Alexander Knebe (Universidad Autonoma de Madrid)



- introduction
- Boltzmann solver
- initial conditions generators
- simulation codes

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## Computational Cosmology



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- introduction
- Boltzmann solver
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- simulation codes



Planck 2015 data vs. Boltzmann solver results for  $\Lambda CDM$ 

Ade et al. (arXiv:1502.01598)

particle species...



• ...in kinetic equilibrium

$$f(\vec{p}) = \frac{1}{e^{(E-\mu)/k_B T} \pm 1}$$

relativistic:

non-relativistic:

$$f(\vec{p}) \approx e^{-(p^2/2m-\mu)/k_BT}$$

particle species...



- Boltzmann equation  $\hat{L}[f_A] = \hat{C}_A[f]$ 
  - $\hat{L}$  : Liouville operator
  - $f_A$ : phase-space distribution function of species A
  - $\hat{C}_{A}$ : collision operator for species A
  - f : phase-space distribution function of all species partaking in collisions

Boltzmann equation  $\hat{L}[f_A] = \hat{C}_A[f]$ 

- $\hat{L}$  : Liouville operator
  - in non-relativistic limit it is just the total time derivative:

$$\hat{L}_{nr} = \frac{\partial}{\partial t} + \frac{p}{m} \cdot \nabla_x + \frac{F}{m} \cdot \nabla_p$$

- in the absence of collisions particles move on geodesics
- for homogeneous & isotropic FRW model f=f(p) and hence\*

$$\hat{L}[f_A] = \frac{dn_A}{dt} + 3Hn_A \quad \text{with} \quad n_A = \frac{g_A}{2\pi^2} \int p^2 f_A(p) dp$$

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• integro-differential equation for f(p)• ordinary differential equation for  $n_A(t)$  Boltzmann equation  $\hat{L}[f_A] = \hat{C}_A[f]$ 

 $\hat{C}_{A}$ : collision operator for species A

• change in number of particles A due to interactions<sup>\*</sup>  $A+B \leftrightarrow C$ 

$$C_A = -\left\langle \sigma_{AB} v_{AB} \right\rangle n_A n_B + \beta n_C$$

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particle destruction & creation

• Boltzmann equation  $\hat{L}[f_A] = \hat{C}_A[f]$ 

 $\hat{C}_{A}$ : collision operator for species A

- change in number of particles A due to interactions  $\ A+B \leftrightarrow C$ 

$$C_{A} = -\left\langle \sigma_{AB} v_{AB} \right\rangle n_{A} n_{B} + \beta n_{C}$$
  
in equilibrium: particle destruction = creation  $\Rightarrow \beta = \frac{n_{A}^{(eq)} n_{B}^{(eq)}}{n_{C}^{(eq)}} \left\langle \sigma_{AB} v_{AB} \right\rangle$ 

$$\frac{dn_A}{dt} + 3Hn_A = -n_A^{(eq)} n_B^{(eq)} \left\langle \sigma_{AB} v_{AB} \right\rangle \left( \frac{n_A n_B}{n_A^{(eq)} n_B^{(eq)}} - \frac{n_C}{n_C^{(eq)}} \right)$$

$$\frac{dn_A}{dt} + 3Hn_A = -n_A^{(eq)} n_B^{(eq)} \left\langle \sigma_{AB} v_{AB} \right\rangle \left( \frac{n_A n_B}{n_A^{(eq)} n_B^{(eq)}} - \frac{n_C}{n_C^{(eq)}} \right)$$

• particles in final state C are in equilibrium (i.e.  $n_C = n_C^{(eq)}$ ):

$$\frac{dn_A}{dt} + 3Hn_A = \left\langle \sigma_{AB} v_{AB} \right\rangle \left( n_A^{(eq)} n_B^{(eq)} - n_A n_B \right)$$

$$\frac{dn_A}{dt} + 3Hn_A = -n_A^{(eq)} n_B^{(eq)} \left\langle \sigma_{AB} v_{AB} \right\rangle \left( \frac{n_A n_B}{n_A^{(eq)} n_B^{(eq)}} - \frac{n_C}{n_C^{(eq)}} \right)$$

particles in final state C are in equilibrium:

$$\frac{dn_A}{dt} + 3Hn_A = \left\langle \sigma_{AB} v_{AB} \right\rangle \left( n_A^{(eq)} n_B^{(eq)} - n_A n_B \right)$$

ordinary differential equation for  $n_A$ 

$$\frac{dn_A}{dt} + 3Hn_A = -n_A^{(eq)} n_B^{(eq)} \left\langle \sigma_{AB} v_{AB} \right\rangle \left( \frac{n_A n_B}{n_A^{(eq)} n_B^{(eq)}} - \frac{n_C}{n_C^{(eq)}} \right)$$

particles in final state C are in equilibrium:

$$\frac{dn_A}{dt} + 3Hn_A = \left\langle \sigma_{AB} v_{AB} \right\rangle \left( n_A^{(eq)} n_B^{(eq)} - n_A n_B \right)$$

ordinary differential equation for  $n_A^*$ 

\*we need to write down such an equation for each species... (and will eventually only consider perturbations) set of equations for photons and baryons:\*

$$\begin{split} \delta'_{b} &= -\theta_{b} - \frac{1}{2}h' \\ \delta'_{\gamma} &= -\frac{4}{3}\theta_{\gamma} - \frac{2}{3}h' \\ \theta'_{b} &= -\frac{1}{1+R} \bigg( aH\theta_{b} - c_{s}^{2}k^{2}\delta_{b} - k^{2}R\bigg(\frac{1}{4}\delta_{\gamma} - \sigma_{\gamma}^{TCA}\bigg) + R\Theta_{\gamma b}'^{TCA} \bigg) \\ \theta'_{\gamma} &= -\frac{1}{R} \left( aH\theta_{b} + \theta'_{b} - c_{s}^{2}k^{2}\delta_{b} \right) + k^{2}\bigg(\frac{1}{4}\delta_{\gamma} - \sigma_{\gamma}^{TCA}\bigg) \\ \delta_{\gamma} : \qquad \text{photon perturbations (Fourier transform of $\Delta T/T$)} \end{split}$$

 $\delta_b$ : baryon perturbations

1

$$\begin{split} \Theta_{\gamma b} &= \delta_{\gamma} - \delta_{b} \\ \Theta'_{\gamma b} \triangleq \text{`baryon-photon slip'} \\ \sigma_{\gamma} &: \text{photon shear} \end{split}$$

\*Blas, Lesgourges & Tram (arXiv:1104.2933), derivatives ' with respects to conformal time

