### Integer Lattice for Vlasov–Poisson (Mocz & Succi, 2016)

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- Vlasov–Poisson equations
- Integer Lattice
- Other methods for VP: particle-mesh, finite volume, moving mesh, Schrödinger
- Test Problems (Jeans instability, Landau damping)
- Memory Saving  $(N^6 \rightarrow N^4)$
- Extensions (weakly-collisional, Vlasov-Maxwell, ...)

#### Vlasov-Poisson



The dynamics of a collisionless, self-gravitating fluid is described by the evolution of the 6D distribution function  $f(\mathbf{r}, \mathbf{v}, t)$ :

$$\frac{\partial f}{\partial t} + \mathbf{v} \cdot \nabla f - \nabla \Phi \cdot \frac{\partial f}{\partial \mathbf{v}} = 0 \quad (1)$$

#### Physical density:

$$\rho(\mathbf{r},t) = \int (\mathbf{r},\mathbf{v},t) d^3 \mathbf{v} \quad (2)$$

Poisson's equation:

$$\nabla^2 \Phi = 4\pi G\rho \tag{3}$$

- a statement of conservation of phase-space density
- *f* constant along the trajectories of the system (Liouville's theorem)
- describes systems such as Cold Dark Matter (CDM)

# Fine-grained phase-space structure



#### 4D CDM phase-space

(Sousbi & Colombi, 2015)

- understanding velocity field very important for modern cosmology
- structure formation
- modelling redshift-space distortions
- interpreting measurements of kinetic Sunyaev-Zeldovich effect
- ► shell-crossing
- N-body simulations only sample at a set of discrete locations, poor resolution in low-density regions

## Designing Numerical Methods: Motivation

It is important to preserve physical symmetries and invariants at the discretized level





4<sup>th</sup>-order Runge-Kutta

2<sup>nd</sup>-order Leapfrog

### Poincaré recurrence theorem



 systems will, after a sufficiently long but finite time, return to the initial state

### Integer Lattice Algorithm I

- define f on lattice sites (x, v)
- very simple, seemingly strange evolution equations:

$$v \leftarrow v + \lfloor \Delta ta \rceil \tag{4}$$
$$x \leftarrow v + \lfloor \Delta tv \rceil \tag{5}$$

• (units are 
$$\Delta x = \Delta v = 1$$
)

- ▶ round-to-nearest-int operator [·] restricts motion to the lattice
- ► acceleration *a* is obtained from a Poisson solver
- based on idea by (Syer & Tremaine 1995) which used an integer lattice to search for equilibria solutions

#### Integer Lattice Algorithm II



# A bunch of rocks



- each step is a simple permutation of lattice sites!
- no roundoff error!
- reversible
- conservative
- Lagrangian
- discrete system has a Hamiltonian, approaches continuous system in the limit of increased resolution
- all orbits are periodic
- analogy to chaos is long-period orbits

# Other Methods: N-body Particle-Mesh (PM)



- ► *N* particles
- 2<sup>nd</sup>-order symplectic leap-frog scheme ('kick'-'drift'-'kick')
- cloud-in-cell (CIC) binning

$$v \leftarrow v + 0.5\Delta ta \tag{6}$$

$$x \leftarrow x + \Delta t v \tag{7}$$

$$v \leftarrow v + 0.5\Delta ta \tag{8}$$

### Other Methods: Finite Volume (FV)



- standard FV for collisionless Boltzmann equations (Yoshikawa, Yoshida, Umemura, 2013)
- 6D, conservative, diffusive, Eulerian

$$v \leftarrow v - 0.5 \frac{\Delta t}{\Delta v} \sum_{n \in \text{neighbours}} \mathcal{F}_{v,n} \qquad (9)$$
$$x \leftarrow x - \frac{\Delta t}{\Delta x} \sum_{n \in \text{neighbours}} \mathcal{F}_{x,n} \qquad (10)$$

$$v \leftarrow v - 0.5 \frac{\Delta t}{\Delta v} \sum_{n \in \text{neighbours}} \mathcal{F}_{v,n}$$
 (11)

