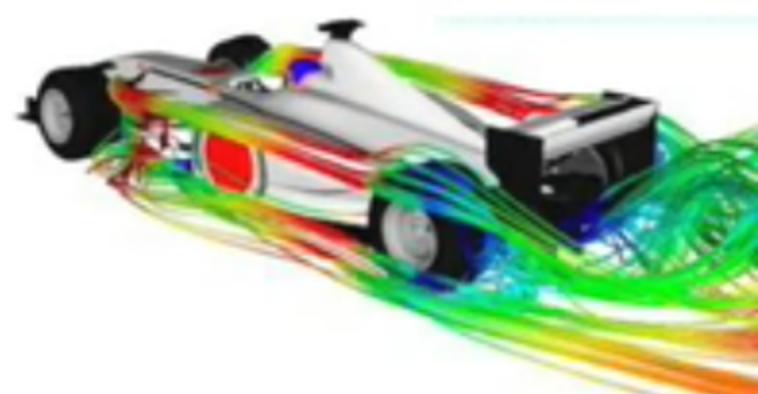
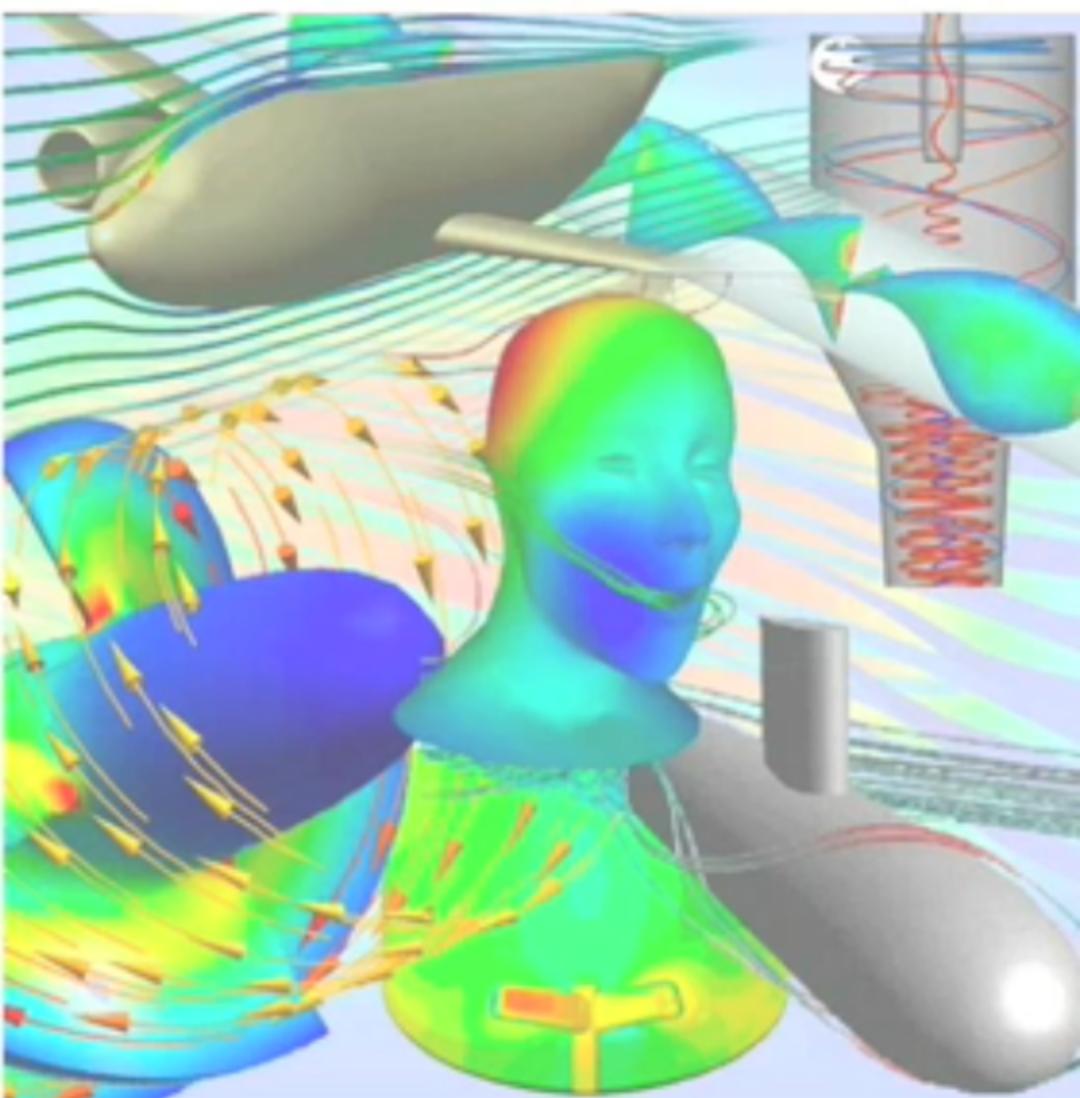


# Computational Fluid Dynamics, CFD

## Lecture 9

*Schemes for  
hyperbolic eqns.*



# Spectral analysis of numerical errors (cont.)

► ... for convection

- Lax-Friedrichs / Lax-Wendroff / Leapfrog

*considerable numerical diffusion*

*little numerical diffusion*  
but oscillations appear near *non-smooth* *spots*

*double solution*

## Spectral Analysis

\* Error in amplitude  $E_D = \frac{|G|}{|\tilde{G}|} \rightarrow$  diffusion error

\* Error in the phase  $E_\phi = \frac{\phi}{\tilde{\phi}} \rightarrow$  dispersion errors

Hyperbolic problem :  $E_D = |G|$  ,  $E_\phi = \frac{C_{\text{num}}}{C} = \frac{\tan^{-1}(-\text{Im}(G)/\text{Re}(G))}{\sigma\phi}$

Looked at plots of  $E_D, E_\phi$  vs  $\phi (= k\Delta x)$  , with  $\sigma$  as parameter

► Summary ...