• set of equations for photons and baryons and dark matter and massless neutrinos:

$$\begin{split} \dot{\Theta} + ik\mu\Theta &= -\dot{\Phi} - ik\mu\Psi - \dot{\tau} \left[ \Theta_0 - \Theta + \mu v_b - \frac{1}{2} P_2(\mu) \Pi \right] \\ \dot{\Theta}_p + ik\mu\Theta_p &= -\dot{\tau} \left[ \Theta_p + \frac{1}{2} (1 - P_2(\mu)) \Pi \right] \\ \dot{\delta} + ikv = -3\dot{\Phi} \\ \dot{v} + \frac{\dot{a}}{a} v = -ik\Psi \\ \dot{\delta}_b + ikv_b &= -3\dot{\Phi} \\ \dot{v}_b + \frac{\dot{a}}{a} v_b &= -ik\Psi + \frac{3\dot{\tau}}{4\eta} \left[ v_b + 3i\Theta_1 \right] \\ \dot{v} + ik\muv = -\dot{\Phi} - ik\mu\Psi \\ \end{split}$$

- $\Theta$ : photon perturbations (Fourier transform of  $\Delta T/T$ )
- : neutrino perturbations
- $\delta$ , v: dark matter perturbations
- $\delta_{\rm b},\,{\rm v}_{\rm b}$ : baryon perturbations
- $\Psi$ : metric perturbations
- Φ: Newtonian perturbations
- $\tau$ : optical depth ( $\dot{\tau} = -n_e \sigma_T a$ )
- $\mu$ : direction of photon propagation
- $\gamma$ : conformal time
- P(): Legendre polynomial
- $\Pi: \qquad \Theta_2 + \Theta_{P2} + \Theta_{P0}$

set of equations for photons and baryons and dark matter and massless neutrinos:

$$\begin{split} \dot{\Theta} + ik\mu\Theta &= -\dot{\Phi} - ik\mu\Psi - \dot{\tau} \left[\Theta_0 - \Theta + \mu v_b - \frac{1}{2}P_2(\mu)\Pi\right] \\ \dot{\Theta}_p + ik\mu\Theta_p &= -\dot{\tau} \left[\Theta_p + \frac{1}{2}(1 - P_2(\mu))\Pi\right] \\ \dot{\delta} + ikv &= -3\dot{\Phi} \\ \dot{v} + \frac{\dot{a}}{a}v &= -ik\Psi \\ \dot{\delta}_b + ikv_b &= -3\dot{\Phi} \\ \dot{v}_b + \frac{\dot{a}}{a}v_b &= -ik\Psi + \frac{3\dot{\tau}}{4\eta} \left[v_b + 3i\Theta_1\right] \\ \dot{v} + ik\muv &= -\dot{\Phi} - ik\mu\Psi \end{split}$$

- solving cosmological Boltzmann equations
  - Peebles & Yu (1970): TCA method (Tight-Coupling-Approximation\*)

prior to recombination photons, electrons, and nuclei rapidly scattered and behaved almost like a single tightly-coupled photon-baryon plasma:  $v_b = v_{\gamma}$ 

• ...all subsequent solvers are based upon it.

solving cosmological Boltzmann equations gives CMB fluctuations



solving cosmological Boltzmann equations gives CMB & matter fluctuations





solving cosmological Boltzmann equations gives CMB & matter fluctuations



• transfer function T(k)

 $P(k,a) = D^{2}(a) T^{2}(k) P_{0}(k)$
$P(k,a) = D^{2}(a) T^{2}(k) P_{0}(k)$ 

clear separation into

- temporal evolution after decoupling
- pre-decoupling physics





- temporal evolution after decoupling
- pre-decoupling physics

 $P(k,a) = D^{2}(a) T^{2}(k) P_{0}(k)$ 



 $P(k,a) = D^{2}(a) T^{2}(k) P_{0}(k)$ 

$$\delta \propto a^2$$
  $k << k_{eq}$  (outside horizon)  
 $\delta \propto \ln(a)$   $k >> k_{eq}$  (inside horizon)

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 $P(k,a) = D^{2}(a) T^{2}(k) P_{0}(k)$ 



 $P(k,a) = D^{2}(a) T^{2}(k) P_{0}(k)$ 



$$P(k,a) = D^{2}(a) T^{2}(k) P_{0}(k)$$

radiation domination:

 $T(k) \propto 1 \qquad k << k_{eq}$  $T(k) \propto 1/k^2 \qquad k >> k_{eq}$ 

matter domination:

$$\delta \propto a \implies T(k) \propto 1$$

$$P(k,a) = D^{2}(a) T^{2}(k) P_{0}(k)$$

post-decoupling (CDM only): (Bond & Efstatiou 1984)

$$T(k) = \left(1 + \left((ak) + (bk)^{1.5} + (ck)^2\right)^{\nu}\right)^{-1/\nu}$$

$$a = 6.4 \ (\Omega_{\rm m}h^{-2}) \ {\rm Mpc}$$
  
 $b = 3.0 \ (\Omega_{\rm m}h^{-2}) \ {\rm Mpc}$   
 $c = 1.7 \ (\Omega_{\rm m}h^{-2}) \ {\rm Mpc}$   
 $v = 1.13$ 

$$P(k,a) = D^{2}(a) T^{2}(k) P_{0}(k)$$

• post-decoupling (CDM+baryons): (Eisenstein & Hu 1998)

$$T(k) = \frac{\Omega_b}{\Omega_m} T_b(k) + \frac{\Omega_c}{\Omega_m} T_c(k)$$

 $P(k,a) = D^{2}(a) T^{2}(k) P_{0}(k)$ 

post-decoupling (CDM+baryons): (Eisenstein & Hu 1998)

