



# Particle-in-cell simulations for pedestrians

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# Introduction



Relevant scales in space: gyration

$$\Omega_L = \frac{eB}{mc} = (20 \text{ Hz}) B_{\mu G} \frac{m_e}{m_x}$$

$$r_L = \frac{v}{\Omega_L} = (10^9 \text{ cm}) \frac{p_x}{m_e c B_{\mu G}}$$



# Introduction



Relevant scales in space: plasma oscillations

$$\omega_p = (60 \text{ kHz}) \sqrt{n_e \frac{m_e}{m_x}}$$

$$\lambda_s = \frac{c}{\omega_p} = 5 \text{ km}$$



# Introduction



**Compare Coulomb scattering frequency  
and plasma frequency**

- collective plasma interactions dominate in space**
- we do not a priori know the distribution function**



# Introduction



**How to describe matter in space?**

**Always: Maxwell's equation**

**Hydrodynamics needs knowledge of the EoS**

**Kinetic model solves for distribution function**



# Introduction



**Kinetic descriptions:**

**Boltzmann equation**

$$f_c = \frac{\partial f}{\partial t} + \dot{\vec{x}} \frac{\partial f}{\partial \vec{x}} + \dot{\vec{p}} \frac{\partial f}{\partial \vec{p}}$$

**Solve equation of motion of many particles**

**→ Particle-in-cell simulations**



# Particle-in-cell



**Solve equation of motion for each particle**

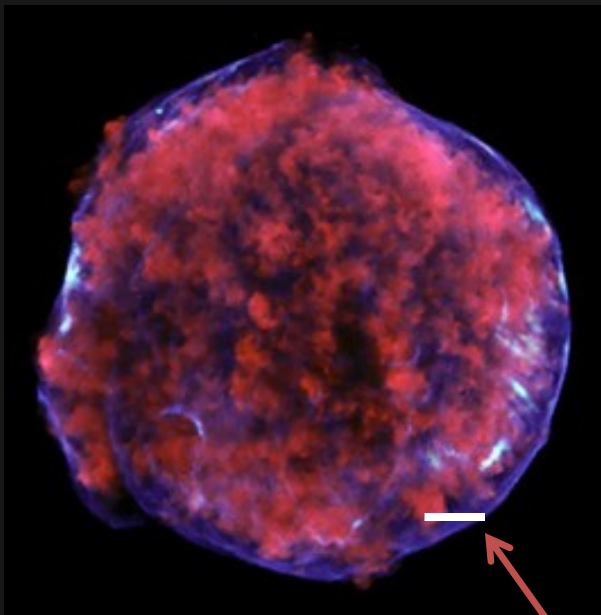
**Derive the distribution function**  $f = \sum \delta(x - x_i) \delta(p - p_i)$

**Solve Maxwell's equations on a grid**

**Interpolate information between grid points and particles**

# The challenge

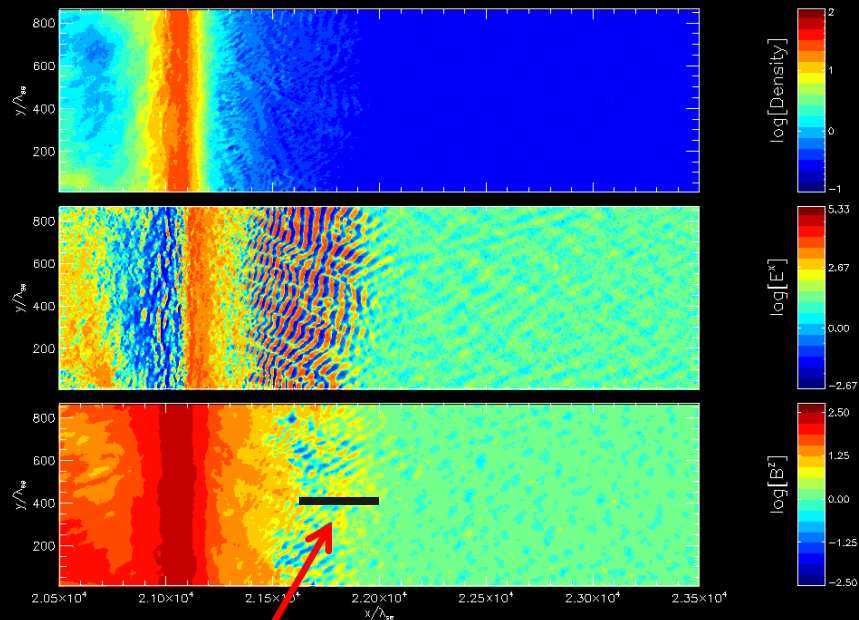
Supernova remnant



1 light-year

Simulated shock

$t = 2531.6 \omega_{pe}^{-1}$



1 light-millisecond





# The challenge



**We use fluid methods for gas on large scales**

**We use kinetic methods for gas on very small scales**

**We always use kinetic methods fo energetic particles**



# The challenge



**PIC simulations must resolve the electron skin length**

- **Can model shocks and plasma instabilities**
- **but not the big picture**

**Grid scale  $\Delta \ll \lambda_s \rightarrow$  Need length exceeding  $10^4 \Delta$  per direction**

**Suppose 100 particles per cell  $\rightarrow$  at least  $10^{10}$  particles in 2D**

**$\rightarrow$  At least TB-scale RAM needed  $\rightarrow$  massive parallelization**



# The How-to



Start with a solution to Maxwell's equation

→ You only need to update the fields

$$\delta B \propto \nabla \times E + j \quad \Rightarrow \quad \nabla \delta B = \nabla j = \frac{\partial n_e}{\partial t} = \nabla \frac{\partial E}{\partial t} = 0$$

Keeping all particles and having number continuity implies we only solve time-derivative equations.