1st order upwind

$E_D$  decreases away from 1 quickly with increasing frequencies.

$$\begin{aligned} E_\phi &< 1 & \text{(lagging) for } \sigma > 0.5 \\ &> 1 & \text{(leading) for } \sigma < 0.5 \\ &= 1 & \text{for } \sigma = 0.5 \end{aligned}$$

Lax-Friedrichs :  $E_D$  shows strong damping for smaller  $\sigma$   
no damping  $\phi = \pi$  ( $\gamma = 2\Delta x$ )

$E_\phi > 1 \rightarrow$  leading phase error

Lax-Wendroff :  $E_D$  shows larger "accurate region", where  $E_D \approx 1$   
 $E_\phi$  mostly  $< 1 \rightarrow$  lagging

Leapfrog (pending)

► Leapfrog scheme

Note that  $|G| = 1 \rightarrow$  No diffusion error

Leapfrog scheme is particularly useful for long-term simulations  
e.g. Weather forecast codes

\* Dispersion error

$$E_\phi = \pm \frac{\tan^{-1} \left[ (\zeta \sin \phi) / \sqrt{1 - \zeta^2 \sin^2 \phi} \right]}{\zeta \phi} = \pm \frac{\sin^{-1} (\zeta \sin \phi)}{\zeta \phi}$$

► Leapfrog scheme  $\longrightarrow$  accurate results for  $u(x)$  smooth  
 \* amplitudes correctly modeled  
 \* low frequencies, the phase error close to 1

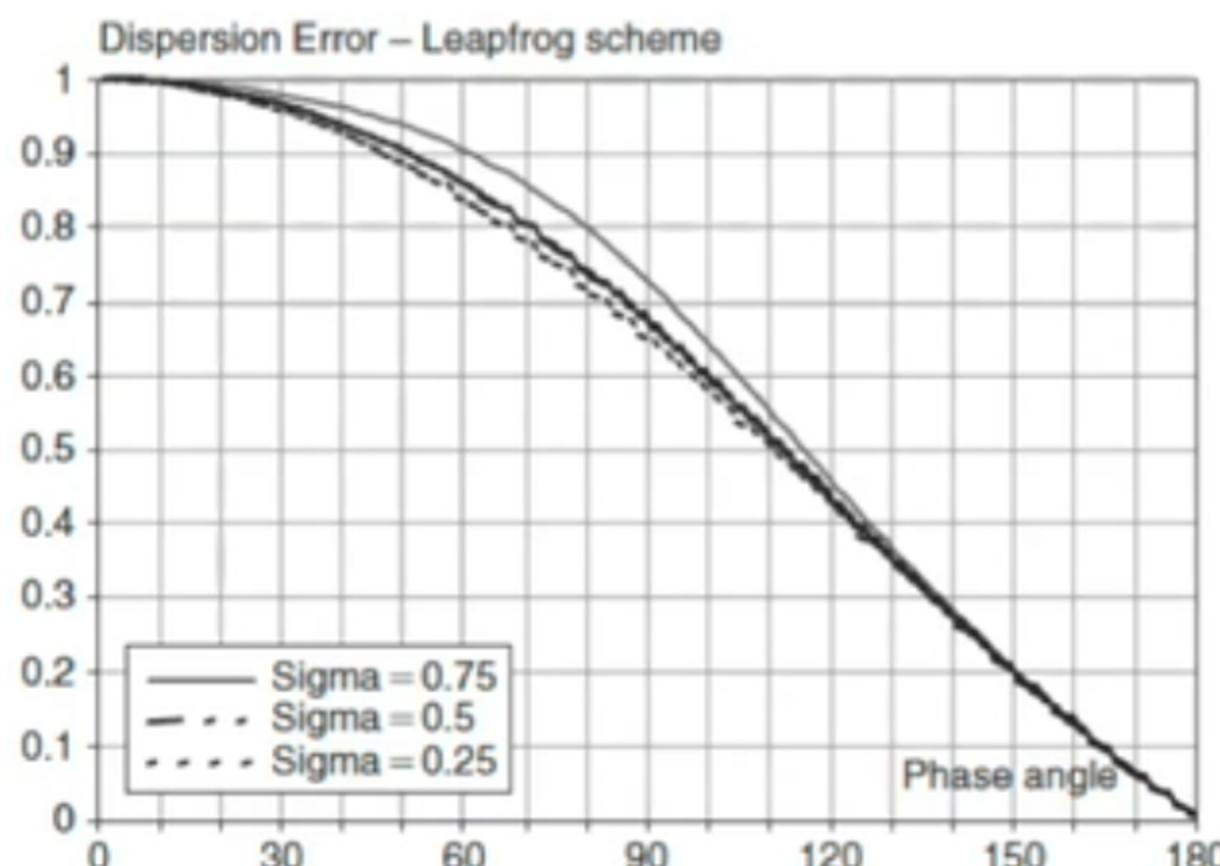
$E_\phi$  mostly  $< 1 \rightarrow$  lagging

Neutral stability

$$|G| = 1 \quad \text{if } \zeta \leq 1$$

some problems

\* high frequency errors NOT damping



Leapfrog  
unstable for  
 Burgers eqn !!

NOT good for  
 high speed flows  
 where shocks  
 can occur. \*

► Note on the oscillations ... (LW + Leapfrog)

— have not explained the origin of oscillations

Why do they occur behind the traveling wave?