$$\begin{split} T(k) &= \frac{\Omega_{b}}{\Omega_{m}} T_{b}(k) + \frac{\Omega_{c}}{\Omega_{m}} T_{c}(k) \\ f_{b}(k) &= \int \tilde{T}_{0}(k; 1, 1) \\ 1 + (ks/5.2)^{2} + \frac{\alpha_{b}}{1 + (\beta_{b}/ks)^{3}} e^{-(k/k_{SIIk})^{1.4}} \Big] j_{0}(k\tilde{s}) \\ \hline T_{c}(k) &= f\tilde{T}_{0}(k, 1, \beta_{c}) + (1-f)\tilde{T}_{0}(k, \alpha_{c}, \beta_{c}) \\ k_{eq} &= (2\Omega_{0} H_{0}^{2} z_{eq})^{1/2} = 7.46 \times 10^{-2}\Omega_{0} h^{2}\Theta_{2.7}^{-2} \text{ Mpc}^{-1} \\ k_{SIIK} &= 1.6(\Omega_{b} h^{2})^{0.52}(\Omega_{0} h^{2})^{0.73}[1 + (10.4\Omega_{0} h^{2})^{-0.95}] \\ z_{d} &= 1291 \frac{(\Omega_{0} h^{2})^{0.251}}{1 + 0.659(\Omega_{0} h^{2})^{0.238}} [1 + b_{1}(\Omega_{b} h^{2})^{b_{2}}] \\ b_{1} &= 0.313(\Omega_{0} h^{2})^{-0.419}[1 + 0.607(\Omega_{0} h^{2})^{0.674}], \\ b_{2} &= 0.238(\Omega_{0} h^{2})^{0.223}, \\ s &= \frac{2}{3k_{eq}} \sqrt{\frac{6}{R_{eq}}} \ln \frac{\sqrt{1 + R_{d}} + \sqrt{R_{d} + R_{eq}}}{1 + \sqrt{R_{eq}}} \\ s_{b} &= 2.07k_{eq} s(1 + R_{d})^{-3/4}G(\frac{1 + z_{eq}}{1 + z_{d}}) \\ \hline T_{c}(k) &= \frac{1}{4k_{eq}} \frac{R_{c}}{1 + k_{eq}} \\ c_{c} &= \frac{k}{13.41k_{eq}} \\ \hline T_{c}(k) &= \frac{1}{4k_{eq}} \frac{R_{c}}{1 + k_{eq}} \\ F_{c} &= \frac{1}{4k_{eq}} \frac{R_{c}}{3k_{eq}} - \frac{1}{8k_{eq}} \frac{R_{c}}{3k_{eq}} + \frac{386}{k_{eq}} \\ F_{c} &= \frac{1}{4k_{eq}} + \frac{386}{1 + 69.9q^{1.08}} \\ F_{c} &= \frac{1}{4k_{eq}} + \frac{1}{458\Omega_{0} h^{2})^{-0.708}} \\ F_{c} &= \frac{1}{4k_{eq}} + \frac{1}{458\Omega_{0} h^{2})^{-0.708}} \\ F_{c} &= \frac{1}{4k_{eq}} + \frac{1}{48k_{eq}} \\ F_{c} &= \frac{1}{4k_{eq}} + \frac{1}{4k_{eq}} + \frac{1}{k_{eq}} \\ F_{c} &= \frac{1}{4k_{eq}} + \frac{1}{k_{eq}} + \frac{1}{k_{eq}} + \frac{1}{k_{eq}} \\ F_{c} &= \frac{1}{k_{eq}} + \frac{1}{k_{eq}} + \frac{1}{k_{eq}} + \frac{1}{k_{eq}} \\ F_{c} &= \frac{1}{k_{eq}} + \frac{1}{k_{eq}} \\ F_{c} &= \frac{1}{k_{eq}} + \frac{1}{k_{eq}} + \frac{1}{k_{eq}} + \frac{1}{k_{eq}} \\ F_{c} &= \frac{1}{k_{eq}} + \frac{1}{k_{eq}} \\ F_{c} &= \frac{1}{k_{eq}} + \frac{1}{k_{eq}} + \frac{1}{k_{eq}} + \frac{1}{k_{eq}} \\ F_{c} &= \frac{1}{k_{eq}} + \frac{1}{k_{eq}} \\ F_{c} &= \frac{1}{k_{eq}} + \frac{1}{k_{eq}} \\ F_{c} &= \frac{1}{k_{eq}} \\ F_{c} &= \frac{1}{k_{eq}} + \frac{1}{k_{eq}} \\ F_{c} &= \frac{1}{k_{eq}} \\ F_{c} &= \frac{1}{k_{eq}} + \frac{1}{k_{eq}} \\ F_{c} &= \frac{1}{k_{eq}} + \frac{1}{k_{eq}} \\ F_{c} &$$

 $P(k,a) = D^{2}(a) T^{2}(k) P_{0}(k)$ 

post-decoupling (CDM+baryons): (Eisenstein & Hu 1998)



- I995: COSMICS package
- **I996:** CMBFAST
- **I999:** RECFAST

- **2003**: CMBEASY
- **2010:** CLASS

#### I995: COSMICS package (Bertschinger)

- first ever public release of Boltzmann solver
- bundled with package to generate initial conditions for simulations
- **I996:** CMBFAST
- **I999:** RECFAST

CAMB

- **2003**: CMBEASY
- **2010:** CLASS

I995: COSMICS package

#### I996: CMBFAST (Seljak & Zaldarriaga)

- adding functions to COSMICS for computing the sources
- convolution with Bessel functions
- much faster than COSMICS
- **I999:** RECFAST

CAMB

- **2003**: CMBEASY
- **2010:** CLASS

- 1995: COSMICS package
- **1996:** CMBFAST
- I999: RECFAST (Seager, Sasselov & Scott)
  - solves recombination of H and He simultaneously giving
  - ionised fractions as a function of redshift

- **2003**: CMBEASY
- **2010:** CLASS

- I995: COSMICS package
- **I996**: CMBFAST
- **I999:** RECFAST

**CAMB** (Lewis et al.)

- taking CMBFAST apart and re-writing it in f90
- improved expressions for sources, lensing, etc.
- **2003**: CMBEASY
- **2010:** CLASS

- I995: COSMICS package
- **I996:** CMBFAST
- **I999:** RECFAST

- 2003: **CMBEASY** (Doran)
  - re-write of CMBFAST in C++
- **2010:** CLASS

- I995: COSMICS package
- **I996:** CMBFAST
- **I999:** RECFAST

- **2003**: CMBEASY
- 2010: CLASS (Lesgourges et al. <u>http://www.class-code.net</u>)
  - highly modular code
  - easy to install and use
  - exactly following Bertschinger's notation to avoid confusion

- I995: COSMICS package
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- **2010:** CLASS

## CosmoRec (Chluba)

• highly improved C++ version of RECFAST

- I995: COSMICS package
- **1996:** CMBFAST
- **I999:** RECFAST

- **2003**: CMBEASY
- **2010: CLASS**

CosmoRec

## (still) maintained

- I995: COSMICS package
- **I996:** CMBFAST
- **I999:** RECFAST

- **2003**: CMBEASY
- 2010: CLASS hands-on training in "Advanced Cosmology" course

#### Computational Cosmology



- introduction
- Boltzmann solver
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#### Zeldovich approximation: (cf. LSS lecture)