# Other Methods: Finite Volume Moving Mesh (MM)



X

- Shear cells by their velocity
- reduces numerical diffusion, makes the scheme Galilean-invariant
- improves timestep condition

$$\Delta t = C \cdot \min\left(\frac{\Delta x}{v_{\max}}, \frac{\Delta v}{a_{\max}}\right)$$
(12)  
$$\Delta t = C \cdot \min\left(\frac{\Delta x}{\Delta v}, \frac{\Delta v}{a_{\max}}\right)$$
(13)

#### Other Methods: Schrödinger limit $\hbar \rightarrow 0$

Approximate 6D phase-space with 3D wave-function.
 Below are some of my simulations for axion dark matter



ΛCDM

2.5e-21 eV

2.5e-22 eV

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#### Jeans Instability Test



- Gaussian-like profile in velocity direction
- seed Jeans unstable large-scale mode
- gravitational collapse

#### Jeans Instability Comparison



#### Lattice-noise vs Monte-Carlo vs Diffusion

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integer lattice

# Landau Damping Test



- Gaussian IC close to smooth equilibrium
- will wind up, evolve thin spiral arms
- complex structure approximates smooth equilibrium but never reaches it

# Landau Damping Comparison



#### Lattice-noise vs Monte-Carlo vs Diffusion

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- ► IL recovers fine phase-space features. Lattice-noise
- PM has Monte-Carlo noise
- ► FV, MM has diffusion (erases phase-space structure)
- MM less diffusive than FV

#### Galileanmethod conservative? reversible? invariant? IL PM × FV × × MM $\checkmark$ Х

method	error	computing time for Jeans test [s]
IL	'lattice noise'	3
PM	Monte-Carlo	10
FV	2 <sup>nd</sup> -order (diffusive)	800
MM	2 <sup>nd</sup> -order (diffusive)	1000

method	resolution	computational $cost [\mathcal{O}(\cdot)]$	memory scaling
IL	$N_x^3 N_v^3$	$\begin{array}{c} N_t N_x^3 N_v^3 \\ N_t^2 N_x^3 N_v^3  * \end{array}$	$\frac{N_x^3 N_v^3}{N_t N_x^3 *}$
PM	N	$N_t N$	N
FV	$N_x^3 N_v^3$	$N_t N_x^3 N_v^3$	$N_x^3 N_v^3$
MM	$N_x^3 N_v^3$	$N_t N_x^3 N_v^3$	$N_x^3 N_v^3$

\* memory efficient version

- assume  $N_x \sim N_v \sim N_t :\sim N$
- ▶ 6D phase-space solvers are memory limited ( $\mathcal{O}(N^6)$ )
- But IL is *exactly* reversible
- suffices to store N<sup>3</sup> accelerations at each timestep and 'recover' the distribution function
- memory scaling is now  $\mathcal{O}(N^4)$ . (Computation increases by factor of N but that's OK!)

#### Extension to collisions (add BGK source term)

#### Strongly collisional shock Weakly collisional shock









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# Weakly collisional fluid dynamics

- galaxy moving through intracluster medium experiences drag force. Gas is stripped
- ► Ram-pressure stripping is always solved in the fluid regime.  $P = \frac{1}{2}\rho v^2$
- But it is actually weakly-collisional!
- $\blacktriangleright \lambda_{\rm mfp} \sim L_{\rm galaxy}$



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# Extension to plasma: Two-Stream Instability



x-v plane

- Vlasov-Maxwell equations (collisionless)
- two beams in opposite directions develop instability
- alternative to particle-incell (PIC)

- Integer lattice is a very simple, powerful tool to study the dynamics of Vlasov–Poisson systems (e.g. CDM)
- numerical method has many good and unique theoretical properties (such as reversibility and no roundoff errors)
- memory-efficient implementation overcomes memory limitations of phase-space methods