- oscillations have frequency

- $E_\phi$  for LW & leapfrog predominantly  $< 1$   
(especially at higher frequencies)

→ convection speed of errors SLOWER than physical one

leapfrog  $E_\phi \rightarrow 0$  for  $\phi \rightarrow \text{TO}$  and SD  
oscillations are stronger:

Consider an alternative scheme, due to Beam & Warming:

recall derivation of LW ...

$$u_i^{n+1} = u_i^n - c\Delta t (u_x)_i + c \frac{c^2 \Delta t^2}{2} (u_{xx})_i + O(\Delta t^3)$$

Then discretize using BD (upwind) ...

④ — Analysis of Beam-Warming (use BD instead of CD of LW)

$$u_i^{n+1} = u_i^n - \frac{\sigma}{2} (3u_i^n - 4u_{i-1}^n + u_{i-2}^n) + \frac{\sigma^2}{2} (u_i^n - 2u_{i-1}^n + u_{i-2}^n)$$

Stability gives :

$$G = 1 - \sigma [1 + 2(1-\sigma) \sin^2(\phi/2)] \sin \phi - 2\sigma [1 - (1-\sigma) \cos \phi] \sin^2(\phi/2)$$

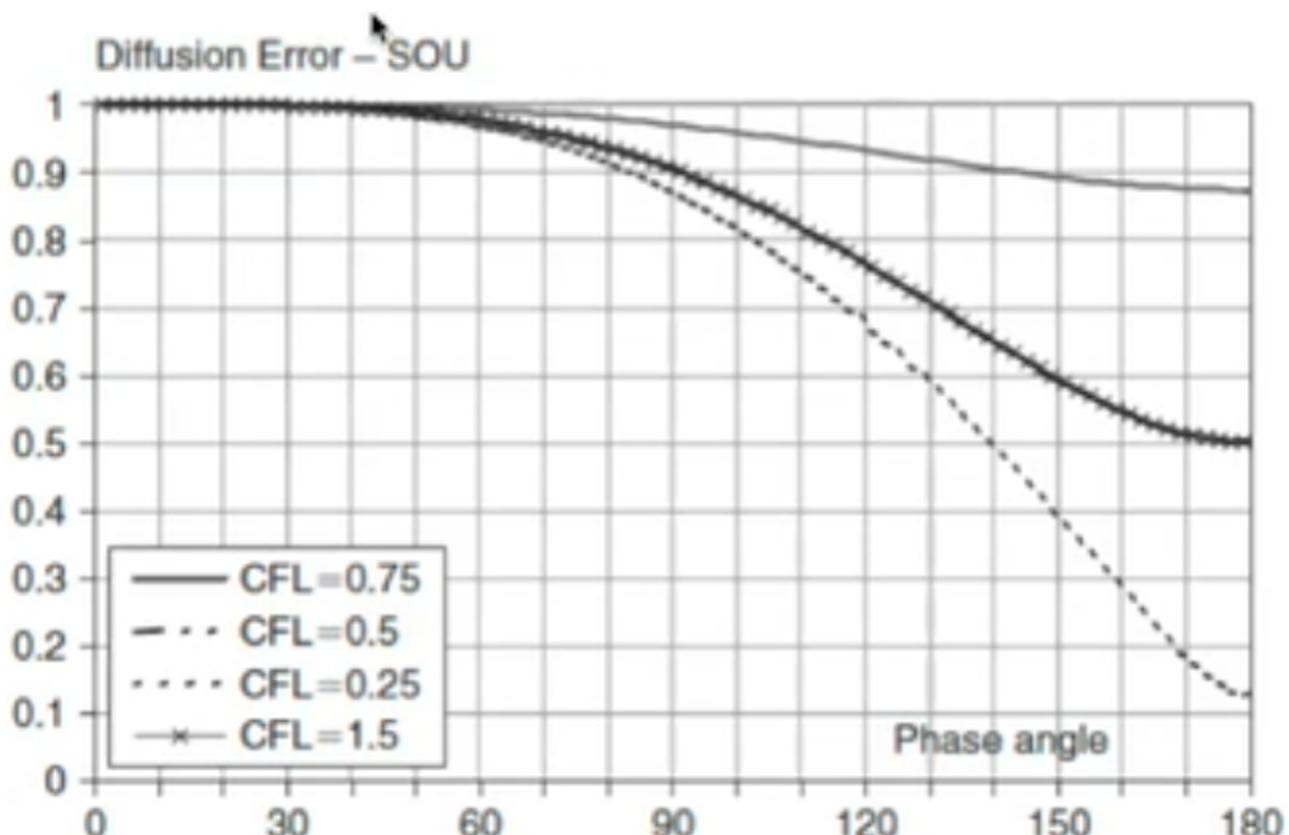
→ conditionally stable for  $0 \leq \sigma \leq 2$

\* Diffusion error:

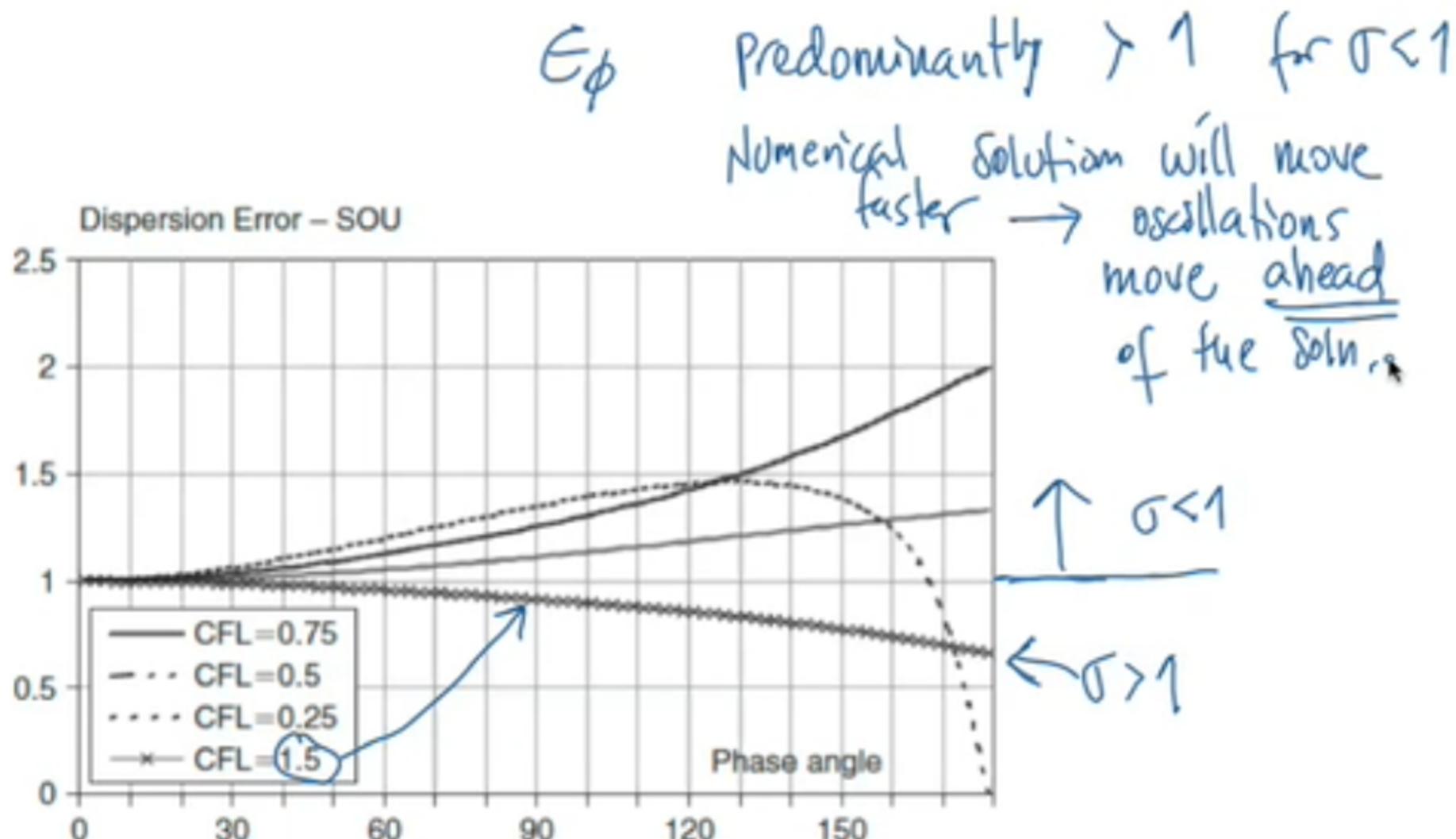
$$E_D = |G| = \sqrt{1 - \sigma(1-\sigma)^2(2-\sigma)(1-\cos \phi)^2}$$

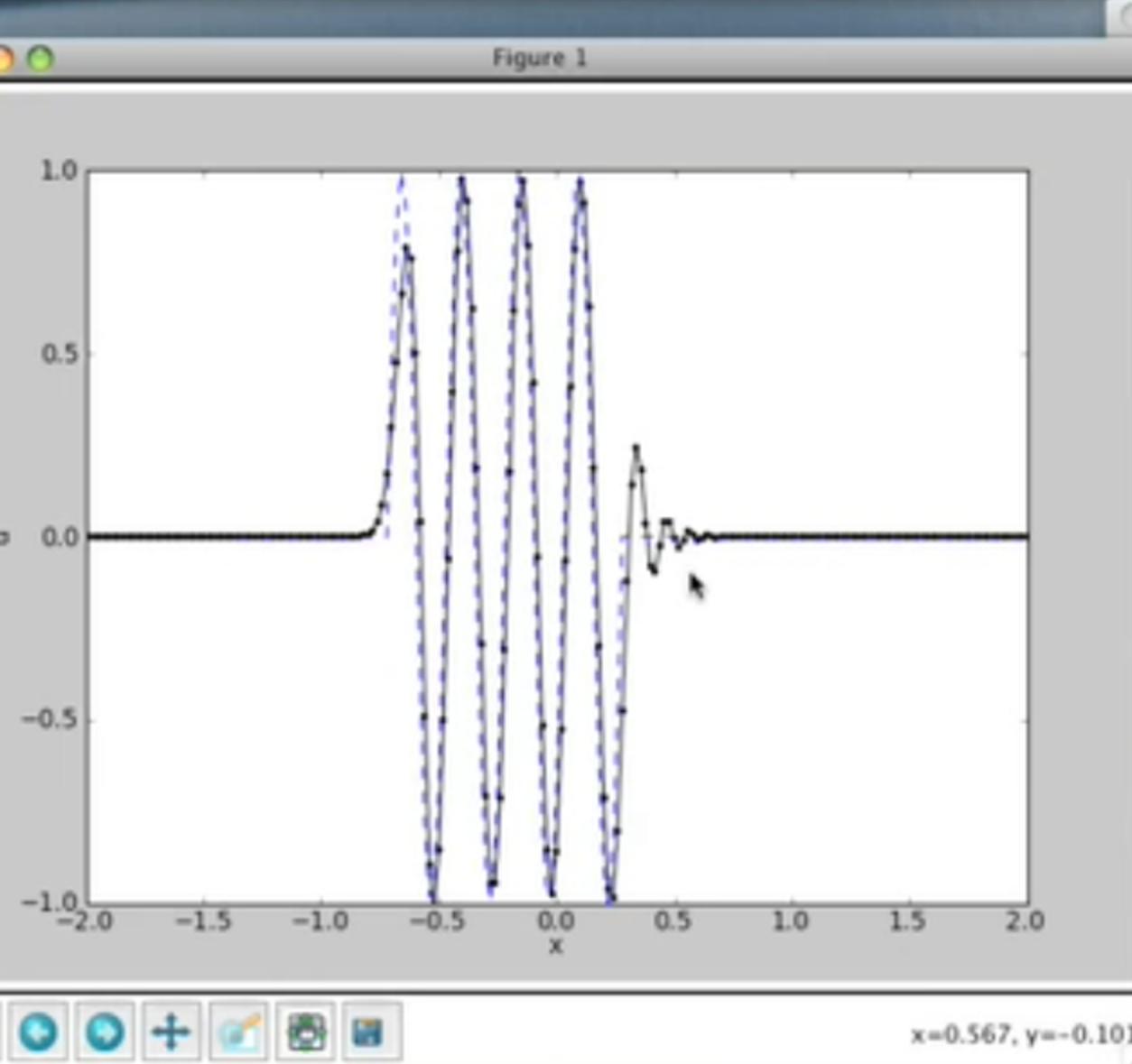
$E_\phi$  ... more messy See plots !

