

# Reminder: Advection

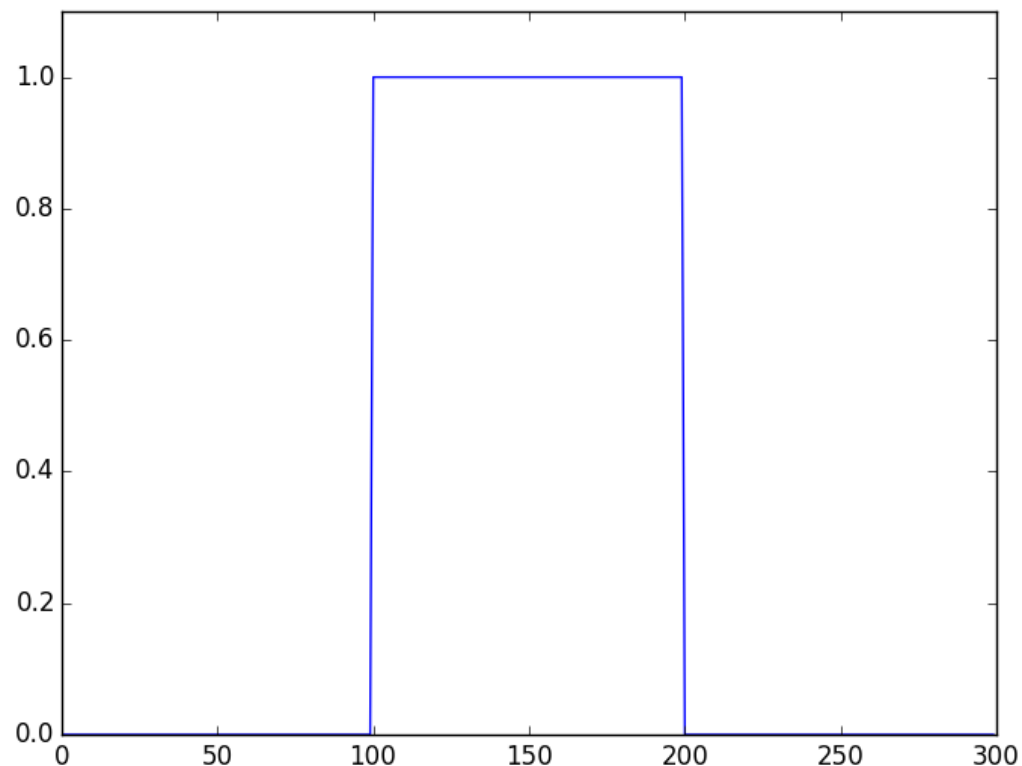
- Advection equation:  $\partial f / \partial t + u \partial f / \partial x = 0$
- Trial:  $f = f(ut - x)$ : then  $uf' + u(-f') = 0$ . check
- So, any function of  $(ut - x)$  will solve this equation.
- So, if we watch the spot in the function at  $x_0$  when  $t=0$ , then at time  $t$ , the position will be:  $ut - x = 0 - x_0$ , or  $x = x_0 + ut$ . Information moves with velocity  $u$ .

# Finite Volume Advection

```
#simple_advect_finite_volume.py
import numpy
from matplotlib import pyplot as plt
n=300
rho=numpy.zeros(n)
rho[n/3:(2*n/3)]=1
v=1.0
dx=1.0
x=numpy.arange(n)*dx

plt.ion()
plt.clf()
plt.plot(x,rho)
```

Left: set up initial conditions. Density is 1 in the middle third of region, zero otherwise. Below left: initial density plotted. Bottom: advection code.



```
dt=1.0
for step in range(0,50):
    #take the difference in densities
    drho=rho[1:]-rho[0:-1]
    #update density. We haven't said what happens at
    #cell 0 (since cell -1 doesn't exist), ignore for now
    rho[1:]=rho[1:]-v*dt/dx*drho
    plt.clf()
    plt.plot(x,rho)
    plt.draw()
```

