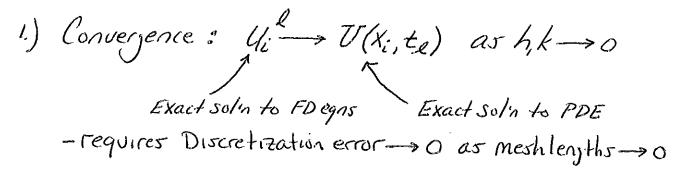
Three Classic Definitions



- Weaker than convergence, but easier to show
- requires Truncation error -> 0 as mesh lengths->0

Generally...(2)+(3)
$$\rightarrow$$
 (1)

Lax Equivalence Theorem: Given a properly posed initial boundary-value problem and a FD approx to it that is consistent, then stability is the necessary and sufficient condition for convergence

Convergence:

- Examine in teems of "discretization error" $U_i^{\perp} U_i^{\perp} \equiv E_i^{\perp}$
- Depends on h, k mesh lengths, FD molecule
- Difficult to investigate ... usually in teams of derivatives (i.e. Truncation error) we don't know
- Lax Equivalence saves the day!

Try it once ... Simplest scenario => Euler explicit

Strategy: Write out difference Egns w/ exact

Solin to PDE keeping equality by retaining

Truncation error teams ("3 trick")

$$\frac{2V}{2t} = D\frac{2^{2}V}{2x^{2}} \Rightarrow l' \in [2, l+1]$$

$$\frac{V_{i}^{l+1} V_{i}^{l}}{k} - \frac{k}{2} \frac{2^{2}V_{i}^{l}}{2t^{2}} = D\left[\frac{V_{i-1}^{l} - 2U_{i}^{l} + U_{i+1}^{l}}{h^{2}} - \frac{h^{2}}{12} \frac{2^{4}V_{i}^{l}}{2x^{4}}\right]$$

Now subtract FD approximation to get difference eqn in Ei...

$$\begin{split} \mathcal{U}_{i}^{l+1} - \mathcal{V}_{i}^{l} &= -\mathcal{V}_{i-1}^{l} - 2\mathcal{I}\mathcal{U}_{i}^{l} + \mathcal{I}\mathcal{U}_{i+1}^{l} + \frac{\mathcal{K}^{2}}{2}\frac{2\mathcal{U}_{i}^{l}}{2\mathcal{L}^{2}} - \frac{D\mathcal{K}h_{2}^{2}\mathcal{U}_{i}^{l}}{12a^{2}\mathcal{X}^{4}} \\ \mathcal{U}_{i}^{l+1} - \mathcal{U}_{i}^{l} &= \mathcal{I}\mathcal{U}_{i-1}^{l} - 2\mathcal{I}\mathcal{U}_{i}^{l} + \mathcal{I}\mathcal{U}_{i}^{l} \end{split}$$

$$E_{i}^{\ell H} = E_{i}^{\ell} = \Gamma E_{i,i}^{\ell} - 2\Gamma E_{i}^{\ell} + \Gamma E_{i+1}^{\ell} + \frac{k}{2} \left(\frac{k \mathcal{Q}_{i}^{\ell l'}}{2\ell^{2}} \frac{Dh^{2} \mathcal{Q}_{i}^{\ell l'}}{6 \mathcal{Q}_{i}^{\chi \ell}} \right)$$

Want to show $E_i^l \rightarrow 0$ as $h, k \rightarrow 0$

$$E_{i}^{l+1} = \Gamma E_{i+1}^{l} + (1-2\Gamma)E_{i}^{l} + \Gamma E_{i+1}^{l} + \frac{k}{2} \left(k \frac{2^{2}U_{i}^{l}}{2t^{2}} - \frac{Dh^{2}}{6} \frac{2^{4}U_{i}^{l}}{2x^{4}} \right)$$

IF (1-2r) > 0 ... i.e. r</2 (Recall we said this was required for stability)

and we let: $E = \max_{\text{all } i} |\mathcal{E}_{i}^{l}|$ $A > \max_{\text{all } i, \text{all } l} \left\{ \left| \frac{\partial^{2} U_{i}^{l}}{\partial z^{l}} \right|, \frac{D}{\partial x^{l}} \left| \frac{\partial^{4} U_{i}^{-l}}{\partial x^{4}} \right| \right\}$

then

$$|\epsilon^{\ell+1}| \leq |\epsilon^{\ell}| + A(k+h^2)k$$

but E°=0 ... Ic's match everywhere exactly!