#### ④ — Analysis of Beam-Warming



#### ④ — Analysis of Beam-Warming





Hirsch327-BW.py  
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Hirsch327-BW.py (no symbol selected)

```
dx/c
in/dx) + 1

array for x values
-domain, domain, nx)

*x*pi)

e(nx):
n+1 <= x[i] and x[i] <= domain:
[i] = 0
[]

x, uzero, "k,-")
, domain, -1, 1])
```

Script Progress  
Running Script:  
Hirsch327-BW.py  
Cancel

x=0.567, y=-0.101 ge(nt):  
[]

```
in range(1,nx-1):
    off:
    i] = un[i] - sigma/2*( 3*un[i] - 4*un[i-1] +un[i-2]) + sigma**2/2*( un[i]-2*un
    it_ydata(u)

    i(8*pi*(x-c*dt*nt))
zng(nx):
nain <= x[i] and x[i] <= -domain+c*dt*nt:
zro[i] = 0
```

```
 1 1 Python Unicode (UTF-8, no BOM) Unix (LF) 957 / 185 / 54
 1 1 Hirsch327-BW.py Last Saved: 01/03/2010 15:00:45 File Path : ~/Documents/Teaching...2/src/Hirsch327-BW.py (no symbol selected)
from pylab import *
ion()

domain = 2.0
nt = 80
sigma = 0.8
c = 1.0
dx = 0.01
dt = sigma * dx/c
nx = int(domain/dx) + 1
print nx

# create an array for x values
x = linspace(-domain,domain,nx)

u = zeros(nx)
un = zeros(nx)
uzero = sin(8*x*pi)

for i in range(nx):
    if -domain+1 <= x[i] and x[i] <= domain:
        uzero[i] = 0

u[:] = uzero[:]

line, = plot(x,uzero,'k,-')
axis([-domain, domain, -1, 1])
xlabel('x')
ylabel('u')

for it in range(nt):
    un[:] = u[:]

    for i in range(1,nx-1):
        # Lax-Wendroff:
        u[i] = un[i] - sigma/2*( 3*un[i]- 4*un[i-1] +un[i-2]) + sigma**2/2*(

        line.set_ydata(u)
        draw()

hold(True)
uzero = sin(8*pi*(x-c*dt*nt))
for i in range(nx):
```

