

Computational Methods for Astrophysical Applications

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Lesson 3: Temporal Discretizations

1 Overview

2 Explicit methods

- von Neumann analysis
- CFL condition
- Lax-Wendroff scheme
- Runge-Kutta

3 Implicit methods

4 Examples

5 Assignment 1

- **Explicit methods:**
stability and von Neumann analysis, stencil, Lax-Friedrichs scheme, CFL condition, leapfrog and Lax-Wendroff method
- **Runge-Kutta methods:**
predictor-corrector, fourth-order four-step
- **Implicit methods:**
backward Euler, Crank-Nicolson, trapezoidal method
- **Examples**

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- ## 2 Explicit methods
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Explicit methods

- from time-independent BVP to **mixed Boundary Value-Initial Value problem**: spatio-temporal discretizations needed
- already 1D: quantities depend on \mathbf{x} and t
 \Rightarrow from ODE+BCs to PDE
- consider prototype **hyperbolic equation**

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

\Rightarrow given constant 'advection speed' v

- arbitrary initial shape $u_0(x, t = 0)$, exact solution

$$u(x, t) = u_0(x - vt)$$

\Rightarrow errors can be quantified precisely

- discretize both space and time, discrete time levels $t^n = n\Delta t$
 \Rightarrow initial condition specifies spatial variation $u_0(x, t^0 = 0)$
- explicit time integration:** values at t^{n+1} computed from available information on time level t^n
 \Rightarrow e.g. use second-order central difference for spatial derivative, forward difference for $\partial/\partial t$

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

\Rightarrow rearrange to

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

\Rightarrow Euler's **Forward Time Central Space** scheme: **useless!**

- **useless?** Method is **consistent** since LTE vanish in limit $\Delta x \rightarrow 0$ and $\Delta t \rightarrow 0$
 - \Rightarrow accuracy: 2nd order space, 1st order time \rightarrow overall 1st
 - \Rightarrow failure is related to numerical stability
- round-off errors should not grow during time progression
 - \Rightarrow evaluate by **von Neumann method**
 - \Rightarrow numerical solution = exact + round-off error $\epsilon(x, t)$
 - \Rightarrow represent $\epsilon(x, t)$ in Fourier series, analyse Fourier term

$$\epsilon_k(x, t) = \hat{\epsilon}_k e^{\lambda t} e^{ikx}$$

- numerically stable scheme: for all spatial wavenumbers k

$$\left| \frac{\epsilon_k^{n+1}}{\epsilon_k^n} \right| = |e^{\lambda \Delta t}| \leq 1$$

- FTCS scheme and von Neumann analysis yields

$$e^{\lambda \Delta t} = 1 - \frac{\nu \Delta t}{\Delta x} \frac{e^{ik\Delta x} - e^{-ik\Delta x}}{2} = 1 - i \frac{\nu \Delta t}{\Delta x} \sin(k\Delta x)$$

⇒ scheme is **unconditionally unstable** since for all k

$$\left| \frac{\epsilon_k^{n+1}}{\epsilon_k^n} \right| > 1$$

- **three cures** to save stability
 - ⇒ add ‘numerical diffusion’ to damp nonphysical instability
 - ⇒ impose same space-time symmetry as original PDE
 - ⇒ use implicit scheme

- adding diffusion: advection-diffusion equation has form

$$\frac{\partial u}{\partial t} = -v \frac{\partial u}{\partial x} + \mathcal{D} \frac{\partial^2 u}{\partial x^2}$$

\Rightarrow diffusion coefficient \mathcal{D}

- replace u_i^n by spatial average between x_{i-1} and x_{i+1} , arrive at

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

\Rightarrow **Lax–Friedrichs scheme** (or Lax scheme)

\Rightarrow rearrange to form

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

\Rightarrow numerical dissipation with $\mathcal{D} \equiv \frac{(\Delta x)^2}{2\Delta t}$

CFL condition

- perform von Neumann stability analysis for Lax–Friedrichs

$$e^{\lambda \Delta t} = \cos(k \Delta x) - i \frac{v \Delta t}{\Delta x} \sin(k \Delta x)$$

⇒ **conditional stability** requiring Courant number C

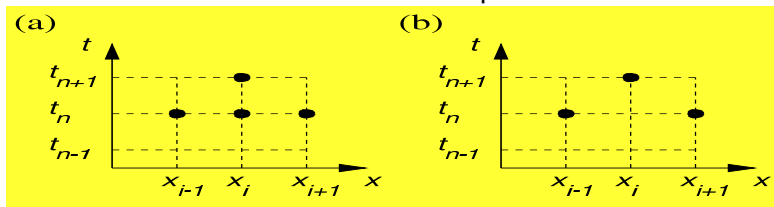
$$C \equiv \frac{|v| \Delta t}{\Delta x} \leq 1$$

⇒ limitation of the time step Δt for a given resolution Δx

⇒ **Courant–Friedrichs–Lewy** condition (1928)

⇒ necessary (not sufficient) condition for stability!