$$E' \leq A(k+h^2)k$$

 $E^2 \leq E' + A(k+h^2)k = 2A(k+h^2)k$
 $E^{k} \leq A(k+h^2)k = A(k+h^2)T$

Can make € arbitrarily small as h,k →0 provided r</a and T finite

Aside: Common to try to Cancel the leading error in the time discretization cul leading error in space discretization ... leads to "improved" accuracy but practical Utility questionable due to very small step sizes usually required

e.g. For Euler explicit, let's expand the truncation errors by an additional teem:

$$\frac{K}{2} \frac{2^2 V^{\ell}}{2 t^2} + \frac{K^2}{3!} \frac{2 V^{\ell}}{2 t^3} \begin{cases} \text{Error from Forward Diff} \\ \text{expression for } \frac{2 U}{2 t} \end{cases}$$

IF
$$k = \frac{h^2}{6D}$$
, then

$$\frac{h^2}{12D} \left[\frac{\partial^2 U^{-1}}{\partial t^2} - D \frac{\partial^2 U^{-1}}{\partial x^4} \right] + O(k^2 + h^4) = \frac{1}{accoracy}!!$$

= 0 Since
$$\frac{2}{2t} \left[\frac{\partial V}{\partial t} - D \frac{\hat{z}V}{\partial x^2} \right] = \frac{\hat{z}V}{2t^2} - D \frac{\hat{z}}{\partial x^2} \left(\frac{\partial V}{\partial t} \right)$$

= $D^2 \frac{\partial V}{\partial x^2}$

Consistency

- FD molecule consistent w/ PDE if Truncation error -> 0 as h,k->0
- easy when we replace PDE w/ standard
 FD expressions since already know error teams

e.g.
$$\frac{\partial \mathcal{U}}{\partial t} = \frac{\partial \mathcal{U}}{\partial x^2} \Rightarrow \frac{\Delta v_i^l}{k} + O(k) = D \frac{\int_x^2 U_i^l}{h^2} + O(h^2)$$

Truncation error 15 O(k+h²) -> 0 as kh -> 0

So FD molecule: (1)

$$(-r) = 0$$
 consistent

 $(-r) = 0$ $(-r) = 0$

- Sometimes molecules not readily recognized as standard FD expressions
- Must work "Backwards"... Truncation error measures amount by which Vil does not satisfy FD equations
- For consistency, want FD molecule of $V_i^L \rightarrow 0$ as $h,k \rightarrow 0$

e.g. Given FD molecule $-\frac{1}{h^2}$ $-\frac{1}{k} + \frac{1}{h^2}$ = 0Is it consistent ω $\frac{2V}{2t} = \frac{2^2V}{2X^2}$? $\frac{2}{k} + \frac{1}{h^2}$ $-\frac{1}{h^2}$

FD Egn: \frac{1}{h^2}\left(U_i^l - U_{i-1}^l) + \frac{1}{k}\left(U_i^l - U_i^l) + \frac{1}{k^2}\left(U_i^l - U_{in}^l)\right) \tag{\left(U_i^l - U_{in}^l)} \tag{\text{We recognize this!}}

 $\frac{\partial U_i^{\ell}}{\partial t} + \frac{k}{2} \frac{\partial U_i^{\ell'}}{\partial t^2}$

Other teems we don't see so clearly... plug back in Talyor Series for each:

 $U_{i}^{lH} = U_{i}^{l} + k \frac{2U_{i}^{l}}{2t} + \frac{k^{2}}{2} \frac{2U_{i}^{l}}{2t^{2}} + \frac{k^{3}}{3!} \frac{2^{3}U_{i}^{l}}{2t^{3}} + \cdots$ $- U_{i-1}^{lH} = -U_{i}^{l} - k \frac{2U_{i}^{l}}{2t} + h \frac{2U_{i}^{l}}{2x} + kh \frac{2^{2}U_{i}^{l}}{2t2x} - \frac{k^{2}}{2} \frac{2^{2}U_{i}^{l}}{2t^{2}} - \frac{h^{2}}{2} \frac$