# Reminder: Time Steps

- Smaller time step normally more accurate.
- Let's look at solution for some different time steps.
- What happened?
- Behaviour of sharp features often very important - in practice, run test problems with known solutions to verify behaviour.

```
#advect_finite_volume_timestep.py
dt=1.0
big_rho=numpy.zeros(n+1)
big_rho[1:]=rho
del rho #we can delete the to save space
oversamp=10 #let's do finer timestamps
dt_use=dt/oversamp
for step in range(0,150):

    big_rho[0]=0
    for substep in range(0,oversamp):
        drho=big_rho[1:]-big_rho[0:-1]
        big_rho[1:]=big_rho[1:]-v*dt_use/dx*drho

plt.clf()
plt.axis([0,n,0,1.1])
plt.plot(x,big_rho[1:])
plt.draw()
```

# Reminder: Stability

$$\rho_j^{\text{new}} = \rho_j - (\rho_j - \rho_{j-1})vdt/dx$$

- You can learn a lot by plugging in sine waves.
- If  $\rho_j = \exp(ikj)$ ,  $\rho_j^{\text{new}} = \text{what?}$  define  $a = vdt/dx$
- $\rho_j^{\text{new}} = \exp(ikj) - a(\exp(ikj) - \exp(ik(j-1))) = \exp(ikj) - a(\exp(ikj) - \exp(-ik)\exp(ikj))$
- $\rho_j^{\text{new}} = \exp(ikj) * [1 - a(1 - \exp(-ik))]$
- If quantity in  $[]$  gets bigger than unity, solution will grow with time. Our code would be *unstable* - this is bad!

# Reminder: CFL Condition ( $a=v\Delta t/\Delta x$ )

- Look at  $1-a(1-\exp(-ik\Delta x))$ .  $1-\exp(-ik\Delta x)$  is bounded by  $(0,2)$
- if  $0 \leq a \leq 1$ , solution always stable.
- if  $a > 2$ , then  $\lambda = 1-2a$  can have magnitude  $>1$  for sufficiently large  $a$ .
- By construction,  $a$  is positive, so can't get  $\lambda > 1$ . But can get  $\lambda < -1$ :  $1-2a < -1$ ,  $2 < 2a$ , or  $a > 1$ .
- For stability,  $a \leq 1$ , or  $\Delta t \leq \Delta x/v$ . In words,  $\Delta t$  has to be shorter than crossing time for cell.
- This is called the Courant–Friedrichs–Lewy (CFL) condition.  $v\Delta t/\Delta x$  is the Courant number.

# Numerical Viscosity/Lax

- We saw setting  $df/dx$  with  $(f_{x+1}-f_{x-1})/2dx$  led to unconditional instability in advection.
- However - take  $(f(x,t+dt)-f(x,t))/dt$  for time derivative to  $(f(x,t+dt)-(f(x+dx,t)+f(x-dx,t))/2)/dt$  leads to stability. Can you guess criterion for stability?
- Rewrite:  $(f(x,t+dt)-f(x,t))/dt = -v(f(x+dx,t)-f(x-dx,t))/2dx + (f(x+dx,t)-2f(x,t)+f(x-dx,t))/2dt$ .
- This is solving  $df/dt = -vdf/dx + (dx)^2/2dt \nabla^2 f$ . New term looks like diffusion/viscosity equations - we're adding numerical viscosity to induce stability.

# Conservation Equation

- If a quantity is conserved, time rate of change in a volume is equal to net flow into/out volume.
- If conserved quantity is  $\rho$  and velocity is  $u$  then flow out of region is  $\rho_+ u_+$  and flow in is  $\rho_- u_-$ . Net flux is then  $-\partial(\rho u)/\partial x$ .
- Equation then become  $\partial \rho / \partial t = - \partial(\rho u) / \partial x$ , or  $\partial \rho / \partial t + \partial(\rho u) / \partial x = 0$
- If a quantity is created, then we pick up extra term for rate of creation:
- now  $\partial \rho / \partial t = -\partial \rho / \partial x + q$ , where  $q$  is the creation rate.