- in (x, t) space, we identify **stencil** of a method
 \Rightarrow stencils visualizes discrete dependence of method



\Rightarrow stencil for FTCS (a) versus Lax-Friedrichs (b)

- hyperbolic** PDE and **physical characteristics**
 \Rightarrow the advection equation is hyperbolic as

$$\frac{\partial u}{\partial t} + \frac{\partial \left(\underbrace{vu}_F \right)}{\partial x} = 0$$

and Flux Jacobian $\frac{\partial F}{\partial u} = v$ is real number, 'characteristic speed'

\Rightarrow $x - t$ curves given by $\xi = x - vt$ yield $du = 0$ or u constant

CFL and domain of dependence (DOD)

- for second order wave equation

$$\frac{\partial^2 u}{\partial t^2} - v^2 \frac{\partial^2 u}{\partial x^2} = 0$$

⇒ factorizes to

$$\left(\frac{\partial}{\partial t} - v \frac{\partial}{\partial x} \right) \left(\frac{\partial}{\partial t} + v \frac{\partial}{\partial x} \right) u = 0$$

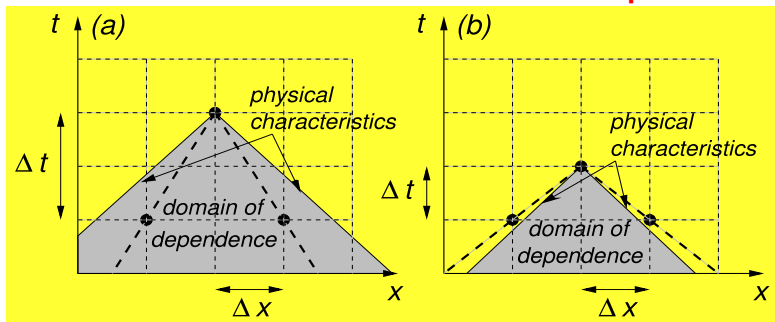
⇒ general solution has left and right going wave with

$$u = f(x - vt) + g(x + vt)$$

⇒ initial shapes $f(x)$, $g(x)$ combine

⇒ 2 characteristics $\frac{dx}{dt} = \pm v$

- illustrate CFL for second order wave equation:
the domain of dependence of the differential equation should be contained in the DOD of the discretised equations



⇒ stability means physical DOD contained in stencil bounds (numerical DOD), hence Δt small enough (right case)

- note: linear advection + wave equation: DOD only involves 1 or 2 points from $t = 0 \leftrightarrow$ HD: DOD bounds set by $v \pm c_s$ with c_s sound speed, delimits $t = 0$ interval

- Second cure: maintain space-time symmetry of the PDE
 - ⇒ use central discretisation for both x and t
 - ⇒ obtain **leapfrog** scheme

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

- ⇒ numerical flux function for advection is $F_i^n \equiv v u_i^n$
- ⇒ conditionally stable and second-order accurate
- ⇒ multiple time levels involved: $n-1, n, n+1$
- ⇒ potential problem: even/odd time levels may 'decouple'

Lax-Wendroff scheme

- other 2nd order accurate scheme, exploit Taylor series

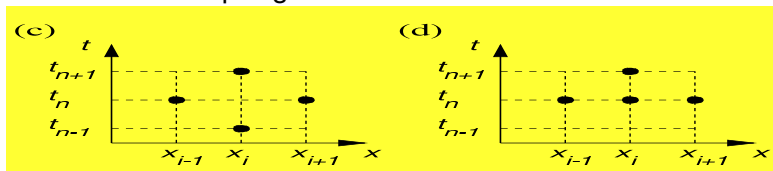
$$u(x, t + \Delta t) \approx u(x, t) + \Delta t \frac{\partial u}{\partial t}(x, t) + \frac{1}{2}(\Delta t)^2 \frac{\partial^2 u}{\partial t^2}(x, t)$$

- \Rightarrow now use equation $\frac{\partial u}{\partial t} = -v \frac{\partial u}{\partial x}$ to replace time derivatives
 \Rightarrow finally obtain Lax-Wendroff scheme

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

- \Rightarrow uses first cure idea: numerical dissipation
 \Rightarrow explicit (one-step) two-level scheme, conditionally stable

- stencils for leapfrog and Lax-Wendroff



Runge-Kutta methods

- semi-discretization for spatio-temporal PDE
 - ⇒ method of lines: first discretize space, obtain ODEs in time
 - ⇒ obtain initial value problem with ODE

$$\frac{du}{dt} = f(t, u)$$

augmented with initial condition $u(t^0) = u^0$

- Runge-Kutta methods use weighted averages of $f(t, u)$ in different points in time interval $[t^n, t^{n+1}]$
 - ⇒ weights to achieve certain order of accuracy (in time here)