 $-U_{it} = -U_{i}^{l} - h \frac{2U_{i}^{l}}{2x^{i}} - \frac{h^{2}}{2x^{i}} - \frac{h^{3}}{3!} \frac{3}{2x^{i}} - \frac{h^{4}}{4!} \frac{4}{2x^{i}} + \dots$

 $\frac{k^3 \partial^3 U_i^d}{\partial t^3} + kh \frac{\partial^2 U_i^d}{\partial t^2 x} - h \frac{\partial^2 U_i^d}{\partial x^2} - \frac{h^3 \partial^3 U_i^d}{\partial x^3} + \dots$

gets multiplied by 1/2

as h

Put all together:

 $\frac{\partial U_{i}^{l}}{\partial t} - \frac{\partial^{2}U_{i}^{l}}{\partial x^{2}} + \frac{k}{\partial} \frac{\partial^{2}U_{i}^{l}}{\partial t^{2}} - \frac{h}{\partial t} \frac{\partial^{3}U_{i}^{l}}{\partial x^{3}} + \frac{k}{h} \frac{\partial^{3}U_{i}^{l}}{\partial x^{4}} + \frac{k^{3}\partial^{3}U_{i}^{l}}{\partial x^{4}} = \frac{h}{h} \frac{\partial^{2}U_{i}^{l}}{\partial x^{4}} + \frac{k^{3}\partial^{3}U_{i}^{l}}{\partial x^{4}} = \frac{h}{h} \frac{\partial^{3}U_{i}^{l}}{\partial x^{4}} + \frac{k^{3}\partial^{3}U_{i}^{l}}{\partial x^{4}} + \frac{h}{h} \frac{\partial^{3}U_{i}^{l}}{\partial x^{4}} + \frac{k^{3}\partial^{3}U_{i}^{l}}{\partial x^{4}} = \frac{h}{h} \frac{\partial^{3}U_{i}^{l}}{\partial x^{4}} + \frac{k^{3}\partial^{3}U_{i}^{l}}{\partial x^{4}} + \frac{h}{h} \frac{\partial^{3}U_{i}^{l}}{\partial x^{4}} + \frac{h}{h}$

- Consider K = dh where d = constant

 $\frac{\partial U_{i}^{\ell}}{\partial t} - \frac{\partial^{2} U_{i}^{\ell}}{\partial x^{2}} + \lambda \frac{\partial^{2} U_{i}^{\ell}}{\partial x^{4}} = 0 \quad Inconsistent \omega / \frac{\partial U}{\partial t} - \frac{\partial^{2} U}{\partial x^{2}} = 0$

molecule converges to this PDE = O(k+h)

- Consider K=2/2 where L=constant

 $\frac{\partial U_i^l}{\partial t} - \frac{\partial U_i^l}{\partial x^2} = 0 \implies Consistent \omega / PDE$ O(k+h)

Stability

- Given bounded ICs, BCs + forcing get bounded sol'n to FD equations
- Two Views

- (a) Lax-Richtmeyer: at a fixed time, T, solin
 of FD equations remain bounded as k->0
 (assuming h related to k such that h->0 as k->0)
- (b) Practical approach: h,k are fixed and Soln propagated forward from t=0 to t=jk... then stability defined in terms of boundedness as j -> & for k fixed
- Two approaches to Stability analysis
 - 1.) Matrix Methods ... cast FD propagation in form $U^{l+1} = AU^l + b^l$ and study properties of A
 - 2.) Fourier Method (Von Neumann)... examine the propagation of Fourier components by the FD molecule

Fourier Analysis Supplement

- Recall Fourier Series ... valid for any fax)
continuous on [0,2]

$$f(x) = \frac{C_0}{2} + \sum_{n=1}^{\infty} C_n \cos \frac{n\pi x}{2} + \sum_{n=1}^{\infty} B_n \sin \frac{n\pi x}{2}$$

$$= \underbrace{\underbrace{\underbrace{\underbrace{f.n\pi x}_{A-f.n\pi x}}_{A=0}}_{n=0} + B_n \left(-f \left(\underbrace{e^{\frac{f.n\pi x}{2}} - f.n\pi x}_{2} \right) \right)$$