 $\vec{x}(t) = \vec{q} + D(t)\vec{S}(\vec{q})$ 

 $\hat{\delta}_0(k) = \sqrt{P_0(k)T^2(k)}R_{\vec{k}}e^{i\varphi_{\vec{k}}}$ 

$$\begin{split} D(a) &= \frac{5}{2} \Omega_{m,0} H \int_{0}^{a} \frac{1}{\left(\Omega_{m,0} a^{-3} + (1 - \Omega_{m,0} - \Omega_{\Lambda,0}) a^{-2} + \Omega_{\Lambda,0}\right)} da \\ \vec{S} &= \nabla \Psi \\ \Delta \Psi &= \delta(\vec{x}_{0}) \end{split}$$

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 $\vec{x}(t) = \vec{q} + D(t)\vec{S}(\vec{q})$ 

$$\begin{split} D(a) &= \frac{5}{2} \Omega_{m,0} H \int_0^a \frac{1}{\left(\Omega_{m,0} a^{-3} + (1 - \Omega_{m,0} - \Omega_{\Lambda,0}) a^{-2} + \Omega_{\Lambda,0}\right)} da \\ \vec{S} &= \nabla \Psi \\ \Delta \Psi &= \delta(\vec{x}_0) \end{split}$$

$$\hat{\delta}_0(k) = \sqrt{P_0(k)T^2(k)} R_{\vec{k}} e^{i\varphi_{\vec{k}}}$$

we require the post-decoupling power spectrum of density perturbations (result of Boltzmann solver or use fitting formula...) + + + + ++ + + + + ++ +

 $\vec{x}(t) = \vec{q} + D(t)\vec{S}(\vec{q})$ 

$$\begin{split} D(a) &= \frac{5}{2} \Omega_{m,0} H \int_{0}^{a} \frac{1}{\left(\Omega_{m,0} a^{-3} + (1 - \Omega_{m,0} - \Omega_{\Lambda,0}) a^{-2} + \Omega_{\Lambda,0}\right)} da \\ \vec{S} &= \nabla \Psi \\ \Delta \Psi &= \delta(\vec{x}_{0}) \end{split}$$

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# $\vec{x}(t) = \vec{q} + D(t)\vec{S}(\vec{q})$

$$D(a) = \frac{5}{2} \Omega_{m,0} H \int_0^a \frac{1}{\left(\Omega_{m,0} a^{-3} + (1 - \Omega_{m,0} - \Omega_{\Lambda,0}) a^{-2} + \Omega_{\Lambda,0}\right)} da$$
$$\vec{S} = \nabla \Psi$$
$$\Delta \Psi = \delta(\vec{x}_0)$$







 $\vec{x}(t) = \vec{q} + D(t)\vec{S}(\vec{q})$ 

$$\begin{split} D(a) &= \frac{5}{2} \Omega_{m,0} H \int_{0}^{a} \frac{1}{\left(\Omega_{m,0} a^{-3} + (1 - \Omega_{m,0} - \Omega_{\Lambda,0}) a^{-2} + \Omega_{\Lambda,0}\right)} da \\ \vec{S} &= \nabla \Psi \\ \Delta \Psi &= \delta(\vec{x}_{0}) \\ \hat{\delta}_{0}(k) &= \sqrt{P_{0}(k) T^{2}(k R_{\vec{k}} e^{iq_{\vec{k}}})} \end{split}$$

R : Gaussian random number  $\varphi$  : random phase

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 $\vec{x}(t) = \vec{q} + D(t)\vec{S}(\vec{q})$ 

$$\begin{split} D(a) &= \frac{5}{2} \Omega_{m,0} H \int_{0}^{a} \frac{1}{\left(\Omega_{m,0} a^{-3} + (1 - \Omega_{m,0} - \Omega_{\Lambda,0}) a^{-2} + \Omega_{\Lambda,0}\right)} da \\ \vec{S} &= \nabla \Psi \\ \Delta \Psi &= \delta(\vec{x}_{0}) \\ \hat{\delta}_{0}(k) &= \sqrt{P_{0}(k) T^{2}(k R_{\vec{k}} e^{iq_{\vec{k}}})} \end{split}$$

R : Gaussian random number  $\varphi$  : random phase



# $\vec{x}(t) = \vec{q} + D(t)\vec{S}(\vec{q})$





Lagrangian perturbation theory

 $\vec{x}(t) = \vec{q} + D(a)\nabla \Psi - D^{(2)}\nabla \Psi^{(2)}$ 



Lagrangian perturbation theory

```
\vec{x}(t) = \vec{q} + D(a)\nabla \Psi - D^{(2)}\nabla \Psi^{(2)}
```


available codes

# <u>|990:</u>

- COSMICS: <u>http://web.mit.edu/edbert</u>
- GRAFIC-2: <u>http://web.mit.edu/edbert</u>
- PMstartM <u>http://astro.nmsu.edu/~aklypin/PM/pmcode</u>

# <u>2000:</u>

- N-genIC: <u>http://www.h-its.org/tap-software-e/ngenic-code</u>
- 2LPTic: <u>http://cosmo.nyu.edu/roman/2LPT</u>

# <u>2010:</u>

- CICsASS:
- Panphasia
- MUSIC:
- ginnungagap:
- http://faculty.washington.edu/mcquinn/Init\_Cond\_Code.html http://icc.dur.ac.uk/Panphasia.php https://www-n.oca.eu/ohahn/MUSIC https://github.com/ginnungagapgroup/ginnungagap

- introduction
- Boltzmann solver
- initial conditions generators
- simulation codes









(courtesy Arman Khalatyan)



1941



Erik Holmberg

#### THE ASTROPHYSICAL JOURNAL

AN INTERNATIONAL REVIEW OF SPECTROSCOPY AND ASTRONOMICAL PHYSICS

VOLUME 94

NOVEMBER 1941

NUMBER 3

#### ON THE CLUSTERING TENDENCIES AMONG THE NEBULAE

#### II. A STUDY OF ENCOUNTERS BETWEEN LABORATORY MODELS OF STELLAR SYSTEMS BY A NEW INTEGRATION PROCEDURE

ERIK HOLMBERG

#### ABSTRACT

In a previous paper the writer discussed the possibility of explaining the observed clustering effects among extragalactic nebulae as a result of captures. The present investigation deals with the important problem of whether the loss of energy resulting from the tidal disturbances at a close encounter between two nebulae is large enough to effect a capture. The tidal deformations of two models of stellar systems, passing each other at a small distance, are studied by reconstructing, piece by piece, the orbits described by the individual mass elements. The difficulty of integrating the total gravitational force acting upon a certain element at a certain point of time is solved by replacing gravitation by light. The mass elements are represented by light-bulbs, the candle power being proportional to mass, and the total light is measured by a photocell (Fig. 1). The nebulae are assumed to have a flattened shape, and each is represented by 37 light-bulbs. It is found that the tidal deformations cause an increase in the attraction between the two objects, the increase reaching its maximum value when the nebulae are separating, i.e., after the passage. The resulting loss of energy (Fig. 6) is comparatively large and may, in favorable cases, effect a capture. The spiral arms developing during the encounter (Figs. 4) represent an interesting by-product of the investigation. The direction of the arms depends on the direction of rotation of the nebulae with respect to the direction of their space motions.