- **predictor-corrector or two-step** method takes

$$u^{n+1} = u^n + \Delta t k^{n2} + \mathcal{O}(\Delta t)^3$$

where we have

$$k^{n1} = f(t^n, u^n), \quad k^{n2} = f(t^n + \frac{1}{2}\Delta t, u^n + \frac{1}{2}\Delta t k^{n1})$$

$\Rightarrow k^{n2}$ corresponds to evaluating f at time $t^{n+\frac{1}{2}}$

- classic **fourth-order four-step Runge–Kutta** method uses

$$u^{n+1} = u^n + \Delta t \frac{1}{6}(k^{n1} + 2k^{n2} + 2k^{n3} + k^{n4}) + \mathcal{O}(\Delta t)^5$$

where

$$k^{n1} = f(t^n, u^n), \quad k^{n2} = f(t^n + \frac{1}{2}\Delta t, u^n + \frac{1}{2}\Delta t k^{n1}),$$

$$k^{n3} = f(t^n + \frac{1}{2}\Delta t, u^n + \frac{1}{2}\Delta t k^{n2}), \quad k^{n4} = f(t^n + \Delta t, u^n + \Delta t k^{n3})$$

\Rightarrow fourth-order accurate (for time derivative) in step size Δt

- **same ideas possible for space discretization**
 \Rightarrow will be **topic of first assignment!**
- adaptive RK schemes: adjust step size (time/space)

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Temporal discretizations: implicit methods

- third cure to instability of Euler FTCS scheme: evaluate spatial derivative at t^{n+1}

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

⇒ **Backwards in Time, Central in Space Euler** scheme

⇒ u_i^{n+1} not expressed in terms of values at time t^n : **implicit**

- von Neumann stability analysis for BTCS scheme

$$|e^{\lambda \Delta t}| = \frac{1}{|1 + i \frac{v \Delta t}{\Delta x} \sin(k \Delta x)|} < 1 \quad \text{for all } k$$

⇒ **unconditionally stable**, any (large) time step Δt allowed

- note: **stability does not imply accuracy**

⇒ large Δt affects accuracy, defines time resolution:
behavior may involve physical timescale that needs to be resolved!

- implicit backward Euler: first order in time

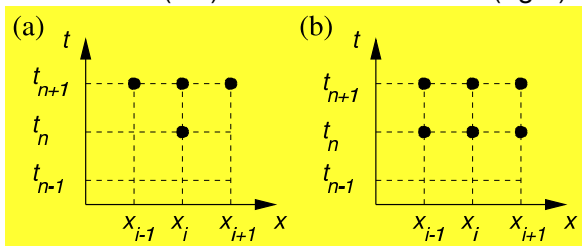
- spatial differences as average of n -th and $(n+1)$ -th time step

$$u_i^{n+1} = u_i^n - \frac{1}{4}v \frac{\Delta t}{\Delta x} (u_{i+1}^{n+1} + u_{i+1}^n - u_{i-1}^{n+1} - u_{i-1}^n)$$

⇒ second order **Crank–Nicolson method**

⇒ **Exercise**: show that this scheme is unconditionally stable, 2nd order accurate

- stencils for BTCS (left) and Crank-Nicolson (right)



Semi-discretisation and implicit methods

- many practical implementations use ‘method of lines’
 - \Rightarrow vector \mathbf{u} of unknowns after first spatial discretization
 - \Rightarrow obtain ODE system

$$\frac{d\mathbf{u}}{dt} = \mathbf{f}(\mathbf{u})$$

\Rightarrow RHS vector function \mathbf{f} could even be nonlinear in \mathbf{u}

- discretize ODE in time using parameter α in

$$\mathbf{u}^{n+1} = \mathbf{u}^n + \Delta t \left[\alpha \mathbf{f}(\mathbf{u}^{n+1}) + (1 - \alpha) \mathbf{f}(\mathbf{u}^n) \right]$$

\Rightarrow note case $\alpha = 0$: explicit (unstable) forward Euler method

$$\mathbf{u}^{n+1} = \mathbf{u}^n + \Delta t \left[\alpha \mathbf{f}(\mathbf{u}^{n+1}) + (1 - \alpha) \mathbf{f}(\mathbf{u}^n) \right]$$

- $\alpha = 1$ is **implicit backward Euler**
- $\alpha = 1/2$ gives second-order accuracy, **trapezoidal method**
 \Rightarrow Crank-Nicolson for central discretization of flux in \mathbf{f}
- when \mathbf{f} nonlinear: linearize using

$$\mathbf{f}(\mathbf{u}^{n+1}) \approx \mathbf{f}(\mathbf{u}^n) + \frac{\partial \mathbf{f}^n}{\partial \mathbf{u}} (\mathbf{u}^{n+1} - \mathbf{u}^n)$$