# The How-to



Field update  $\delta E = \delta t \nabla \times B$

How to solve this equation?

Explicitly using a staggered grid

B and E displaced by a half timestep

B and E also spatially displaced by half a grid cell



# The How-to



Consider  $\frac{\partial X}{\partial t} = Y(t)$  and solve for discrete  $t_i$

Taylor-expand  $Y(t)$  around  $t_{i+0.5}$  and integrate.

$$X(i + 1) = X(i) + \delta t Y(i + 0.5) + \mathcal{O}(\delta t^2)$$

Automatically second-order accurate.

Implicit methods are better, but much more expensive.



# The How-to



Consider  $\frac{\partial}{\partial x} X(x, t) = \frac{\partial}{\partial t} Y(x, t)$  and solve for discrete  $x_i$

and assume  $X, Y \propto \exp(ikx - i\omega t)$

You find

$$\frac{\tilde{X}}{\Delta} \sin\left(\frac{k\Delta}{2}\right) = -\frac{\tilde{Y}}{\delta t} \sin\left(\frac{\omega\delta t}{2}\right)$$



# The How-to



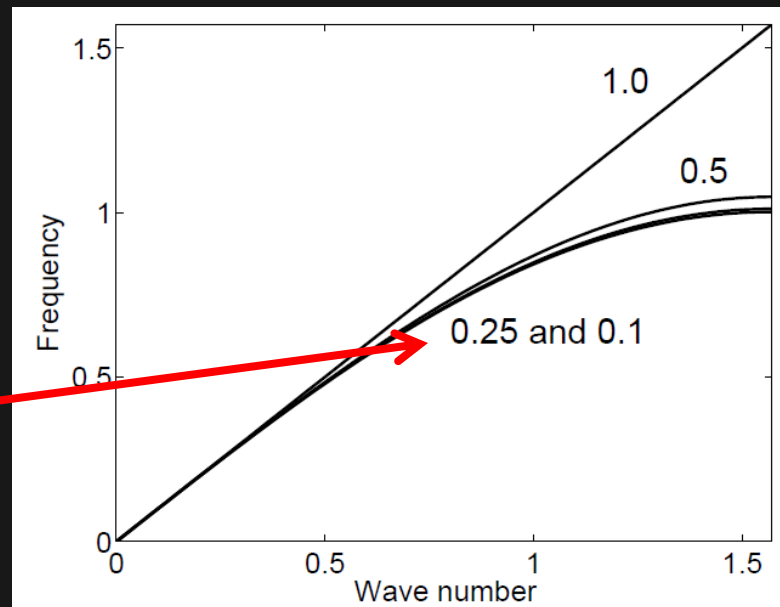
Application to electromagnetic waves

Dispersion relation in vacuum

Phase speed below  $c$  

CFL Parameter  $\frac{c \delta t}{\Delta}$

**Grid Cherenkov instability**





# The How-to



**We use a finite number of particles per cell**

- **Residual collisions**
- **Spurious heating**
- **Missing resonances**

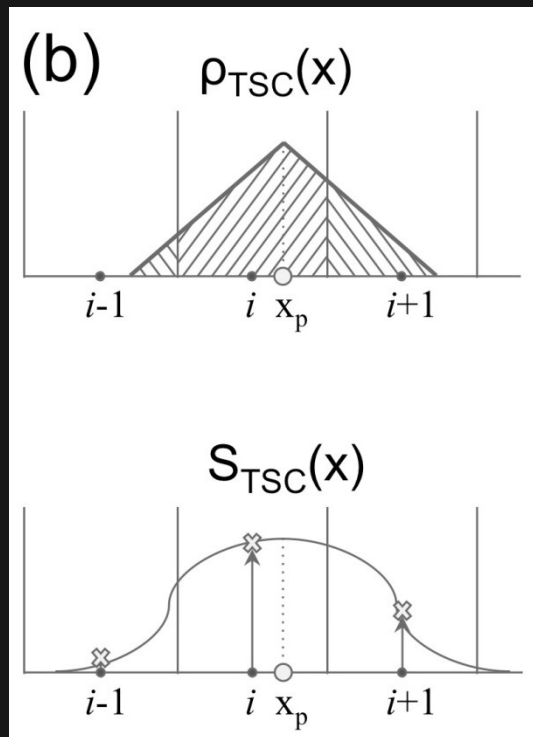


# Residual collisions

If particles were point-like  
→ electrostatic potential  $\sim 1/r$

Treat particles as extended structures

- Suppresses binary collisions
- Provides interpolation to grid





# Residual collisions



Scattering involves fluctuations in the density of particles,  $n$

Consider a box of size  $R$  at distance  $R$  left and right of trajectory