=
$$\int_{n=-\infty}^{\infty} A_n e^{j \tau_n X}$$
 where $\tau_n = \frac{n\pi}{L} = \frac{2\pi}{L_n}$

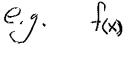
Wavelength =
$$\frac{2l}{h}$$

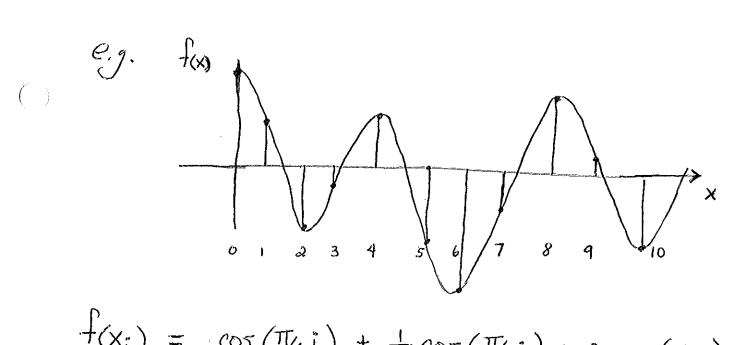
$$A_n = \frac{1}{2} \left(C_n - j B_n \right) n > 0$$

- on a discrete set of Sample Points

X:= ih

$$\Rightarrow f(x_i) = \sum_{n=-\infty}^{\infty} A_n e^{j\tau_n h i}$$





$$f(x_i) = \cos(\pi_i) + \frac{1}{4}\cos(\pi_i) + 2\cos(\pi_i)$$

- Express $U_i^* = f(x_i)$ as sum of Fourier modes Stability ... ask do these modes stay bounded as Ui - Ui - Ui ... Ui - Ui ????

- Must examine all possible the values!! Why? Since may not need them all to

Answer: IF not then Stability dependent on ICs ... i.e. problem dependent for same governing equation ... not very useful

- More importantly: Rounding errors introduced are differenced by Same molecule as Ui

e.g. $U_i^l + E_i^l = Computer solin to FD equations$ Exact solin to FD equations

Ester Explicit:

- Need to make sure Rounding errors once introduced remain bounded

Recall... Fourier Series 15 an approach to analytic solin of PDEs

() eg.
$$\frac{2U}{2t} - D\frac{2U}{2x^2} = 0$$
; ω / $U(x,0) = G(x)$
 $U(0,t) = f(t)$
 $U(l,t) = g(t)$

4)

Substitute in Fourier Series w/ time-dependent () Coefficients: $U(x,t) = \sum_{n=-\infty}^{\infty} A_n(t) e^{i\pi x}$

 $\Rightarrow \sum_{n=-\infty}^{\infty} \left[\frac{dA_n}{dt} + D\nabla_n^2 A_n(t) \right] e^{i\nabla_n X} = 0$

Only way to satisfy requires this to vanish $\frac{dA_n}{dt} + DT^2A_n = 0 \qquad 15T \text{ Order ODE in } t$

We know solin is An(t) = Che Don't

": $U(X,t) = \sum_{n=-\infty}^{\infty} C_n e^{-DC_n^2 t} \int_{\text{Determine from BCs}}^{\infty} Determine from BCs$

- Do same thing for Discrete System (i.e. Difference equations)

Von Neumann (Fourier) Stability Analysis

- Idea... expand the spatial distribution of Ic's (i.e. solin at some point in time) as Fourier Series

Have U(x,0); need to find An's such that U(x,0)=Ui°

- Examine how each term in sum is propagated as l=1,2,... (in general to to to,) by FD molecule
 - Stability ... FD molecule must not allow any teem in sum (i.e. Fourier mode) to grow as solin is advanced in time
 - Sufficient to look at general form of single term and consider all possible of values
 - · single team due to linearity