\Rightarrow introduces matrix $\frac{\partial \mathbf{f}^n}{\partial \mathbf{u}}$ called “**Jacobian matrix**” of \mathbf{f}

- using this linearization, rewrite scheme to

$$\mathbf{u}^{n+1} = \mathbf{u}^n + \Delta t \alpha \frac{\partial \mathbf{f}^n}{\partial \mathbf{u}} (\mathbf{u}^{n+1} - \mathbf{u}^n) + \Delta t \mathbf{f}(\mathbf{u}^n)$$

$$\Rightarrow \left[I - \Delta t \alpha \frac{\partial \mathbf{f}^n}{\partial \mathbf{u}} \right] \delta \mathbf{u} = \Delta t \mathbf{f}(\mathbf{u}^n)$$

\Rightarrow linear system for the unknowns $\delta \mathbf{u} \equiv \mathbf{u}^{n+1} - \mathbf{u}^n$

\Rightarrow represents **first step of Newton iteration**, may be expanded to full iteration for nonlinear problems

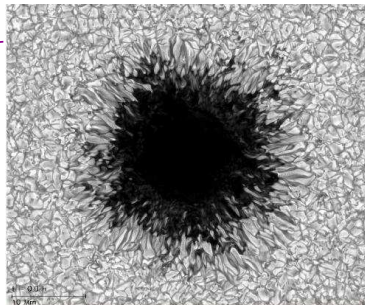
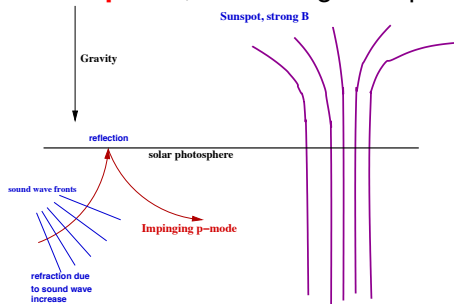
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Examples

- **numerically solving linearized MHD equations**
- 1st assignment: linear HD equations for stratified plane-parallel stellar atmosphere, govern wave dynamics: pressure gradient and gravity as restoring force
 - ⇒ gravito-acoustic p -, g -modes
 - ⇒ also have f -mode, surface character
- in MHD magneto-gravito-acoustic waves
- First example: study of p -mode interactions with sunspots
- Second example: study of solar coronal loop oscillations
 - ⇒ both represent **magneto-seismology**
 - ⇒ use different spatio-temporal discretizations

Sunspot seismology

- solve **linear MHD equations for gravitationally stratified atmosphere**, containing 'sunspot' as slab of vertical **B**

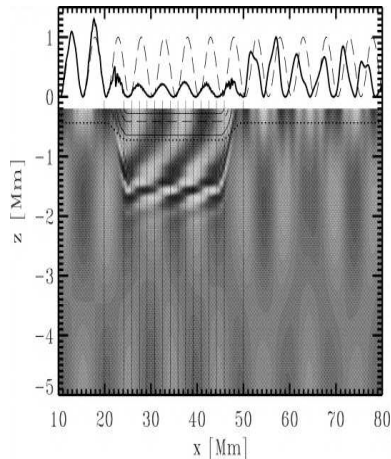


- region exterior to spot: vertical hydrostatic equilibrium
 - ⇒ pressure increases downwards
 - ⇒ upwards pressure gradient balances downwards gravity

- numerical strategy:
 - ⇒ **explicit Lax–Wendroff type scheme, finite difference**
 - ⇒ IVP-BVP in 2 dimensions: driving p -mode at left boundary
- **study how impinging f - or p -modes are partially converted to slow magneto-atmospheric gravity waves within the stratified magnetic slab**
- conversion where 2 natural speeds of system near-equal
 - ⇒ in sunspot: sound speed varies with depth
 - ⇒ magnetic Alfvén speed $v_A = B/\sqrt{\rho}$
 - ⇒ mode coupling/conversion at $\beta \approx 1$ region
 - ⇒ where $\beta = 2p/B^2$ ratio thermal/magnetic pressure

Active region seismology

- Interaction p-modes with sunspots:
 - decompose in in- & outgoing waves,
 - absorb up to 50 % of impingent acoustic power!
- Candidate linear MHD processes:
 - driving frequencies in Alfvén range causing local resonant Ohmic dissipation
 - stratification: mode conversion to downward propagating magneto-acoustic wavemodes at $\beta \approx 1$ layers.