# Euler Equations

- Now we're set to derive equations of fluid mechanics.
- The full fluid equations (Navier-Stokes) include forces from viscosity
- We will make approximation that viscosity is negligible
- Further, we will assume no energy flows between pieces of fluid (this is usually quite a good approximation)
- Leaves us with Euler equations. What equations should we have?



# Mass Conservation

- Generally, no matter is created/destroyed, so mass is strictly conserved.
- Mass conservation becomes  $\partial\rho/\partial t + \partial(u\rho)/\partial x = 0$
- Note that if you had source/sink of matter, it would appear as an extra term

# Momentum

- Momentum is  $\rho u$ . So conservation equation is  $\partial(\rho u)/\partial t + \partial(\rho u^2)/\partial x = 0$
- Velocity appears squared, so equation is nonlinear
- Fluid pressure will exert a force, so force term must be added.
- Force on right side of a packet is  $-P_+$ , force on left is  $+P_-$ , so total net force is difference, limit is  $-\partial P/\partial x$ . This force has to go into momentum equation.
- Momentum equation:  $\partial(\rho u)/\partial t + \partial(\rho u^2)/\partial x = -\partial P/\partial x$
- Conservation form: rewrite as  $p = \rho u$ , get  $\partial p/\partial t + \partial(pu + P)/\partial x = 0$

# Energy

- Two pieces of energy - internal thermal energy and bulk kinetic.
- Call total energy (thermal+kinetic) per unit mass  $E$ .
- Energy creation rate from pressure is power, or force \* velocity
- Gives  $\partial(\rho E)/\partial t + \partial(u\rho E)/\partial x = -\partial(uP)/\partial x$
- Rewrite into conservation form:  $\partial(\rho E)/\partial t + \partial(u\rho E + uP)/\partial x = 0$

# Euler So Far

- $\partial \rho / \partial t + \partial (u \rho) / \partial x = 0$     $\partial p / \partial t + \partial (p u + P) / \partial x = 0$     $\partial (\rho E) / \partial t + \partial (u \rho E + u P) / \partial x = 0$
- Three equations, how many unknowns? Solution needs velocity, density, energy, and pressure.
- So, need one more equation. Normally done by specifying a relation between pressure and energy. This is called an *equation of state*.
- Classic EoS is gamma law,  $P \sim \rho^\gamma$ . For ideal gas,  $e = 3/2 nkT$ , pressure is  $nKT$ , so  $P = 2/3 \rho e$  (where  $e = E - 1/2 \rho u^2$  is the thermal energy).

# Derivation of $\gamma$

- Let's compress a volume of gas and see how energy changes.
- $dE = -PdV$ .  $E = aPV$  (where  $a = 3/2$  for ideal gas)
- $a d(PV) = -PdV$ .  $aVdP + aPdV = -PdV$
- $dP(aV) = -dV(P(1+a))$ ,  $a dP/P = -(1+a)dV/V$ .
- $\log(P) \sim -(1+a)/a \log(V)$ .  $P \sim V^{-(1+a)/a}$ . Density  $\sim 1/V$ , so  $P \sim \rho^{1+1/a}$ . The index is usually called  $\gamma$  (gamma). For ideal gas,  $a$  is  $3/2$ , so  $\gamma = 1 + 2/3 = 5/3$ .