#### I. THE EXPERIMENTAL ARRANGEMENTS

The present paper is a study of the tidal disturbances appearing in stellar systems which pass one another at small distances. These tidal disturbances are of some importance since they are accompanied by a loss of energy which may result in a capture between the two objects. In a previous paper' the writer discussed the clustering tendencies among extragalactic nebulae. A theory was put forth that the observed clustering effects are the result of captures between individual nebulae. The capture theory seems to be able to account not only for double and multiple nebulae but also for the large extragalactic clusters. The present investigation tries to give an answer to the important question of whether the loss of energy accompanying a close encounter between two nebulae is large enough to effect a capture.

A study of tidal disturbances is greatly facilitated if it can be restricted to only two dimensions, i.e., to nebulae of a flattened shape, the principal planes of which coincide with the plane of their hyperbolic orbits. In order to reconstruct the orbit described by

<sup>1</sup> Mt. W. Contr., No. 633; Ap. J., 92, 200, 1940.





Erik Holmberg

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ABSTRACT





1941



Erik Holmberg

• replacing gravity by light (same 1/r<sup>2</sup> law)

• formation of tidal features



• gravity of N bodies

$$m_i \ddot{\vec{r}}_i = \vec{F}(\vec{r}_i) \quad \forall i \in N$$

• the "brute force approach" scales like  $N^2$ :

$$\vec{F}(\vec{r}_i) = -\sum_{i \neq j} \frac{Gm_i m_j}{(r_i - r_j)^3} (\vec{r}_i - \vec{r}_j)$$

the summation over (N-1) particles has to be done for all N particles:  $\Rightarrow$  number of floating point operations  $\propto N(N-1) \propto N^2$  • gravity of N bodies

$$m_i \ddot{\vec{r}}_i = \vec{F}(\vec{r}_i) \quad \forall i \in N$$

the "brute force approach" scales like N<sup>2</sup>:
even nowadays not a feasible approach!
even nowadays not a feasible approach.
→ sophisticated techniques are required...

the summation over (N-1) particles has to be done for all N particles:

 $\Rightarrow$  number of floating point operations  $\propto N(N-1) \propto N^2$ 

year	who	what
1941	Erik Holmberg	light bulbs
1963	Svere Aarseth	NBODY
1981	George Efstathiou	P <sup>3</sup> M
1983	Anatoly Klypin	PM
1986	Barnes & Hut	tree
1991	Hugh Couchman	AP <sup>3</sup> M
1995	Suisalu & Saar	AMR (Adaptive Mesh Refinement)
1997	Kravtsov	ART
2000++	Springel	GADGET
	Springel	Arepo
	Hopkins	GIZMO





**still the one-and-only reference!** 

• generating initial conditions



I. primordial matter density field





I. primordial matter density field

2. today's matter density field



#### cubical universe?



### cubical universe: infinity via periodic boundaries!



## cubical universe: infinity via periodic boundaries!



## cubical universe: infinity via periodic boundaries!



I. primordial matter density field

2. today's matter density field

• analysing the outputs





3. halo/galaxy catalogue

# • analysing the outputs: comparison



# • analysing the outputs: comparison



• analysing the outputs: comparison and feedback!?



• simulation of cosmic structure formation



### Computational Cosmology



• Millennium simulation (2005)



• Millennium-II simulation (2010)



 $N = 2160^3$ B = 100 Mpc/h • Bolshoi simulation



• MultiDark simulation



 $N = 3840^3$ B = 1000 Mpc/h • MultiDark simulation



 $N = 3840^3$ B = 1000 Mpc/h • EAGLE full physics simulation



 $N = 2000^{3}$ B = 75 Mpc/h
• EAGLE full physics vs. MultiDark dark-matter only simulation



• EAGLE full physics vs. MultiDark dark-matter only simulation



• EAGLE full physics vs. MultiDark dark-matter only simulation



Full N-body



Full N-body

2LPT



Full N-body

2LPT





z = 0.5

- introduction
- Boltzmann solver
- initial conditions generators
- simulation codes
  - the N-body principle
  - the equations-of-motion
  - the forces

(i.e. the evolution is driven by the mean field rather than 2-body interactions)

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mean free path of dark matter particles

(i.e. the evolution is driven by the mean field rather than 2-body interactions)

mean free path of dark matter particles



(i.e. the evolution is driven by the mean field rather than 2-body interactions)

mean free path of dark matter particles



# how to describe a collisionless system?

phase-space distribution function

$$f(\vec{r},\vec{v},t) d^3r d^3v$$

probability<sup>\*</sup> of finding a dark matter particle in the interval:

$$[\vec{r} - \frac{d\vec{r}}{2}, \ \vec{r} + \frac{\vec{d}r}{2}]$$
$$[\vec{v} - \frac{d\vec{v}}{2}, \ \vec{v} + \frac{d\vec{v}}{2}]$$

e.g., particle with velocity  $v_1$  and coordinate  $r_1$ :  $f(\vec{r}, \vec{v}) = \delta(\vec{r} - \vec{r_1})\delta(\vec{v} - \vec{v_1})$ 

continuity, self-gravity and no collisions =>

 $\int f(\vec{r}, \vec{v}, t) d^3r d^3v = 1$ 

collisionless Boltzmann equation (CBE)

$$\frac{\partial f}{\partial t} + \sum_{i=1}^{3} \left( v_i \frac{\partial f}{\partial r_i} - \frac{\partial \Phi}{\partial r_i} \frac{\partial f}{\partial v_i} \right) = 0$$

coupled with Poisson's equation

$$\Delta \Phi(\vec{r}) = 4\pi G \rho(\vec{r})$$

collisionless Boltzmann equation (CBE)

$$\frac{\partial f}{\partial t} + \sum_{i=1}^{3} \left( v_i \frac{\partial f}{\partial r_i} - \frac{\partial \Phi}{\partial r_i} \frac{\partial f}{\partial v_i} \right) = 0 \implies \text{difficult to solve numerically!}$$

coupled with Poisson's equation

$$\Delta \Phi(\vec{r}) = 4\pi G \rho(\vec{r}) \implies$$
 we'll deal with it later...