Cally & Bogdan, ApJL **486**, L67 (1997)

<http://www.hao.ucar.edu/>

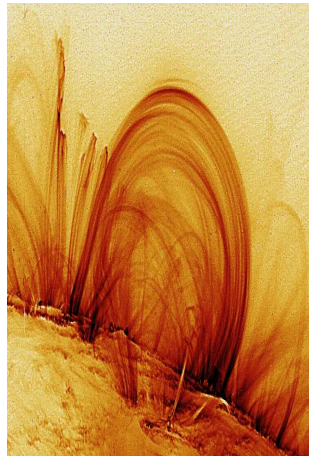
Coronal seismology

- TRACE spacecraft (NASA launch '98):
 - <http://trace.lmsal.com/>
 - 3D field transition region/corona,
 - unprecedented views coronal loops:

TRACE movie of erupting filament

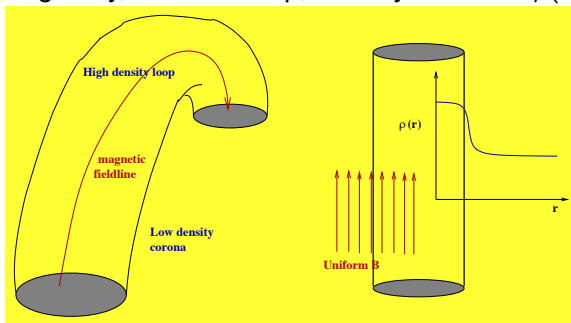
TRACE movie of oscillating filament

- Studies of MHD waves in loops:
 - coronal seismology.
 - invert for loop parameters



Damped loop oscillations

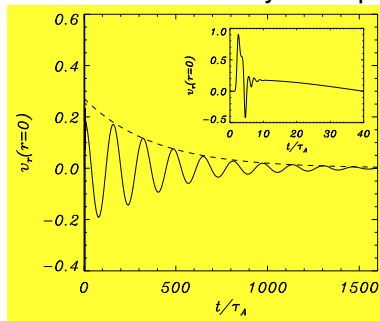
- observed loop displacements:
 ⇒ **oscillation amplitudes, periods, damping time**
- damp within few periods
 ⇒ MHD mode conversion/dissipation
- cylindrical coronal loop model, zero β (no slow waves)
 ⇒ no gravity, line-tied loop, density variation $\rho(r)$ only



- **Spatial discretization:**
 - ⇒ Fourier handling ignorable θ, z directions
 - ⇒ finite element treatment of radial direction
 - ⇒ semi-discretize linear MHD equations
- focus on single Fourier mode
 - ⇒ isolate $m = 1$ **kink** displacements of a line-tied loop
- **temporal:** 2nd order Crank–Nicolson (implicit)

Damped loop oscillations

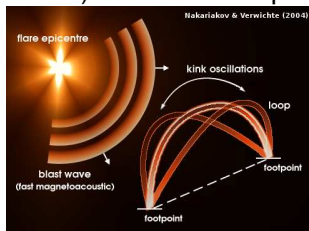
- temporal behavior of radial velocity at loop axis



$v_r(r, t)$ and $v_\theta(r, t)$ movies Terradas *et al.*, ApJL **642**, 533 (2006)

\Rightarrow identifies various phases of loop dynamics

- identifies **various phases of loop dynamics**
 - ⇒ **transient** with attenuated short-period oscillations
 - ⇒ leaky loop eigenmode, wave energy propagates away
 - ⇒ **damped, longer period oscillation** dominates later
 - ⇒ global kink eigenoscillation,
coupled to Alfvén in thin layer due to $\rho(r)$ variation
 - ⇒ localized (Ohmic) resistive dissipation damps



- successfully explains (quantitative!) damping behavior**

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Gravito-acoustic waves and Rayleigh-Taylor instability

- **Intro:** derivation of governing second order ODE
 - ⇒ analytic solutions for exponentially stratified medium
 - ⇒ govern *p*- and *g*-modes
- **Discussion of numerical assignment:**
 - ⇒ use of **shooting method** for obtaining eigenoscillations
 - ⇒ analyse special case of **incompressible plane slab**

[material adapted from Goedbloed & Poedts, Principles of MHD, CUP 2004, and lectures by Hans Goedbloed]

Introduction: gravito-acoustic waves

- Use **hydrodynamic equations governing stratified slab**
 - ⇒ **force balance** for hydrostatic equilibrium
 - ⇒ illustrate process of **linearization about equilibrium**
- specify to **gravito-acoustic waves in plane slab**
 - ⇒ take gravity $\mathbf{g} = -g\hat{e}_x$
 - ⇒ obtain second order ODE for displacement x-component
 - ⇒ complement with rigid boundary conditions

Hydrodynamic equations

- **Euler equations for gas dynamics**, with (external) gravity \mathbf{g} , in terms of density ρ , velocity vector \mathbf{v} and pressure p
 \Rightarrow express conservation of mass

$$\frac{\partial \rho}{\partial t} + \nabla \cdot (\rho \mathbf{v}) = 0$$

\Rightarrow momentum equation (Newton's law)

$$\underbrace{\rho \left(\frac{\partial \mathbf{v}}{\partial t} + \mathbf{v} \cdot \nabla \mathbf{v} \right)}_{\text{mass} \times \text{acceleration}} = \underbrace{-\nabla p + \rho \mathbf{g}}_{\text{force}}$$