# Euler Equations with EoS

- We can now write down Euler equations in conservation form with EoS
- $E = 1/2 u^2 + e$ ,  $p e = P / (\gamma - 1)$ . So  $P = \rho (\gamma - 1) (E - 1/2 u^2)$
- $\partial Q / \partial t + \partial (f(Q)) / \partial x = 0$
- $Q = [\rho, \rho u, \rho E]$ ,  $f(Q) = [\rho u, \rho u^2 + P, \rho u E + u P]$
- using momentum  $p = \rho u$ :  $Q = [\rho, p, \rho E]$ ,  $f(Q) = [p, p u + P, p E + u P]$

# System of PDE's

- Let's take a system of 2 equations with constant coefficients:
- $\partial f / \partial t + c_{11} \partial f / \partial x + c_{12} \partial g / \partial x = 0$  and  $\partial g / \partial t + c_{21} \partial f / \partial x + c_{22} \partial g / \partial x = 0$
- Solution to 1-D advection was  $h(x-ut)$ , so let's guess solution is  $f = v_1 h(ut-x)$ ,  $g = v_2 h(ut-x)$
- Plug in: system is then  $uv_1 h' - c_{11} v_1 h' - c_{12} v_2 h' = 0$  and  $uv_2 h' - c_{21} v_1 h' - c_{22} v_2 h' = 0$
- $h'$  drops out, and we're left with system:  $uv = Cv$

# PDE Systems, Ctd:

- System  $u_t = Cv$  is just eigenvalue problem. Get a solution for each eigenvector/eigenvalue pair, where propagation speed is eigenvalue.
- When eigenvalues are real, system is called *hyperbolic*, solutions of form  $h(x-ut)$ . Information propagates at finite speed.
- When eigenvalues are imaginary, system is *elliptical*, solutions of form  $h(x-iut)$ . You might expect treatment in numerical solvers to be different.
- Do you think fluid equations should be elliptical or hyperbolic?



# CFL Condition Revisited

- Euler equations give us a system of 3 coupled equations.
- This means 3 eigenvalues. For CFL condition, want time step stable for largest velocity eigenvalue.
- What do you think the three eigenvalues are? You should be able to guess from physical intuition. (recall that the speed of sound  $c_s^2 = \gamma P / \rho$ )

# Aside: Stiff Equations

- We get one eigenvalue for fluid velocity, and 2 for velocity  $\pm$  speed of sound.
- If  $c_s \gg u$ , then CFL means timestep has to be tiny compared to natural one from fluid velocity. When eigenvalues diverge like this, equations are called *stiff*. Different computational techniques required.
- Incompressible fluid mechanics - limit where  $c_s \gg u$ . Fluid has time to move out of the way. Otherwise it would compress.
- Techniques to solve stiff equations are different. If you hit a stiff set, look them up. Always check if your system is stiff!

# Structure of a Simple 1-D Fluid Code

- First, do boundary conditions
- If we use density, momentum, total energy as variables (the conservation quantities) then need to calculate velocity
- Now need to calculate pressure
- Next calculate gradients - we use upwind 1<sup>st</sup> order scheme, where I flow with my velocity
- Calculate CFL timestep
- Finally, update density, momentum, Energy