Deflection by density fluctuation  $\sqrt{nR^3}$

Mean free path for scattering  $\lambda \propto n$

Optimization needed between low collisionality and expense



# Residual collisions



Electric field fluctuations over shape size,  $R$

$$E \propto \frac{q\sqrt{nR^3}}{R^2} \propto \frac{1}{\sqrt{nR}}$$

Equipartition of field noise with temperature

$$U_{ES} \propto \frac{1}{nR} \propto kT$$

Cold plasma requires many simulated particles



# Missing resonances



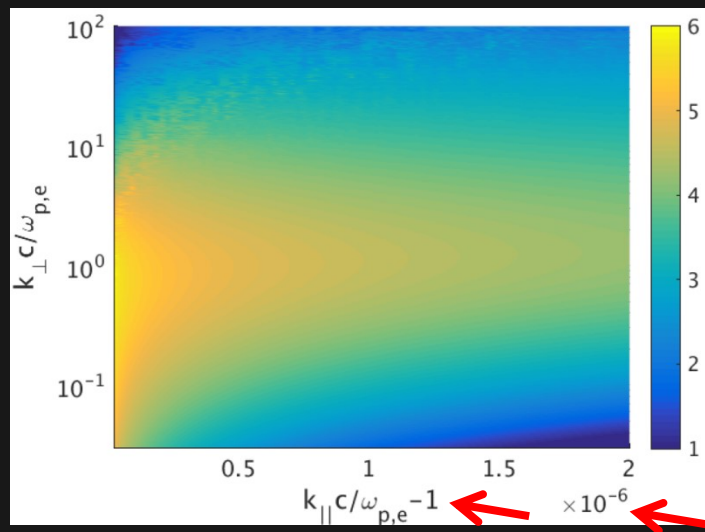
Plasma instabilities may involve narrow resonances

TeV pair beams in  
intergalactic space

Longitudinal electrostatic mode

Velocity resonance

Growth rate real parameters





# Missing resonances



- We must have particles in the resonance band → large  $n$
- Our grid must carry the frequency/wavenumber

Grid of  $N$  cells of size  $\Delta$

→  $\delta k = 2\pi/N\Delta$  must be smaller than  $\Delta k$  of resonance  
AND resonance must be covered by the grid,  $\delta k/k > 2/N$

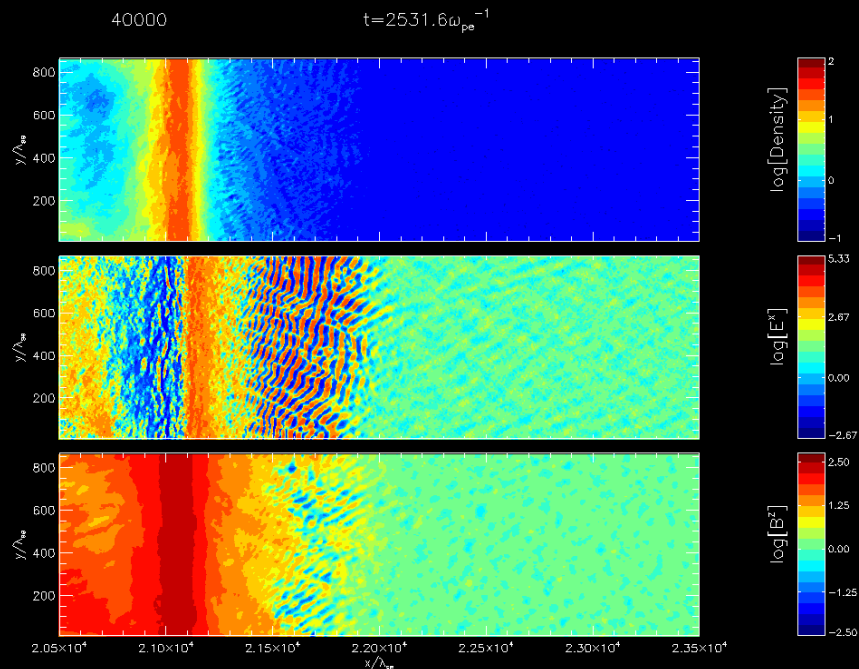
**Lower and upper limit on  $\delta k$ !**

# The How-to: scales

Collisionless shock:  
Thickness given by ion gyration

$$L = \frac{v_{sh}}{\Omega_i} = \frac{c v_{sh}}{v_A \omega_{pi}} = M_A \lambda_s \sqrt{\frac{m_i}{m_e}}$$

Too many grid cells?  
-> Reduce mass ratio  
and resolution





# Summary



**PIC simulations are an ab-initio tool to study kinetic processes**

**Particularly useful for collisionless media in space**

**Besides the Vlasov equation the only means to obtain the distribution function**

**Limited range of scales even for modified parameters (e.g. mass ratio)**

**Technically and computationally very demanding**