\Rightarrow pressure evolution

$$\frac{\partial p}{\partial t} + \mathbf{v} \cdot \nabla p + \gamma p \nabla \cdot \mathbf{v} = 0$$

with constant ratio of specific heats γ , ideal gas value $\frac{5}{3}$

- **express conservation of mass, momentum, energy**
- look for **hydrostatic equilibrium**, time-independent $\frac{\partial}{\partial t} = 0$
 - \Rightarrow static equilibrium sets $\mathbf{v} = \mathbf{0}$, write $p \equiv p_0(\mathbf{r})$ and $\rho \equiv \rho_0(\mathbf{r})$
 - \Rightarrow only **force balance** remains

$$\mathbf{0} = -\nabla p_0 + \rho_0 \mathbf{g}$$

- \Rightarrow 1D: gravity and pressure isolevels mutually \perp
- \Rightarrow define x -direction, equilibrium has $p_0(x)$, $\rho_0(x)$ related

- **linearize HD equations about static equilibrium**
 - $\Rightarrow \mathbf{v} = \mathbf{v}_1(\mathbf{r}, t), \rho = \rho_0(x) + \rho_1(\mathbf{r}, t) \text{ and } p = p_0(x) + p_1(\mathbf{r}, t)$
 - \Rightarrow insert, split off equilibrium
 - \Rightarrow keep linear terms in small quantities \mathbf{v}_1 , ρ_1 , and p_1
- governs **small perturbations about static equilibrium**

HD wave equation

- Equilibrium of plane slab with constant external gravity field
 $\mathbf{g} = (-g, 0, 0)$

$$\nabla p_0 = \rho_0 \mathbf{g} \quad \Rightarrow \quad p'_0(x) = -\rho_0(x)g$$

- Linearized HD equations:

$$\frac{\partial \rho_1}{\partial t} + \mathbf{v}_1 \cdot \nabla \rho_0 + \rho_0 \nabla \cdot \mathbf{v}_1 = 0$$

$$\rho_0 \frac{\partial \mathbf{v}_1}{\partial t} + \nabla p_1 - \rho_1 \mathbf{g} = 0$$

$$\frac{\partial p_1}{\partial t} + \mathbf{v}_1 \cdot \nabla p_0 + \gamma p_0 \nabla \cdot \mathbf{v}_1 = 0$$

- With $\mathbf{v}_1 = \partial \boldsymbol{\xi} / \partial t \Rightarrow$ **Wave equation for gravito-acoustic waves in plane slab:**

$$\rho_0 \frac{\partial^2 \boldsymbol{\xi}}{\partial t^2} - \nabla(\gamma p_0 \nabla \cdot \boldsymbol{\xi}) - \rho_0 \nabla(\mathbf{g} \cdot \boldsymbol{\xi}) + \rho_0 \mathbf{g} \nabla \cdot \boldsymbol{\xi} = 0$$

- equilibrium 1D (x-direction from gravity)
 - ⇒ displacement vector $\xi(\mathbf{r}, t) \equiv \xi(x, y, z, t)$ in general
 - ⇒ ignorable coordinates y, z : use Fourier mode $e^{i(k_y y + k_z z)}$
 - ⇒ **normal mode** analysis, time dependence $e^{-i\omega t}$
 - ⇒ together, change to **eigenvalue problem** where

$$\xi(\mathbf{r}, t) = \hat{\xi}(x) e^{i(k_y y + k_z z - \omega t)}$$

- for given equilibrium, and given mode numbers k_y, k_z
 - ⇒ obtain eigenfrequencies ω with corresponding eigenfunctions $\hat{\xi}(x)$

- choose coordinate system such that $k_z = 0$, **rename** $k_y \equiv k$
 \Rightarrow no physical direction other than gravity (x)
- governing vector equation for $\hat{\xi}(x)$
 \Rightarrow **express as second order ODE for $\hat{\xi}_x \equiv \xi$**

$$\frac{d}{dx} \left(\frac{\gamma p_0 \rho_0 \omega^2}{\rho_0 \omega^2 - k^2 \gamma p_0} \frac{d\xi}{dx} \right) + \left[\rho_0 \omega^2 - \frac{k^2 \rho_0^2 g^2}{\rho_0 \omega^2 - k^2 \gamma p_0} - \left(\frac{k^2 \gamma p_0 \rho_0 g}{\rho_0 \omega^2 - k^2 \gamma p_0} \right)' \right] \xi = 0$$

\Rightarrow 2 BCs, rigid walls at $x = 0$ and $x = 1$ require

$$\xi(x=0) = \xi(x=1) = 0$$

\Rightarrow note: γ , k , g given constants

\Rightarrow ω is (constant) eigenfrequency to be determined

\Rightarrow known $\rho_0(x)$ and $p_0(x)$ functions related by $p'_0 = -\rho_0 g$