collisionless Boltzmann equation (CBE)

$$\frac{\partial f}{\partial t} + \sum_{i=1}^{3} \left( v_i \frac{\partial f}{\partial r_i} - \frac{\partial \Phi}{\partial r_i} \frac{\partial f}{\partial v_i} \right) = 0$$
  
• "method of characteristics":  

$$\frac{\partial f}{\partial t} + \{f, H\} = 0 \qquad H = \frac{1}{2}v^2 + \Phi(\vec{r})$$

$$\downarrow$$

$$\frac{df(\vec{r}, \vec{v})}{dt} = 0$$

"method of characteristics":

$$\frac{\partial f}{\partial t} + \{f, H\} = 0 \qquad H = \frac{1}{2}v^2 + \Phi(\vec{r})$$

$$\downarrow$$

$$\frac{df(\vec{r}, \vec{v})}{dt} = 0$$

$$\downarrow$$

f is constant along the possible trajectories  $[\vec{r}(t), \vec{v}(t)]$ 

$$f(\vec{r}, \vec{v}, t) = f(\vec{r}_0, \vec{v}_0, 0) \quad \forall \vec{r}, \vec{v} \text{ satisfying} \begin{cases} \vec{r}, H \\ = \frac{\partial H}{\partial \vec{v}} \\ \{ \vec{v}, H \} = -\frac{\partial H}{\partial \vec{r}} \end{cases}$$

"method of characteristics":

$$\frac{\partial f}{\partial t} + \{f, H\} = 0 \qquad H = \frac{1}{2}v^2 + \Phi(\vec{r})$$
solution to CBE
$$\{\vec{r}, H\} = \frac{\partial H}{2\vec{r}}$$

$$f(\vec{r}, \vec{v}, t) = f(\vec{r}_0, \vec{v}_0, 0) \quad \forall [\vec{r}, \vec{v}] \text{ satisfying} \begin{cases} \{\vec{r}, H\} = \frac{\partial H}{\partial \vec{v}} \\ \{\vec{v}, H\} = -\frac{\partial H}{\partial \vec{r}} \end{cases}$$

the problems "reduces" to finding [r(t), v(t)] for a given initial value problem  $f(r_0, v_0)$ 

initial value problem



- I. sample  $f(r_i(t_0), v_i(t_0))$  with i=1, ..., N points  $[r_i(t_0), v_i(t_0)]$
- 2. those  $[r_i(t), v_i(t)]$  obeying the equations-of-motion sample  $f(r_i(t), v_i(t))$

consistency check...

- collisionless system of N-bodies
  - equations-of-motion

$$\begin{aligned} \frac{d\vec{r}}{dt} &= \vec{v} \\ \frac{d\vec{v}}{dt} &= -\nabla \Phi = \vec{F}(\vec{r},t) \end{aligned}$$

## Computational Cosmology

- collisionless system of N-bodies
  - equations-of-motion

$$\frac{d\vec{r}}{dt} = \vec{v}$$
$$\frac{d\vec{v}}{dt} = -\nabla\Phi = \vec{F}(\vec{r},t)$$

one "simulation particle" represents **billions** of dark matter particles:  $m_{\rm simu} \sim 10^7 M_{\odot}$  vs  $m_{\rm DM} << 10^{-60} M_{\odot}$ 



## Computational Cosmology

- collisionless system of N-bodies
  - equations-of-motion

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one "simulation particle" represents **billions** of dark matter particles:  $m_{\rm simu} \sim 10^7 M_{\odot}$  vs  $m_{\rm DM} << 10^{-60} M_{\odot}$  N bodies are used to sample

the evolution of the Universe

(non-baryonic) dark matter candidates

axion:	10 <sup>-5</sup> eV
neutrino:	10eV
WIMP:	1-10 <sup>3</sup> GeV
monopoles:	10 <sup>16</sup> GeV
Planck relics:10 <sup>19</sup> GeV	
???	

 $0.5 MeV \approx 9 \cdot 10^{-28} g$ 

## Computational Cosmology

- collisionless system of N-bodies
  - equations-of-motion

$$\frac{d\vec{r}}{dt} = \vec{v}$$
$$\frac{d\vec{v}}{dt} = -\nabla\Phi = \vec{F}(\vec{r},t)$$

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- collisionless system of N-bodies
  - equations-of-motion

$$\frac{d\vec{r}}{dt} = \vec{v}$$
$$\frac{d\vec{v}}{dt} = -\nabla\Phi = \vec{F}(\vec{r},t)$$
?

- collisionless system of N-bodies
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$$\begin{aligned} \frac{d\vec{r}}{dt} &= \vec{v} \\ \frac{d\vec{v}}{dt} &= -\nabla \Phi = \vec{F}(\vec{r},t) \end{aligned}$$

• the forces (details follow later...)

• "particle" approach: 
$$\vec{F}(\vec{r}_i) = -\sum_{i \neq j} \frac{Gm_j}{(r_i - r_j)^3} (\vec{r}_i - \vec{r}_j)$$

• "grid" approach: 
$$\Delta \Phi(\vec{g}_{i,j,k}) = 4\pi G \Big( \rho(\vec{g}_{i,j,k}) - \overline{\rho} \Big)$$
$$\vec{F}(\vec{g}_{i,j,k}) = -\nabla \Phi(\vec{g}_{i,j,k})$$

- **collisionless** system of *N*-bodies
  - equations-of-motion

$$\begin{aligned} \frac{d\vec{r}}{dt} &= \vec{v} \\ \frac{d\vec{v}}{dt} &= -\nabla \Phi = \vec{F}(\vec{r},t) \end{aligned}$$

• the forces (details follow later...)

• "particle" approach: 
$$\vec{F}(\vec{r}_i) = -\sum_{i \neq j} \frac{Gm_j}{(r_i - r_j)^3} (\vec{r}_i - \vec{r}_j)$$
 manually soften force

• "grid" approach: 
$$\Delta \Phi(\vec{g}_{i,j,k}) = 4\pi G \Big( \rho(\vec{g}_{i,j,k}) - \overline{\rho} \Big)$$

$$\vec{F}(\vec{g}_{i,j,k}) = -\nabla \Phi(\vec{g}_{i,j,k})$$
automatically softened  
on grid-scale

- collisionless system of N-bodies
  - equations-of-motion

$$\begin{aligned} \frac{d\vec{r}}{dt} &= \vec{v} \\ \frac{d\vec{v}}{dt} &= -\nabla \Phi = \vec{F}(\vec{r},t) \end{aligned}$$

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- Boltzmann solver
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  - the *N*-body principle
  - the equations-of-motion
  - the forces

all length scales scale like a(t)

 $\vec{r}(t) = a(t)\vec{x}(t)$ 



all length scales scale like a(t)

$$\vec{r}(t) = a(t)\vec{x}(t)$$



 $\rightarrow$  we are only interested in the peculiar motion...