 - . all or values due to Round-off

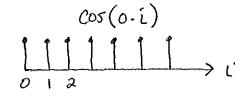
 Don't care about An's = Want Ui

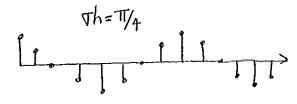
- The 1s key quantity = "Dimensionless wavenumber" $U_i = e^{j\sigma X_i} = e^{j\sigma hi}$

- 05 Th &TT ... most rapid variation on a mesh is node-to-node oscillation

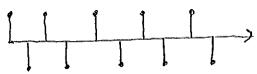
· As th increases from zero, e johi pas increasing rate of oscillation which peaks at the TT

eg. cos(Thi)

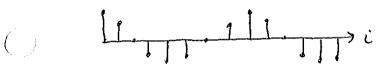


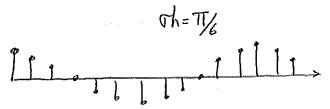


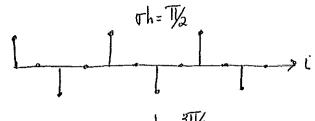
th=TT



Th= 7TT/4

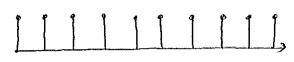








oh=211



- Define "Amplification factor" of the FD egns $U_i^{l_4} = U_i^{l_8} \delta$
 - (Analytically we know $X = e^{dst}$) $U(x,t) = e^{dt} e^{dt} \Rightarrow \frac{U(x,t+st)}{U(x,t)} e^{dst}$
 - Relate all (space, time) points in the FD molecule to pt (i,l) using the defining relations e.g. $U_{i}^{l+1} = \delta_{o}U_{i}^{l}$ $U_{i-1}^{l} = e^{-j\sigma h}U_{i}^{l} \Rightarrow e^{j\sigma(x_{i}-h)} = e^{j\sigma h}j\sigma x_{i} j\sigma h$ $U_{i-1}^{l} = e^{-j\sigma h}U_{i}^{l} \Rightarrow e^{j\sigma(x_{i}-h)} = e^{j\sigma h}j\sigma x_{i} j\sigma h$

Ulti = e Johy Uil

etc

- Provides a relationship between to and oth
- Stability requires -1 = 8 = 1 for all possible The (i.e. 0 = ot = TT)
- Bounded Oscillations develop for -158,0

- Formally method only valid for
 - · linear equations w/ constant coefficients
 - · Unitoen mesh
 - · BCs at infinity
- Generally get same results as Matrix method (I.e. BCs effect stability in minor way relative to FD equations themselves)
- () e.g. Examine Euler Explicit $U_i^{l_{11}}U_i^{l} = r\int_X^2 U_i^{l}$
 - = r (Ui-1-2Ui + Uit)
 - $\Rightarrow (8-1)U_i^{\ell} = r(e^{-j\sigma h} 2 + e^{j\sigma h})U_i^{\ell}$
 - $\delta_{o} = 1 2r \left(1 \cos \sigma h \right) \implies Note: \cos \sigma h = 1 2\sin^{2} \frac{\sigma h}{2}$ $\delta_{o} = 1 4r \sin^{2} \frac{\sigma h}{2}$
- => For stability ... /8/1 => -1 < 1-25(1-cosoh) < 1

But 0< Th<T => 0<1-costh<2 For all possible T's

- Conclude 8 < 1

Yo can be negative => Oscillation in t!

Negative when: 1-21 (1-cosoh) <0

25(1-costh)-1>0

1.e. r> 2(1-costh)

- Conclude: 1>14 produces 8<0

>> Shortest waves (i.e. highest frequency modes)
oscillate.... entirely a numerical artefact

- Unstable when Vo<-1

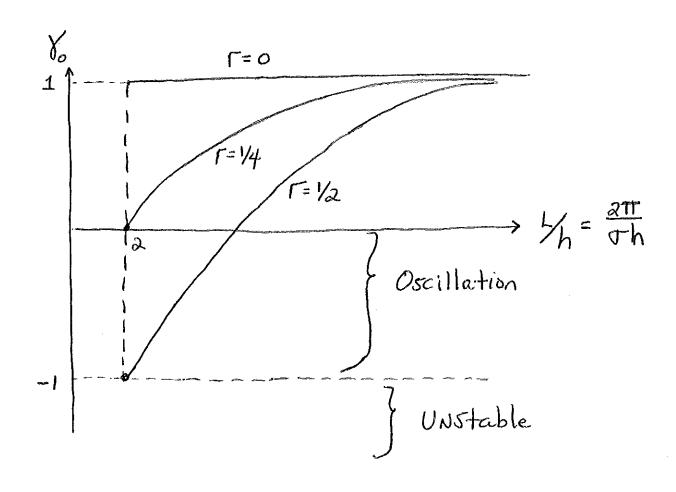
()