Gravito-acoustic waves

- Exponentially stratified medium with constant sound speed*

$$\rho_0 = e^{-\alpha x}, \quad p_0 = e^{-\alpha x} \quad \Rightarrow \quad c^2 = \frac{\gamma p_0}{\rho_0} = \gamma = \text{const}$$

$$p'_0 = -\alpha p_0 = -\rho_0 g \quad \Rightarrow \quad \alpha = \frac{\rho_0 g}{p_0} = g = \text{const}$$

Spectral equation reduces to

$$\frac{c^2 \omega^2}{\omega^2 - k^2 c^2} \frac{d}{dx} \left(e^{-\alpha x} \frac{d\xi}{dx} \right) + \left(\omega^2 - \frac{k^2 g^2}{\omega^2 - k^2 c^2} + \alpha \frac{k^2 c^2 g}{\omega^2 - k^2 c^2} \right) e^{-\alpha x} \xi = 0$$

- introduce Brunt–Väisälä frequency $N^2 = (\gamma - 1) \frac{g^2}{c^2}$ find

$$\frac{d^2 \xi}{dx^2} - \alpha \frac{d\xi}{dx} + \frac{\omega^4 - k^2 c^2 \omega^2 + k^2 c^2 N^2}{c^2 \omega^2} \xi = 0$$

\Rightarrow 2nd order differential equation with constant coefficients

- trivial solutions

$$\xi = C e^{(\frac{1}{2}\alpha \pm i q)x}, \quad q \equiv \sqrt{-\frac{1}{4}\alpha^2 + \frac{\omega^4 - k^2 c^2 \omega^2 + k^2 c^2 N^2}{c^2 \omega^2}}$$

Expression under root > 0 for oscillatory solutions, satisfy BCs with quantized $q = n\pi$ ($n = 1, 2, \dots$)

- Dispersion equation of gravito-acoustic waves* from

$$\omega^4 - (k^2 + q^2 + \frac{1}{4}\alpha^2)c^2\omega^2 + k^2 c^2 N^2 = 0$$

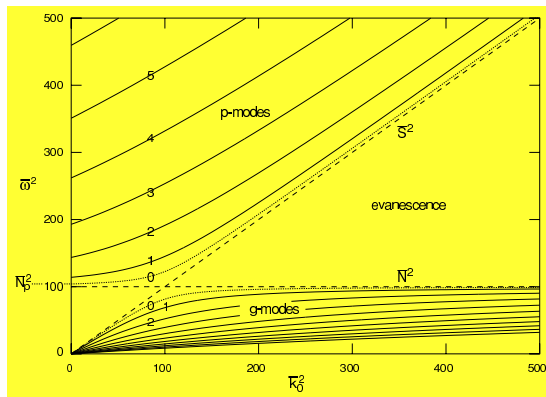
with solutions

$$\omega_{p,g}^2 = \frac{1}{2} k_{\text{eff}}^2 c^2 \left[1 \pm \sqrt{1 - \frac{4k^2 N^2}{k_{\text{eff}}^4 c^2}} \right], \quad k_{\text{eff}}^2 \equiv k^2 + q^2 + \frac{1}{4}\alpha^2$$

where k_{eff} is effective total ‘wave number’

- Branch with $+$ sign: *acoustic waves* or *p-modes*
- Branch with $-$ sign: *gravity waves* or *g-modes*

Dispersion diagram p- and g-modes



- Frequencies *p*-modes *increase* monotonically, cluster at ∞
- Frequencies *g*-modes *decrease* monotonically, cluster at 0

- thus far: general ODE, solved analytically for special case
 \Rightarrow when (numerical) solution strategy for governing ODE known, use special case to test/verify/quantify the errors!
- **Actual assignment:** consider simpler **incompressible limit**
 \Rightarrow formally move sound speed to infinity

$$c^2 \equiv \frac{\gamma p_0}{\rho_0} \rightarrow \infty$$

\Rightarrow incompressible modes $\nabla \cdot \xi = 0$, with $c^2 \nabla \cdot \xi$ finite!

- ODE for **waves in incompressible gravitating plasma slab**

$$\frac{d}{dx} \left[\rho_0 \omega^2 \frac{d\xi}{dx} \right] - k^2 \left[\rho_0 \omega^2 + \rho'_0 g \right] \xi = 0$$

\Rightarrow with BCs $\xi(0) = \xi(1) = 0$.

Assignment: summary

- ODE for **waves in incompressible gravitating slab**

$$\frac{d}{dx} \left[\rho_0 \omega^2 \frac{d\xi}{dx} \right] - k^2 \left[\rho_0 \omega^2 + \rho'_0 g \right] \xi = 0$$

\Rightarrow with BCs $\xi(0) = \xi(1) = 0$.