( $\psi$ : peculiar potential!)



#### how to obtain the forces/potential?
- introduction
- Boltzmann solver
- initial conditions generators
- simulation codes
  - the *N*-body principle
  - the equations-of-motion
  - the forces

the forces – in comoving coordinates



$$\Delta \psi(\vec{g}_{k,l,m}) = 4\pi G \rho(\vec{g}_{k,l,m})$$
$$\vec{F}(\vec{g}_{k,l,m}) = -\nabla \psi(\vec{g}_{k,l,m})$$

the forces – in comoving coordinates



$$\Delta \psi(\vec{g}_{k,l,m}) = 4\pi G \rho(\vec{g}_{k,l,m})$$
$$\vec{F}(\vec{g}_{k,l,m}) = -\nabla \psi(\vec{g}_{k,l,m})$$

$$\vec{F}_i(\vec{x}_i) = -\sum_{i \neq j} \frac{Gm_j}{(x_i - x_j)^3} (\vec{x}_i - \vec{x}_j) \quad \forall i \in N$$

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• overcoming the  $N^2$  bottleneck by using a "tree"



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- other subtleties:
  - need to avoid singularity for  $x_i = x_j$  => force softening
  - period boundary conditions => Ewald summation

$$\vec{F}_i(\vec{x}_i) = -\sum_{i \neq j} \frac{Gm_j}{(x_i - x_j)^3} (\vec{x}_i - \vec{x}_j) \quad \forall i \in N$$

- open-source code:
  - GADGET2



the forces – in comoving coordinates



$$\Delta \psi(\vec{g}_{k,l,m}) = 4\pi G \rho(\vec{g}_{k,l,m})$$
$$\vec{F}(\vec{g}_{k,l,m}) = -\nabla \psi(\vec{g}_{k,l,m})$$

$$\Delta \psi(\vec{g}_{k,l,m}) = \frac{4\pi G}{a} \left( \rho(\vec{g}_{k,l,m}) - \overline{\rho} \right)$$

$$\vec{F}(\vec{g}_{k,l,m}) = -\nabla \psi(\vec{g}_{k,l,m})$$



calculate mass density on grid
 solve Poisson's equation on grid
 differentiate potential to get forces
 interpolate forces back to particles

 $\vec{x}_{i} \rightarrow \rho(\vec{g}_{k,l,m})$   $\Phi(\vec{g}_{k,l,m})$   $\vec{F}(\vec{g}_{k,l,m})$   $\vec{F}(\vec{g}_{k,l,m}) \rightarrow \vec{F}(\vec{x}_{i})$ 

$$\Delta\psi(\vec{g}_{k,l,m}) = \frac{4\pi G}{a} \Big(\rho(\vec{g}_{k,l,m}) - \overline{\rho}\Big)$$

$$\vec{F}(\vec{g}_{k,l,m}) = -\nabla \psi(\vec{g}_{k,l,m})$$



calculate mass density on grid
 solve Poisson's equation on grid
 differentiate potential to get forces
 interpolate forces back to particles

 $\vec{x}_i \rightarrow \rho(\vec{g}_{k,l,m})$   $\Phi(\vec{g}_{k,l,m})$ 

$$\vec{F}(\vec{g}_{k,l,m})$$

 $\vec{F}(\vec{g}_{k,l,m}) \rightarrow \vec{F}(\vec{x}_i)$ 

sounds like a waste of time and computer resources, but **exceptionally fast** in practice

$$\Delta\psi(\vec{g}_{k,l,m}) = \frac{4\pi G}{a} \left(\rho(\vec{g}_{k,l,m}) - \overline{\rho}\right)$$

$$\vec{F}(\vec{g}_{k,l,m}) = -\nabla \psi(\vec{g}_{k,l,m})$$



I. calculate mass density on grid	$\vec{x}_i \rightarrow \rho(\vec{g}_{k,l,m})$	
2. solve Poisson's equation on grid	$\Phi(ec{g}_{k,l,m})$	?
3. differentiate potential to get forces	$\vec{F}(\vec{g}_{k,l,m})$	
4. interpolate forces back to particles	$\vec{F}(\vec{g}_{k,l,m}) \rightarrow$	$\vec{F}(\vec{x}_i)$

sounds like a waste of time and computer resources,

but **exceptionally fast** in practice

$$\Delta \psi(\vec{g}_{k,l,m}) = \frac{4\pi G}{a} \left( \rho(\vec{g}_{k,l,m}) - \overline{\rho} \right)$$

• numerically solve Poisson's equation via Fourier Transforms

$$\Delta \psi = S \longrightarrow$$
 equation we wish to solve

$$\Delta \psi(\vec{g}_{k,l,m}) = \frac{4\pi G}{a} \left( \rho(\vec{g}_{k,l,m}) - \overline{\rho} \right)$$

- numerically solve Poisson's equation via Fourier Transforms
  - $\Delta \psi = S \qquad \rightarrow \text{ equation we wish to solve}$  $\Delta \mathcal{G} = \delta \qquad \rightarrow \text{ equation way easier to solve...}$  $(\delta = \text{Dirac's delta-function})$

$$\Delta \psi(\vec{g}_{k,l,m}) = \frac{4\pi G}{a} \left( \rho(\vec{g}_{k,l,m}) - \overline{\rho} \right)$$

• numerically solve Poisson's equation via Fourier Transforms

$$\Delta \psi = S \qquad \rightarrow \text{ equation we wish to solve}$$
  
$$\Delta \mathcal{G} = \delta \qquad \rightarrow \text{ equation way easier to solve...}$$
  
$$(\delta = \text{Dirac's delta-function})$$

• Green's function of Poisson's equation:

$$\hat{G}(\vec{k}) = -\frac{1}{k^2} \longrightarrow$$
 Fourier Space  
 $G(\vec{x}) = \frac{1}{4\pi x} \longrightarrow$  Real Space

$$\Delta \psi(\vec{g}_{k,l,m}) = \frac{4\pi G}{a} \left( \rho(\vec{g}_{k,l,m}) - \overline{\rho} \right)$$

