution cannot be found.

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## Adaptive Timestepping

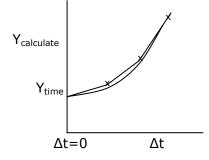
Use small  $\Delta t$  when necessary (to keep  $\delta$  small) Use big  $\Delta t$  everywhere else to save CPU time and minimize roundoff error.  $\delta \sim O((\Delta t)^m)$ 

## **Richardson Extrapolation**

 $Solve ODE using \Delta t = 0.1s \qquad \underline{Y}(t_f; \Delta t = 0.1) \\ Solve same ODE using \Delta t = 0.05s \qquad \underline{Y}(t_f; \Delta t = 0.05) \\ \underline{Y}(t_f; \Delta t) = \underline{Y}_{time}(t_f) + c(\Delta t)^m + ... \\ (unknown higher order of error) \\ \underline{Y}(t_f; \Delta^{t}/_2) = \underline{Y}_{time}(t_f) + c(\Delta^{t}/_2)^m + ... \\ if m = 2 \ \underline{Y}_{true} = \frac{4}{3} \underline{Y}(t_f; 0.05) - \frac{1}{3} \underline{Y}(t_f; 0.1) \\ c \text{ is approximately the same is both equations:}$ 

For example: 
$$\frac{1}{6} \frac{\partial^3 f}{\partial t^3} \Big|_{Y_0} (\Delta t)^3$$

# Romberg Extrapolation is Richardson Extrapolation Applied to Integrals



**Figure 3**. Diagram of Romberg Extrapolation on an increasing function.

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### Numerical Instability

Example uses Explicit Euler

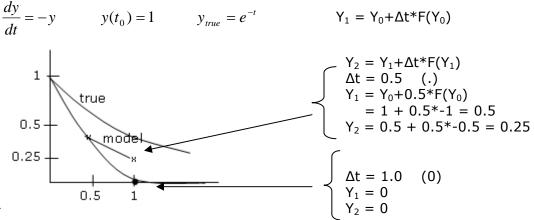


Figure 4. Graphs of function's true and model values

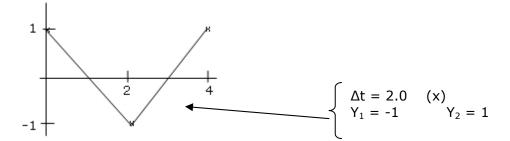


Figure 5. Difference between true and model values.

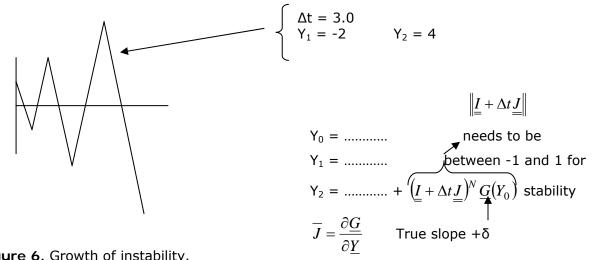


Figure 6. Growth of instability.

#### **Stability**

 $-1 \leq \lambda_i \text{ of } \left(\underline{I} + \Delta t \underline{J}\right) \leq +1$ 

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### Numerical Stability (For Explicit Methods):

 $||\underline{I} + \Delta t \underline{J}|| \le 1$ 

\* In Beers' textbook... implicit/explicit averaging

If too stiff, you cannot use explicit methods and must turn to implicit methods such as *Trapezoid*. To keep stable, keep  $\Delta t$  small. But cannot go too small in  $\Delta t$ : major stays the same if  $\Delta t < eps$ .