\Rightarrow analyse for linear density profile $\rho_0(x) = 1 + \sigma x$

\Rightarrow study waves $\omega^2 > 0$ or instabilities $\omega^2 < 0$ driven by gravity

\Rightarrow pressure profile no longer in wave description

- study modes for varying k^2, σ, g , i.e. solve for eigenmodes $\omega^2(k^2, \sigma, g)$, with corresponding eigenfunctions $\xi(x)$**

\Rightarrow interpret physically: **instabilities are known as**

Rayleigh-Taylor instabilities: heavy fluid atop a lighter one represents a gravitationally unstable situation!

- solve ODE numerically, set up a programme that would allow for easy generalization to different equilibrium density profiles

Assignment: extra input

- core problem: solve 2nd order ODE of generic form

$$\frac{d}{dx} \left[P(x; \omega^2) \frac{d\xi}{dx} \right] - Q(x; \omega^2) \xi = 0, \quad \xi(0) = \xi(1) = 0$$

⇒ appearance of squared quantity ω^2

⇒ rescaled problem, implicit choice units length, mass, time

⇒ corresponding rescaled function ξ

- introduce auxiliary variable $\psi \equiv P \frac{d\xi}{dx}$

⇒ alternative formulation as two 1st order ODEs

$$\begin{aligned} \frac{d\xi}{dx} &= \psi / P \\ \frac{d\psi}{dx} &= Q\xi \end{aligned}$$

⇒ turned BVP into IVP, can exploit **shooting method**

Shooting method

- system of 1st order ODEs for P non-zero on domain $[0, 1]$

$$\begin{aligned}\frac{d\xi}{dx} &= \psi/P \\ \frac{d\psi}{dx} &= Q\xi\end{aligned}$$

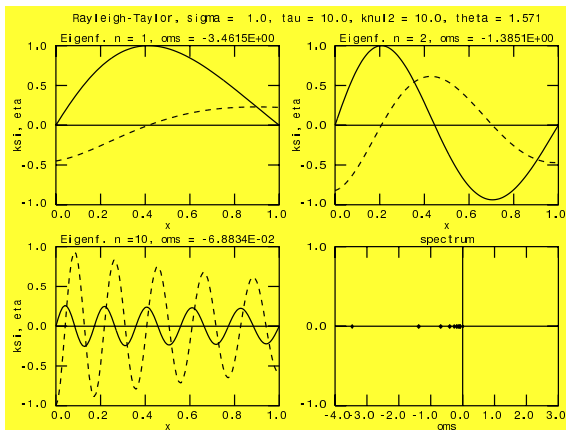
- take starting guess for ω^2 , insert it in $P(x; \omega^2)$ and $Q(x; \omega^2)$, integrate the ODE system (e.g. use Runge-Kutta) from $x = 0$ to $x = 1$, with initial values

$$\begin{aligned}\xi(0) &= 0 \\ \frac{d\xi}{dx}(0) &\equiv \psi(0)/P(0, \omega^2) = 1\end{aligned}$$

\Rightarrow solution $\xi(x)$ may not satisfy RHS BC $\xi(1) = 0$

\Rightarrow guess new value for ω^2 that 'brings us closer to' satisfying both BCs, repeat till RHS BC satisfied within prechosen accuracy

- how change ω^2 in iteration?
 - \Rightarrow rely on fact that the **number of zero values for $\xi(x)$ on $[0, 1]$ is monotonic in parameter ω^2** (oscillation theorem, known for MHD by Goedbloed & Sakanaka, 1974)
 - \Rightarrow **(in)stability**: start with large **(negative)** guess
 - \Rightarrow decreasing $|\omega^2|$ moves zeros into domain



Evaluation

- first assignment asks to implement your own solver.
⇒ Use language/software package you're most familiar with!
- **when using** `Maple`, `Matlab`, `Mathematica`, ..., it is likely you resort to pre-implemented library routines for solving ODE systems. That is fine, BUT we then expect a written account of the numerical methodology used in those, and also expect a somewhat deeper physical analysis, parameter study, result interpretation/presentation, ...
- **when use programming language** you already master (`Fortran`, `C`, ...), or learn now, we expect the emphasis on development/design of full code, input/output control and strategies, analysis of (preliminary) resulting data (basic plots for 1D functions, ...).

- **Both are ok**, in the spirit of this course we would recommend/prefer the second approach, but in any case will use the above distinction in evaluating. This assignment amounts to **8 out of the 20 points** of this course
 - ⇒ division 8/6/6 for 1st, 2nd assignment, oral
- **Hand-in on 14 november**
 - ⇒ **Required**: *short ≤ 5 page description* of approach and/or implementation, and result verifications and validation, error quantification (includes figures, reference list, ...).
 - ⇒ in addition to these 5 pages: *a full printout of actual code*
- use PC/laptop available to you, or ask use PCs at IvS/CmPA