1-2-(1-costh) <-1

2 < 2 (1-cosoth)

1-cosoth < r

L.e. $\Gamma > 1/2$ (Shortest waves)
have unotable oscillation)



Rule of Thumb... Short wavelengths are first to go

- Develop spurious oscillations

- Oscillations become fatal as k increases

What about accuracy? Can study

Numerical applification factor > 80.

Analytical amplification factor 8

Analytically we have $\frac{2\mathcal{U}}{\partial t} = D \frac{2^2\mathcal{U}}{2X^2}$ W/ U=edt jox => d=-DJ2

- all modes decay (i.e. all d<0)
- longest waves decay slowest
- solin gets smoother over time

Now 8 = e = e = e

- but as k-o, 8, -> 8 -> 1 don't learn much

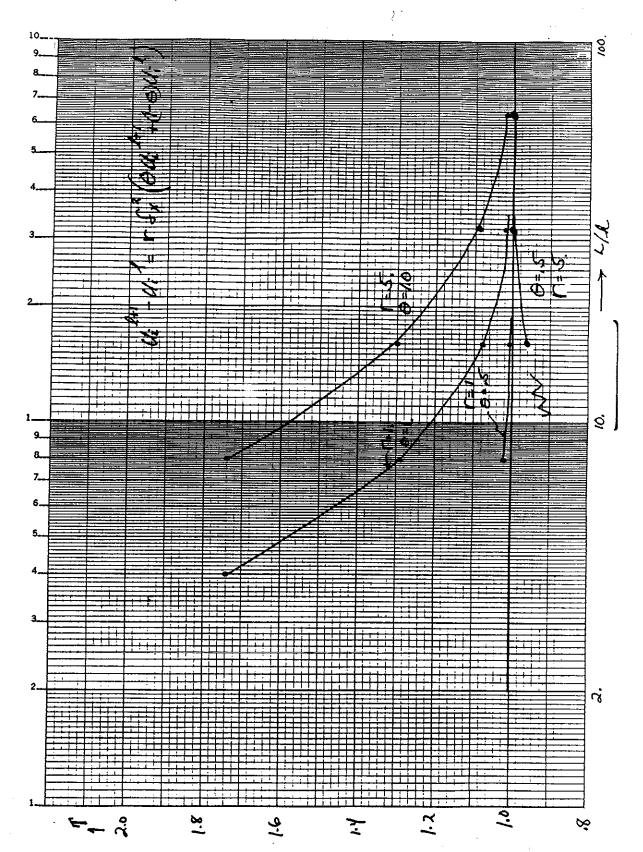
Common to introduce characteristic time, T and examine $\left(\frac{Y_o}{Y}\right)^N$ where $N = \frac{T}{K}$

- Use time constant of T in analytic sol'n

i.e.
$$T = \frac{1}{|\mathcal{A}|} = \frac{1}{D\sigma^2}$$
) $: N = \frac{1}{D\sigma^2 k} = \frac{1}{\Gamma(\sigma h)^2}$

Define
$$T' = \left(\frac{Y_o}{Y}\right)^N = \frac{Y_o r(\sigma h)^2}{\left(e^{-r(\sigma h)^2}\right)^N f(\sigma h)^2} = \frac{Y_o r(\sigma h)^2}{\left(e^{-r(\sigma h)^2}\right)^N f(\sigma h)^2} = \frac{Y_o r(\sigma h)^2}{\left(e^{-r(\sigma h)^2}\right)^N f(\sigma h)^2}$$
"Propagation Factor"

Plot T' vs $\nabla h = \frac{2\pi h}{L}$ for various Γ T'=1 15 perfect



Also note ...