• numerically solve Poisson's equation via Fourier Transforms

$$\Delta \psi = S$$

$$\psi(\vec{x}) = \iiint \hat{G}(\vec{x} - \vec{x}') \ S(\vec{x}') d^3 x' \rightarrow \text{Real Space}$$
$$\hat{\psi}(\vec{k}) = \hat{G}(\vec{k}) \hat{S}(\vec{k}) \qquad \rightarrow \text{Fourier Space}$$

$$\Delta \psi(\vec{g}_{k,l,m}) = \frac{4\pi G}{a} \left( \rho(\vec{g}_{k,l,m}) - \overline{\rho} \right)$$

• numerically solve Poisson's equation via Fourier Transforms



$$\Delta \psi(\vec{g}_{k,l,m}) = \frac{4\pi G}{a} \left( \rho(\vec{g}_{k,l,m}) - \overline{\rho} \right)$$

- open-source code:
  - AMIGA

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<u>AMIGA</u> >																			

- hybrid approach
  - treePM
    - long-range force = PM method
    - short-range force = tree method
  - P<sup>3</sup>M
    - long-range force = PM method
      short-range force = PP method (direct summation)
  - AMR

- PM method, but recursively refining cells

## hybrid approach

density field of simulated galaxy cluster



• AMR

adaptive grid hierarchy

- PM method, but recursively refining cells

hybrid approach

 Image: Approach
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## not limited to astrophysics

- AMR
  - PM method, but recursively refining cells

- full set of equations
  - **<u>collisionless matter</u>** (e.g. dark matter)

$$\frac{d\vec{x}_{DM}}{dt} = \vec{v}_{DM}$$
$$\frac{d\vec{v}_{DM}}{dt} = -\nabla\phi$$

 $\Delta \phi = 4\pi G \rho_{tot}$ 

- full set of equations
  - **<u>collisionless matter</u>** (e.g. dark matter)

$$\frac{d\vec{x}_{DM}}{dt} = \vec{v}_{DM}$$
$$\frac{d\vec{v}_{DM}}{dt} = -\nabla\phi$$

• **collisional matter** (e.g. gas)

$$\Delta \phi = 4\pi G \rho_{tot}$$

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

$$\frac{\partial \vec{B}}{\partial t} = -\nabla \times \left( \vec{v} \times \vec{B} \right)$$

$$\begin{aligned} \frac{\partial(\rho\vec{v})}{\partial t} &+ \nabla \cdot \left(\rho\vec{v}\otimes\vec{v} + \left(p + \frac{1}{2\mu}B^2\right)\vec{1} - \frac{1}{\mu}\vec{B}\otimes\vec{B}\right) &= \rho \ \left(-\nabla\phi\right) \\ \frac{\partial(\rho E)}{\partial t} &+ \nabla \cdot \left(\left[\rho E + p + \frac{1}{2\mu}B^2\right]\vec{v} - \frac{1}{\mu}\left[\vec{v}\cdot\vec{B}\right]\vec{B}\right) &= \rho\vec{v}\cdot\left(-\nabla\phi\right) + (\Gamma - L) \\ p &= (\gamma - 1)\rho\varepsilon \\ \rho\varepsilon &= \rho E - \frac{1}{2}\rho v^2 \end{aligned}$$

~

- full set of equations
  - **<u>collisionless matter</u>** (e.g. dark matter)

$$\frac{d\vec{x}_{DM}}{dt} = \vec{v}_{DM}$$

$$\frac{d\vec{v}_{DM}}{dt} = -\nabla\phi$$
dominated by long-range interactions!

• **<u>collisional matter</u>** (e.g. gas)

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

$$\Delta \phi = 4\pi G \rho_{tot}$$

$$\frac{\partial \vec{B}}{\partial t} = - \nabla \times \left( \vec{v} \times \vec{B} \right)$$

$$\begin{aligned} \frac{\partial(\rho\vec{v})}{\partial t} &+ \nabla \cdot \left(\rho\vec{v}\otimes\vec{v} + \left(p + \frac{1}{2\mu}B^2\right)\vec{1} - \frac{1}{\mu}\vec{B}\otimes\vec{B}\right) &= \rho \ \left(-\nabla\phi\right) \\ \frac{\partial(\rho E)}{\partial t} &+ \nabla \cdot \left(\left[\rho E + p + \frac{1}{2\mu}B^2\right]\vec{v} - \frac{1}{\mu}\left[\vec{v}\cdot\vec{B}\right]\vec{B}\right) &= \rho\vec{v} \cdot \left(-\nabla\phi\right) + \left(\Gamma - L\right) \\ p &= (\gamma - 1)\rho\varepsilon \\ \rho\varepsilon &= \rho E - \frac{1}{2}\rho v^2 \end{aligned}$$

- full set of equations
  - **<u>collisionless matter</u>** (e.g. dark matter)

$$\frac{d\vec{x}_{DM}}{dt} = \vec{v}_{DM}$$
$$\frac{d\vec{v}_{DM}}{dt} = -\nabla\phi$$

$$\Delta \phi = 4\pi G \rho_{tot}$$

• <u>collisional matter</u> (e.g. gas) dominated by short-range/local interactions!

$$\begin{aligned} \frac{\partial \rho}{\partial t} &+ \nabla \cdot (\rho \vec{v}) \\ \frac{\partial (\rho \vec{v})}{\partial t} &+ \nabla \cdot \left( \rho \vec{v} \otimes \vec{v} + \left( p + \frac{1}{2\mu} B^2 \right) \vec{1} - \frac{1}{\mu} \vec{B} \otimes \vec{B} \right) \\ + \nabla \cdot \left( \rho \vec{E} + p + \frac{1}{2\mu} B^2 \right) \vec{v} - \frac{1}{\mu} \left[ \vec{v} \cdot \vec{B} \right] \vec{B} \right) &= \rho \vec{v} \cdot (-\nabla \phi) + (\Gamma - L) \\ p &= (\gamma - 1) \rho \varepsilon \\ \rho \varepsilon &= \rho E - \frac{1}{2} \rho v^2 \end{aligned}$$

• simulation of cosmic structure formation



• simulation of cosmic structure formation



formation of large-scale structure (Local Universe!)



## formation of Local Group – incl. gas (CDM vs.WDM)



formation of MW-type object – incl. gas (CDM)





https://www.cosmosim.org/#







- run a low resolution simulation
- identify an interesting object
- trace back particles of that object to Lagrangian positions in IC's
- re-sample waves in that area with more particles
- re-run the whole simulation

## Iow resolution simulation


## Iow resolution simulation



## Iow resolution simulation



## zoom initial conditions



### zoom simulation

# Visualisation of N-body Simulations

#### Software:PVIEW http://astronomy.swin.edu.au/PVIEW/

Stuart Gill, Paul Bourke Simulation data by Dr Alexander Knebe

> Astrophysics and Supercomputing Swinburne University