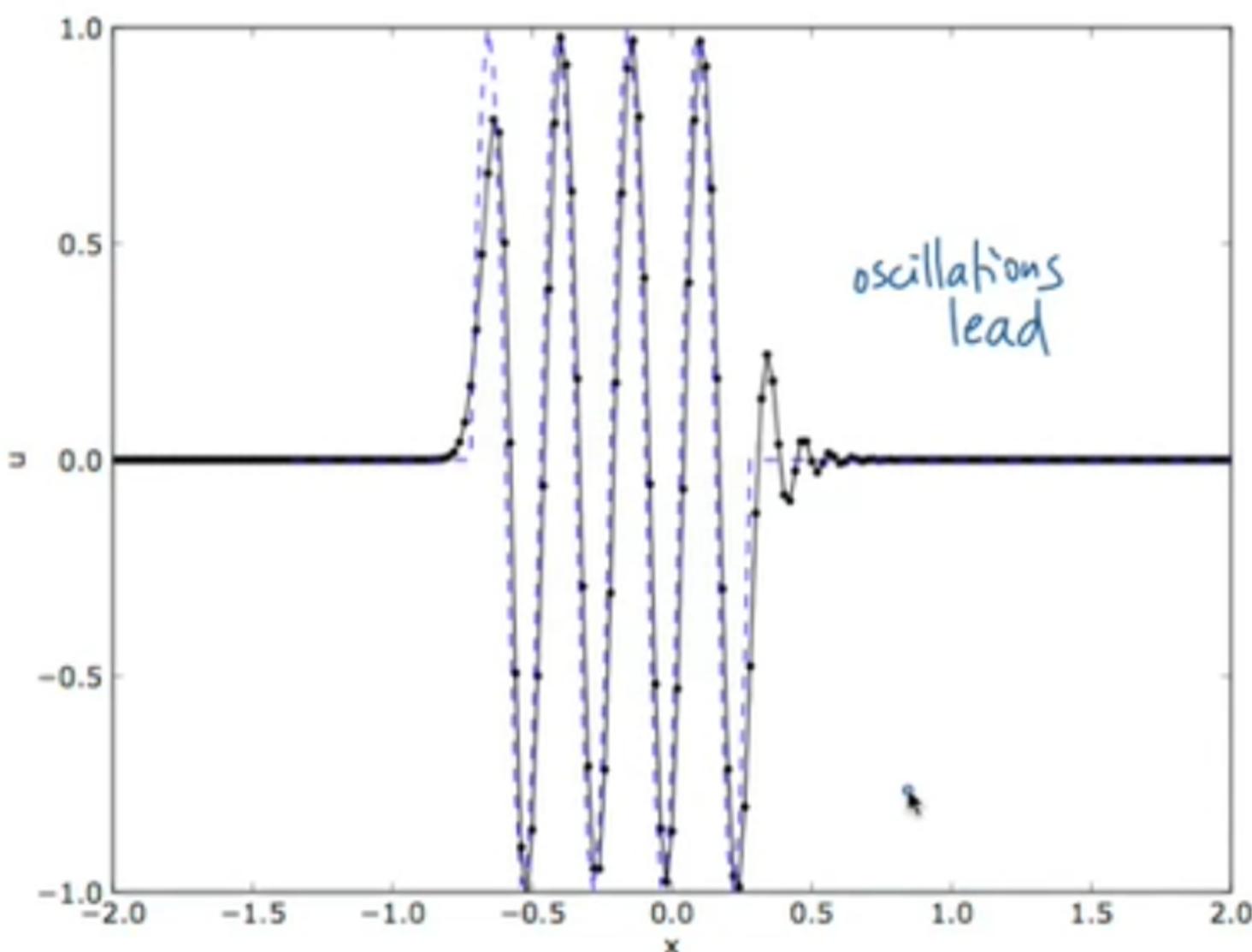
#### ④ — Beam-Warming

(Test #3)

$$\sigma = 0.8$$

$$\Delta x = 0.02$$

$$n_{\text{steps}} = 80$$



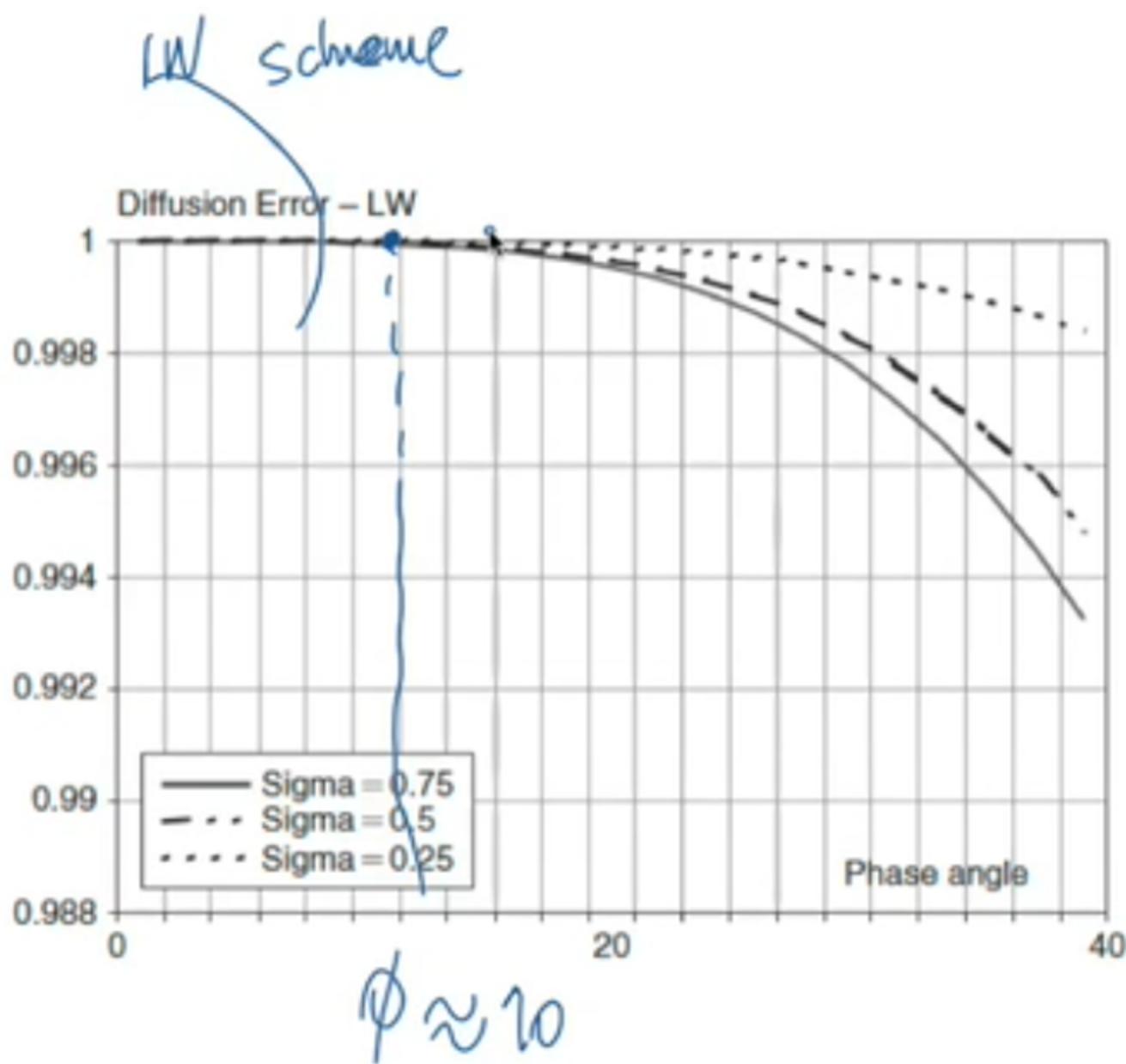
## ► Final notes

- 1st order schemes ... generate large errors
- 2nd order schemes ... acceptable errors BUT should be careful especially at higher frequencies

Look at plot  $E_D$  for  $\omega$  LR, establish a phase angle limit

$\phi_{\text{lim}}$  want  $E_D \approx 1$

► zoom-in



## ► Final notes

- 1st order schemes ...