$$Y = e^{-r(\sigma h)^2} - r(\sigma h)^2 + \frac{(r(\sigma h)^2)^2}{2} - \frac{(r(\sigma h)^2)^3}{3!} + \dots$$

$$V_{o} = 1 - 2r(1 - \cos \tau h)$$

$$= 1 - 2r(\frac{(\tau h)^{2}}{2!} - \frac{(\tau h)^{4}}{4!} + \frac{(\tau h)^{6}}{6!} - \dots 7$$

$$= 1 - \Gamma(\sigma h)^{a} + \frac{\Gamma(\sigma h)^{4}}{12} - \frac{2\Gamma(\sigma h)^{6}}{6!} + \dots$$

leading error team

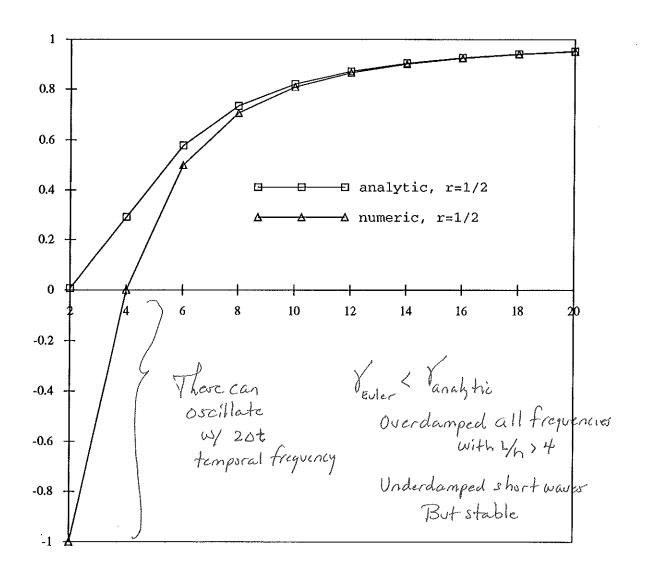
But
$$r(\sigma h)^4$$
 $r^2(\sigma h)^4$ when $r=1/6$

Error 15 "pushed back" one more team (we saw this earlier ... st error just cancels leading sx error)

For Euler: 8 < 8 => Numerical sol'n inderdamped

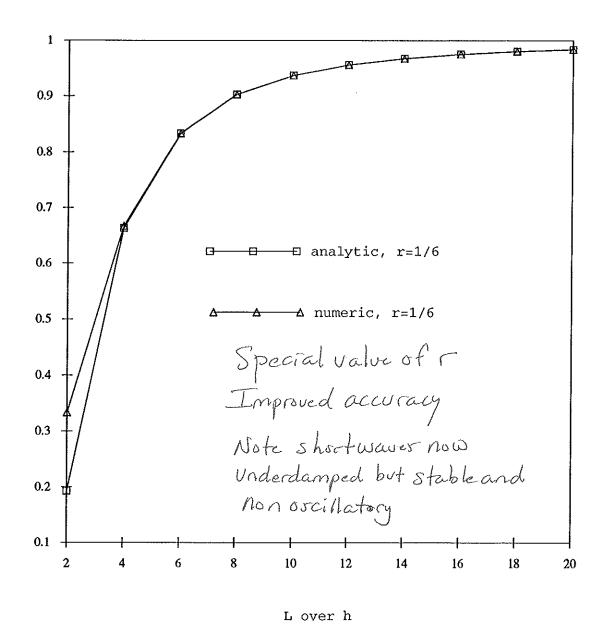
(generally true ... depends on r and Th)