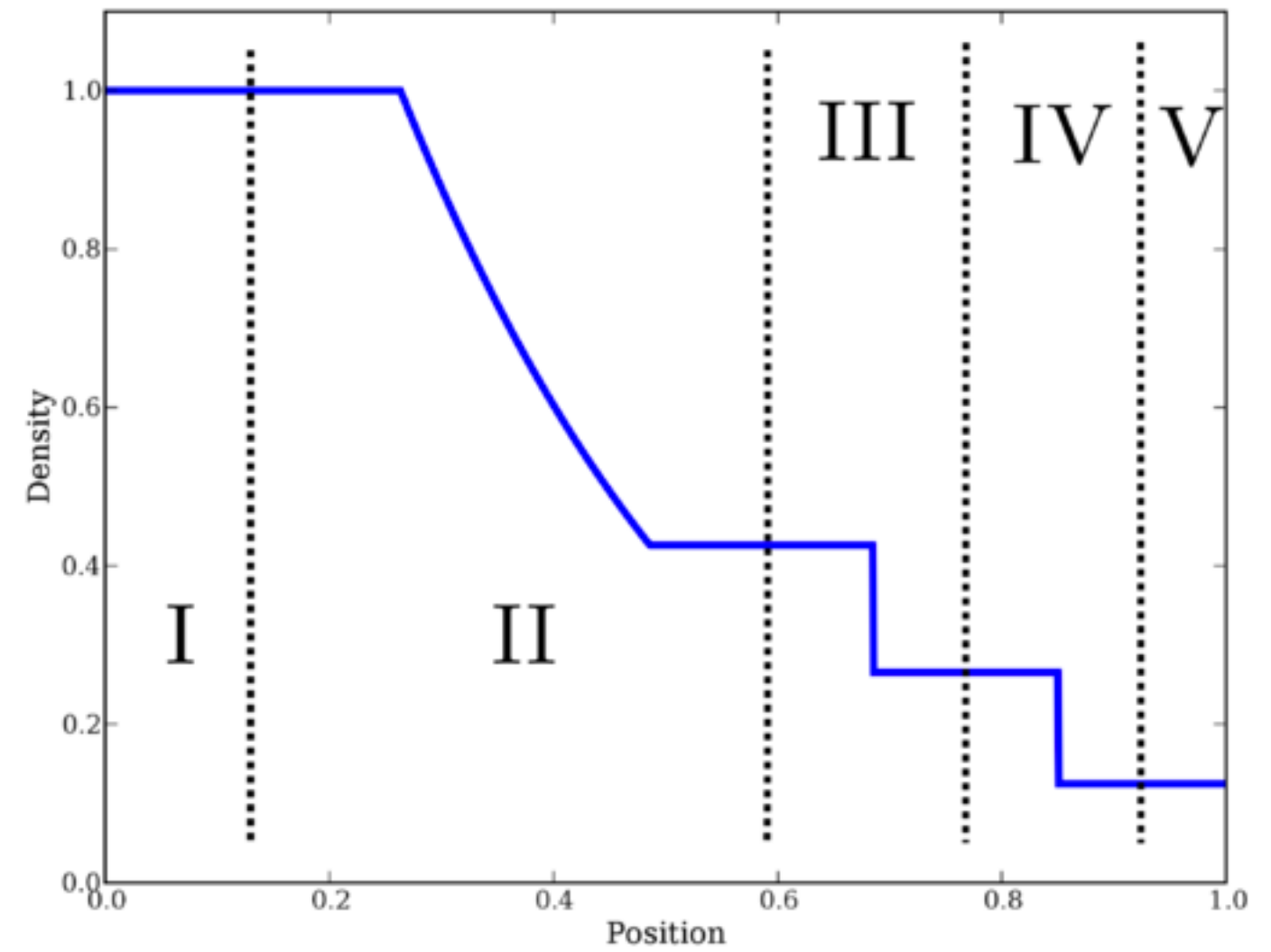
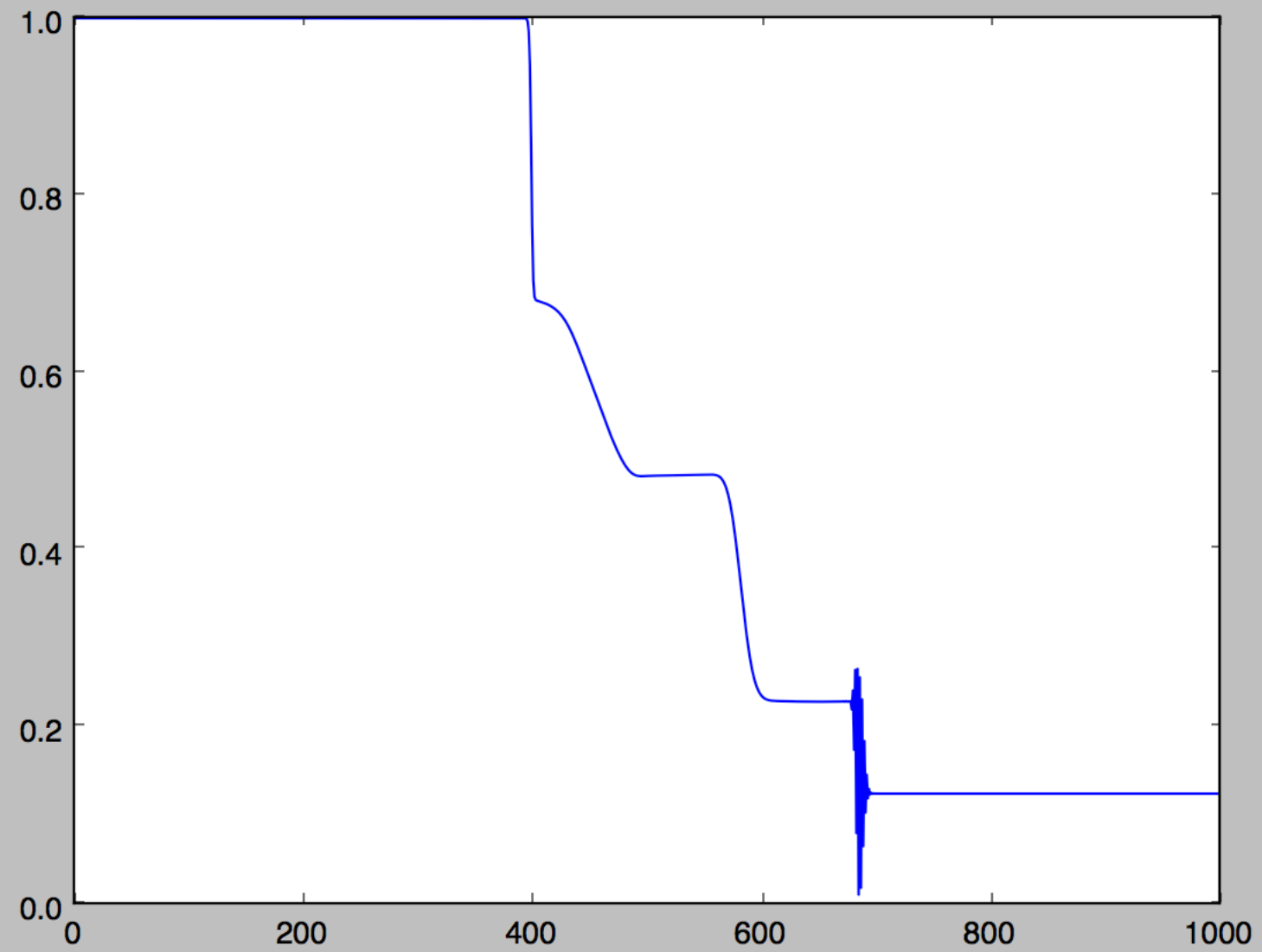
# Primitive Equations

- Assuming  $P \propto \rho^\gamma$ , we can rewrite the Euler equations in *primitive* form.  
After math, we get:
- $\rho_t + u\rho_x + \rho u_x = 0$  where e.g.  $\rho_t = \partial\rho/\partial t$
- $u_t + uu_x + 1/\rho P_x = 0$
- $P_t + uP_x + \gamma Pu_x = 0$

# Shock Tube

- Classic testing problem is a shock tube: start with a density/pressure jump in the middle, with velocity=0.
- What should this look like? let's run `hydro1d.py`
- What answer *\*should\** look like from wikipedia:

# Shock Tube



# Riemann problem/Godunov Solver

- If we're facing solving  $u_t + Au_x = 0$ , we rotate into the eigenspace of  $A$ . This gives us uncoupled equations that look like advection (when looking at short enough time).
- Finite volume can be mapped into Riemann problem - you have a discontinuity between cells. Know how to propagate eigenmodes
- Godunov solvers do this - evolve solution by solving Riemann problem.
- First order accurate, but can be built into more accurate solution.