- 2nd order schemes ...

$$\phi_{\text{lim}} \sim 10^\circ \sim \frac{\pi}{18} \xrightarrow{\text{LW}} \text{for } \epsilon \approx 1$$

Key quantity : NUMBER OF MESH POINTS PER WAVELENGTH

$$N_\lambda = \frac{\lambda}{\Delta x}$$

We require  $\phi = k\Delta x = \frac{2\pi}{\lambda} \cdot \Delta x \leq \underline{\phi_{\text{lim}}}$  phase angle limit

or 
$$N_\lambda = \frac{\lambda}{\Delta x} \geq \frac{2\pi}{\phi_{\text{lim}}}$$

severe

Test #3 only 12 points / wavelength

$$\phi_{\text{lim}} = \frac{\pi}{18} \Rightarrow \text{at least } 36 \text{ points / wavelength}$$

$$\phi_{\text{lim}} = \frac{\pi}{12} \Rightarrow 24 \text{ pts / wavelength (safer)}$$

► Second-order one-sided differences

Finite formulas for  $\frac{\partial u}{\partial x}|_i$  of higher order, requiring increasing number of mesh points

E.g. Use upwind points  $(i-2), (i-1), i$

can write:  $(u_x)_i = \frac{au_i + bu_{i-1} + cu_{i-2}}{\Delta x} + O(\Delta x^2)$

Taylor expansions

$$(1) \quad u_{i-2} = u_i - 2\Delta x (u_x)_i + \frac{(2\Delta x)^2}{2} (u_{xx})_i - \frac{(2\Delta x)^3}{6} (u_{xxx})_i + \dots$$

$$(2) \quad u_{i-1} = u_i - \Delta x (u_x)_i + \frac{(\Delta x)^2}{2} (u_{xx})_i - \frac{(\Delta x)^3}{6} (u_{xxx})_i + \dots$$

Mult. (1) by  $c$ , (2) by  $b$ , add  $au_i$ :

$$\begin{aligned} \boxed{au_i + bu_{i-1} + cu_{i-2}} &= \cancel{(a+b+c)u_i} - \Delta x \cancel{(b+2c)(u_x)_i} \\ &\quad + \cancel{\frac{\Delta x^2}{2} (b+4c) (u_{xx})_i} + O(\Delta x^3) \\ \boxed{a+b+c=0} \quad \boxed{b+2c=-1} \quad \boxed{b+4c=0} & \} (u_x)_i = \frac{3u_i - 4u_{i-1} + u_{i-2}}{2\Delta x} + O(\Delta x)^2 \end{aligned}$$

► Multi-step methods — FD schemes at split time levels  
 Work well in NONLINEAR hyperbolic problems

Also called PREDICTOR - CORRECTOR

- \* 1st step, a "temporary value" for  $u(x)$  is "predicted"
- \* 2nd step, a "corrected value" is computed

① — Richtmyer / Lax-Wendroff

$\left\{ \begin{array}{l} \text{variant 1 (Richtmyer)} \rightarrow \text{at point } i \\ \text{variant 2 (2-step LW)} \rightarrow \text{at point } i+\frac{1}{2} \end{array} \right.$

(v1) : Step 1 always LF method at time level  $(n+\frac{1}{2})$

$$\frac{u_i^{n+\frac{1}{2}} - \frac{1}{2}(u_{i+1}^n + u_{i-1}^n)}{\Delta t / 2} = -c \frac{u_{i+1}^n - u_{i-1}^n}{2\Delta x}$$

Step 2 — Leapfrog

(with  $\Delta t / 2$ ) Leapfrog  $(u_i^{n+1} - u_i^{n-1}) / 2\Delta t$

$$\frac{u_i^{n+1} - u_i^n}{\Delta t} = -c \frac{(u_{i+1}^{n+\frac{1}{2}} - u_{i-1}^{n+\frac{1}{2}})}{2\Delta x}$$

Rearrange :  $u_i^{n+1/2} = \frac{1}{2}(u_{i+1}^n + u_{i-1}^n) - \frac{c\Delta t}{4\Delta x}(u_{i+1}^n - u_{i-1}^n)$

and

$$u_i^{n+1} = u_i^n - \frac{c\Delta t}{2\Delta x}(u_{i+1}^{n+1/2} - u_{i-1}^{n+1/2})$$

$\rightarrow$  stable for  $\frac{c\Delta t}{\Delta x} \leq 2$ .