Amp Factor, Euler Explicit

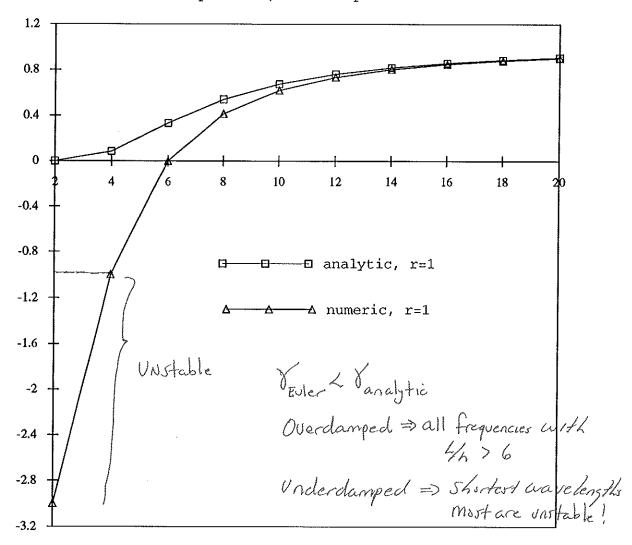


L over h

Amp Factor, Euler Explicit



Amp Factor, Euler Explicit



L over h

9

Can examine any scheme in this manner

e.g. "Richardson" $U_i^{l+1}U_i^{l-1} = r \int_x^2 U_i^{l}$ $X - \frac{1}{x} = 2r(cos\tau h - 1)$ $X - \frac{1}{x} = 2r(1 - cos\tau h) - 1 = 0$ 2 Roots!

- Stability for general quadratic $a8^{2} + b8 + e = 0 \Rightarrow |8| \le 1$ When $\frac{c}{a} \le 1$ and $|b| \le a + c$

In our case... $\frac{C}{a} = -1 \le 1$ always

161 = 2r (1-cosoh) ≤ 0 always positive!

No value of r satisfies this constraint for all values of the short waves are the biggest offenders as usual!

Unconditionally Unstable!!

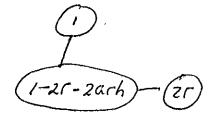
- Stability Analysis Using Matrix Methods
- In Lax-Richtquer View... If we have the scheme Ulti Ault cl; A grows in Site; need to Show IIAIIX1 quarantees stability (and: Convergence for a consistent molecule)
- In practical view of fixed mesh lengths... If have a scheme of them Ulti Aultal ... A has fixed site; sufficient to show $p(A) \le 1$ to ensure boundedness
- Formally must have
 p(A) ≤ IIAII ≤ 1 as size of A → ∞
 to guarantee Convergence for a consistent scheme
 (possible to have p(A) ≤ 1 W IIAII>1)
- e.g. Euler Explicit: $U_i^{l+1} \cap U_{i-1}^{l} + (1-2r)U_i^{l} + rU_{i+1}^{l}$ $W_i^{l} = W_i^{l} + (1-2r)U_i^{l} + rU_{i+1}^{l}$

 $||A||_{\infty} = |\Gamma| + |1-2\Gamma| + |\Gamma|$; Need $||A||_{\infty} \le 1$ If $|-2\Gamma>0|$ the $||A||_{\infty} = 1$ $|-2\Gamma<0|$ $||A||_{\infty} = 4\Gamma-1>1$ since $\Gamma>\frac{1}{2}$



Now if we have derivative Bls...e.s. Type III $\frac{\partial U}{\partial x} = aU + b \quad \text{at } x=0 \quad boundary$

... then molecule becomes



i.e. U = U, - 2ahlo -6h

So A has the Structure ...

- all but rows require 151/2 for MAIL & 1

- most see if rows Changes this restriction ...

We want /1-20 (1+ah)/ +/20/ = 1

Two cases to consider:

(a) $1-2r(1+ch) \ge 0$ (i.e. diagonal feam positive)

then $\left|1-2r(1+ch)\right| + 2r = 1-2r(1+ch) + 2r \le 1$ $1-2rch \le 1$ always ox

But for diagonal Coefficient to be positive $2\Gamma(1+ah) \leq 1 \Rightarrow \Gamma \leq \frac{1}{2(1+ah)}$ So if coefficient is positive, problem is stable and We need re 1 do achieve this (b) 1-2r(1+ah) &0 (diagonal is negative) then /1-2r(Hah)/+ (2r/= 2r(1+ah)-1+2r &1 25(2+ah) < 2 But 2(2+ah) < 1/2 +ah ... So we can maintain stability When diagonal tuens negative provided reating but letters any bigger... diagonal still negative, but letters 1 - Also Note 1/2 1.e. Stability restriction greater

af TypeII Shan Type I BCo!