(V2) Step 1, LF on  $i+1/2$

$$u_{i+1/2}^{n+1/2} = \frac{1}{2}(u_{i+1}^n + u_{i-1}^n) - \frac{c\Delta t}{2\Delta x}(u_{i+1}^n - u_i^n)$$

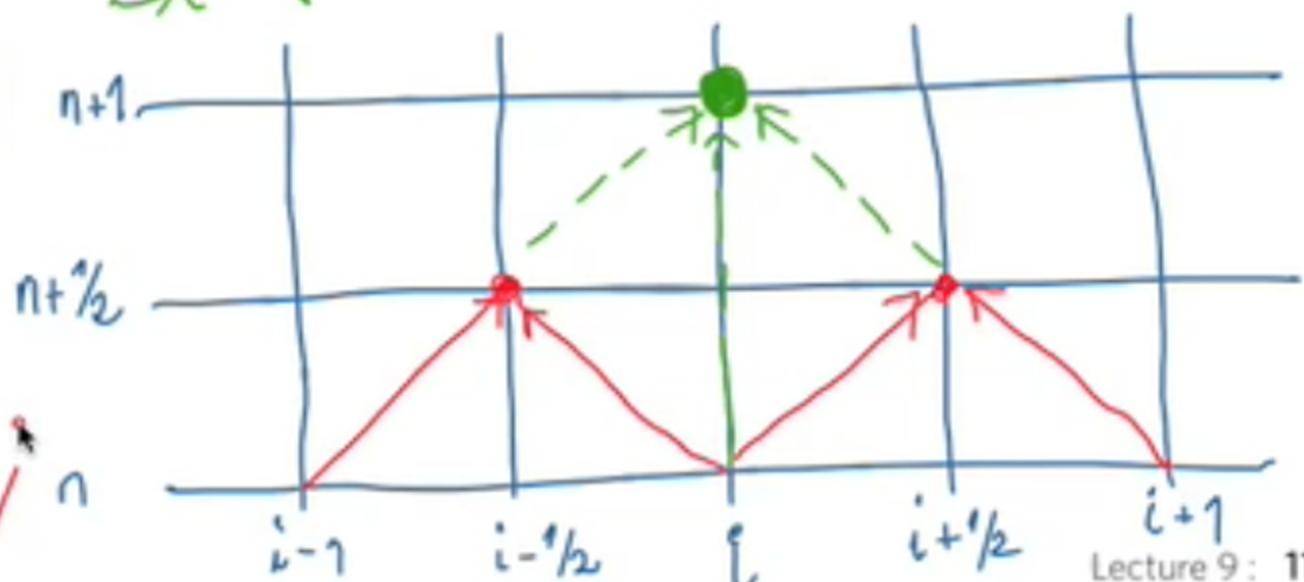
↑ used  $\Delta x/2$

and  $u_i^{n+1} = u_i^n - \frac{c\Delta t}{\Delta x}(u_{i+1/2}^{n+1/2} - u_{i-1/2}^{n+1/2})$

$\rightarrow$  stable for  $\frac{c\Delta t}{\Delta x} \leq 1$

- 2nd order

- For LINEAR PDEs it is  
equivalent to single-step LN<sup>n</sup>



## ② – MacCormack method

Step 1 uses FD scheme – call  $u^*$  the temporary solution

$$\frac{u_i^* - u_i^n}{\Delta t} = -c \frac{u_{i+1}^n - u_i^n}{\Delta x}$$

Step 2 uses BD scheme, with  $\Delta t/2$

$$\frac{u_i^{n+1} - u_i^{n+1/2}}{\Delta t/2} = -c \frac{u_i^* - u_{i-1}^*}{\Delta x}$$

- 2nd order
- stability  $\sigma < 1$
- For linear PDES equivalent to LW1
- Can alternate FD/BD – BD/FD works well nonlinear

and replace the value  $u_i^{n+1/2}$  by the average

$$u_i^{n+1/2} = \frac{1}{2}(u_i^n + u_i^*)$$

Predictor  $u_i^* = u_i^n - \frac{c\Delta t}{\Delta x} (u_{i+1}^n - u_i^n)$

Corrector  $u_i^{n+1} = \frac{1}{2} \left[ (u_i^n + u_i^*) - \frac{c\Delta t}{\Delta x} (u_i^* - u_{i-1}^*) \right]$

## Non-linear convection

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► inviscid Burgers equation

$$\frac{\partial u}{\partial t} = -u \frac{\partial u}{\partial x}$$

Conservative Form

$$\frac{\partial u}{\partial t} = - \frac{\partial}{\partial x} \left( \frac{u^2}{2} \right)$$

or  $\frac{\partial u}{\partial t} = - \frac{\partial E}{\partial x}$ , where  $E = \frac{u^2}{2}$

Physical interpretation  $\rightarrow$  a wave propagating with different speeds at different points

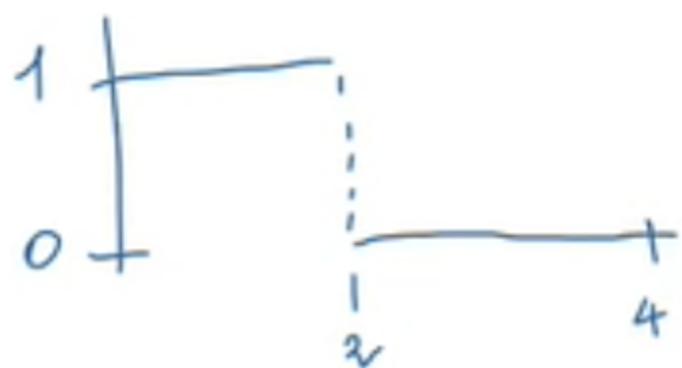
eventually  $\rightarrow$  a shock will be formed

# Non-linear convection

► inviscid Burgers equation

$$\frac{\partial u}{\partial t} = -u \frac{\partial u}{\partial x}$$

Practical Module — Nonlinear problems  
Test  $u(x, 0) = \begin{cases} 1 & 0 \leq x \leq 2 \\ 0 & 2 \leq x \leq 4 \end{cases}$



Investigate the propagation with

- ① LF
- ② LW

start  $\Delta x = \Delta t = 0.1$

then change  $\frac{\Delta t}{\Delta x} = 1$  to 0.5 → effect of Courant number

change to a finer mesh → effect of step size